

# Statistical Inference Course Project Part 1 : Central Limit Theorem using Simulation

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## Overview

In this project, I will investigate the exponential distribution in R and compare it with the Central Limit Theorem. The exponential distribution is used and simulated in R with `rexp(n, lambda)` where `lambda` is the rate parameter. I will investigate the distribution of 40 exponentials and set `lambda = 0.2`. The simulated mean and standard deviation will be compared against the theoretical values to illustrate the Central Limit Theorem.

## Simulations

Generate the simulated data from exponential distribution with `lambda = 0.2` and number of exponentials = 40. A thousand simulations is produced, and hence total of 40,000 simulated data is required.

```
# Initialise the seed to ensure reproducibility
set.seed(8)

# Parameters for the simulation
n <- 40
lambda <- 0.2
numSimulations <- 1000

# Generate the simulated data and compare the sample mean and variance
simulatedData <- matrix(rexp(n * numSimulations, lambda), numSimulations, n)
simulatedDataMean <- apply(simulatedData, 1, mean)
simulatedDataVar <- apply(simulatedData, 1, var)
```

## Sample Mean versus Theoretical Mean

Calculate the average sample mean and compare it against the theoretical mean of exponential distribution, which is equal to  $1/\lambda$ .

```
sampleMean <- mean(simulatedDataMean)
theoreticalMean <- 1 / lambda

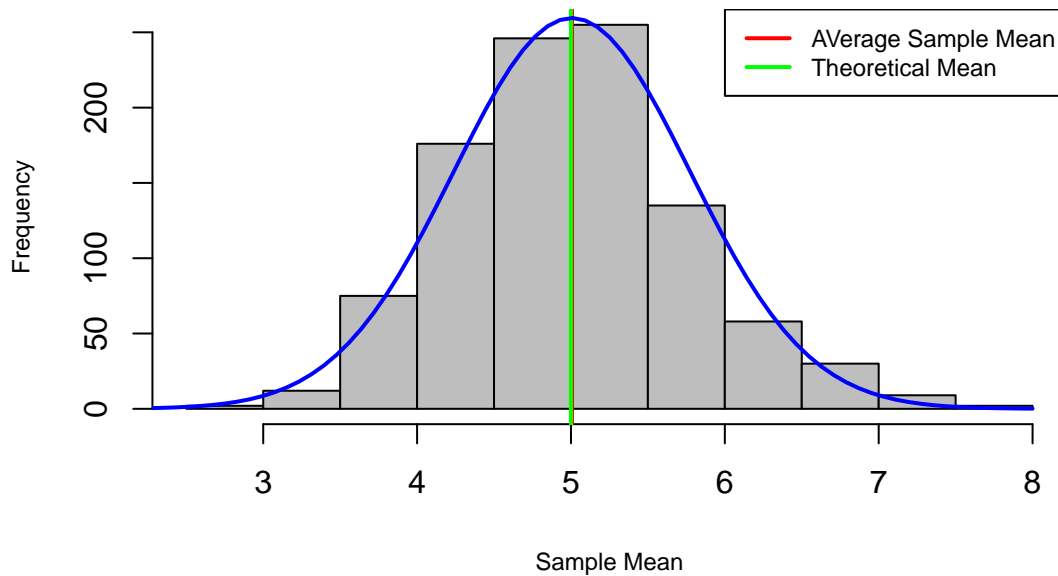
# Print the results
cbind(sampleMean, theoreticalMean)
```

```
##      sampleMean theoreticalMean
## [1,]    5.006442              5
```

The sample mean is **5.0064** while the theoretical mean is **5**.

Following is a plot of the distribution of the sample mean distribution. This shows that the sample mean is a very good estimate of the theoretical mean. The corresponding normal distribution is plotted in blue as a reference and the sample mean does appear to be close to normal.

## Distribution of the Sample Mean of the Simulated Data



## Sample Variance versus Theoretical Variance

Calculate the average sample variance and compare it against the theoretical variance of exponential distribution, which is equal to  $(1/\lambda)^2$ .

```
sampleVar <- mean(simulatedDataVar)
theoreticalVar <- (1 / lambda)^2

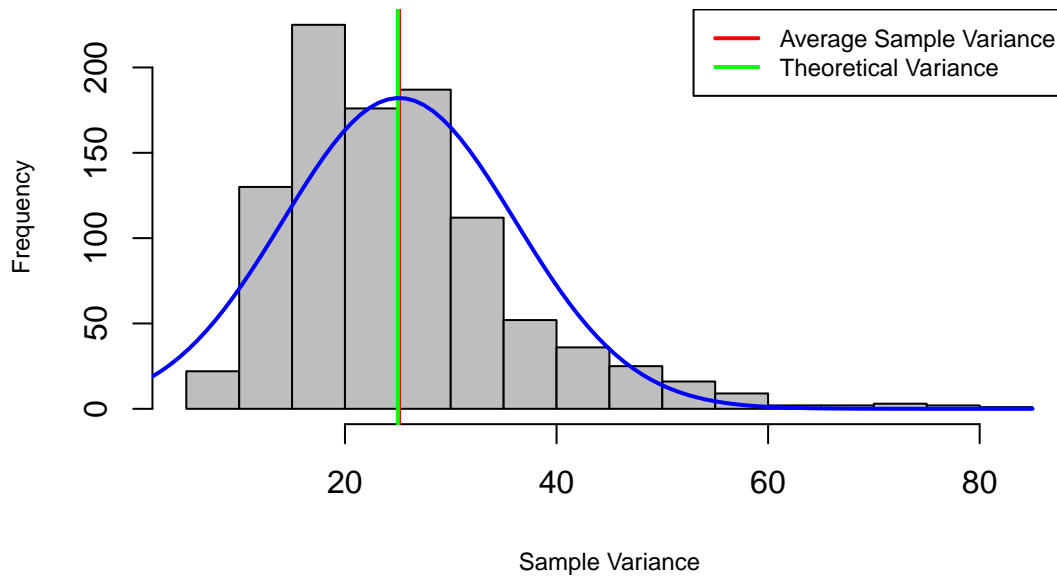
# Print the results
cbind(sampleVar, theoreticalVar)
```

```
##      sampleVar theoreticalVar
## [1,] 25.10708           25
```

The sample variance is **25.1071** while the theoretical variance is **25**.

Following is a plot of the distribution of the sample variance. This again shows that the sample variance is a very good estimate of the theoretical variance. The corresponding normal distribution of the sample variance is plotted in blue and the sample variance does appear to be close to normal.

## Distribution of the Sample Variance of the Simulated Data



## Distribution

Below is a plot of the exponential distribution with number of exponentials = 40 and lambda = 0.2. It can be seen that although the distribution is very different to a normal distribution, the distribution of the sample mean and sample variance are close to normal as shown earlier.

## Exponential Distribution with $n = 40$ and $\lambda = 0.2$

