

**Title:** Statistical Inference Project – Assignment I

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**Goal:** To investigate the exponential distribution in R and compare it with the Central Limit Theorem.

### Preliminary Setup

Simulate 1000 trials of 40 samples of the exponential distribution with rate ( $\lambda$ ) 0.2. We generate 40,000 exponentials using `rexp()`, create a 1000 by 40 matrix out of it. Since we investigate averages of exponentials, we calculate average of each row of the matrix, and store the results in a vector.

```
# Setting lambda as rate parameter, set variables for 1000 simulations and 40 exponentials to investigate
lambda <- 0.2           #rate parameter
num_sim <- 1000          #number of simulations
exp_invest <- 40         #exponentials
set.seed(100)

# Generate 40,000 exponentials and transfer to a Data frame
sim_exp <- data.frame( x = rexp(num_sim * exp_invest, lambda))

# Create a 1000 by 40 matrix of exponentials
sim_mat <- matrix(sim_exp$x, num_sim)

# Create a vector to store Average of rows of sim_mat / vector has distribution of averages of 40 exponentials
avg_sim_mat_byrow <- rowMeans(sim_mat[, 1:exp_invest])
```

**Question 1:** Show the sample mean and compare it to the theoretical mean of the distribution.

```
# Calculate Sample mean and Theoretical mean
samp_mean <- mean(avg_sim_mat_byrow)           # Sample mean
theor_mean <- 1/lambda                         # Theoretical mean

# Compare Sample mean and Theoretical mean
samp_mean

[1] 4.97509
```

```
theor_mean
```

```
[1] 5
```

```
# Compare Sample mean and Theoretical mean via Histogram plot
```

```
hist(avg_sim_mat_byrow, freq=TRUE, breaks=30,
```

```
main="Sample Mean vs Theoretical Mean",
```

```
xlab="Averages of Exponentials",
```

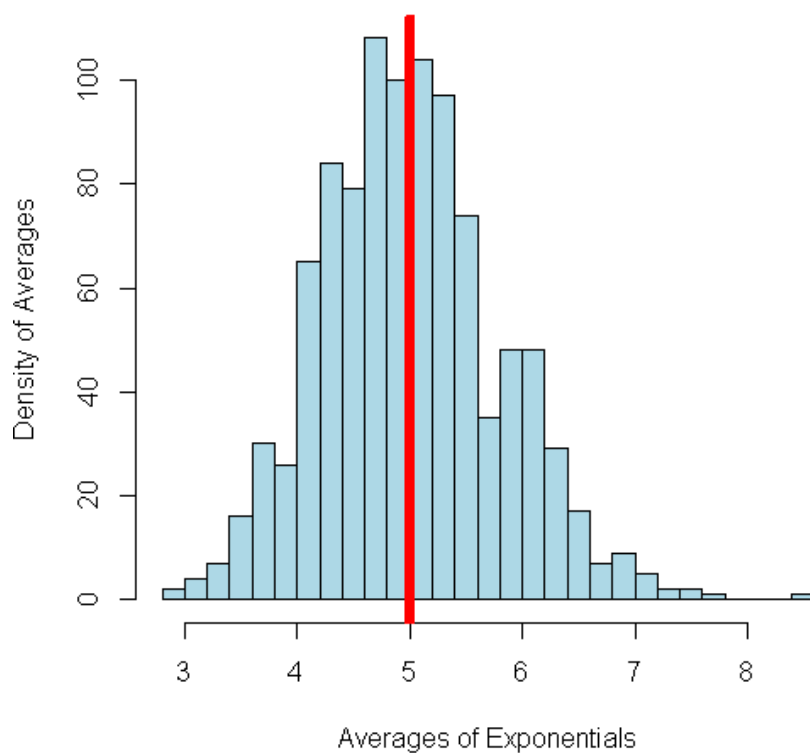
```
ylab="Density of Averages",
```

```
col='light blue')
```

```
abline(v=1/lambda,col='red',lwd=6)           # Theoretical mean in Red
```

```
abline(v=samp_mean,col='green',lwd=6)         # Theoretical mean in Green
```

### Sample Mean vs Theoretical Mean



**Conclusion:** The Sample mean is very close to the Theoretical mean.

Question 2: Show how variable the sample is (via variance) and compare it to the theoretical variance of the distribution.

```
# Calculate Sample variance and Theoretical variance
```

```
samp_var <- var(avg_sim_mat_byrow)
```

```
theor_var <- (1/lambda)^2/exp_invest
```

```
samp_var
```

```
[1] 0.6335302
```

```
theor_var
```

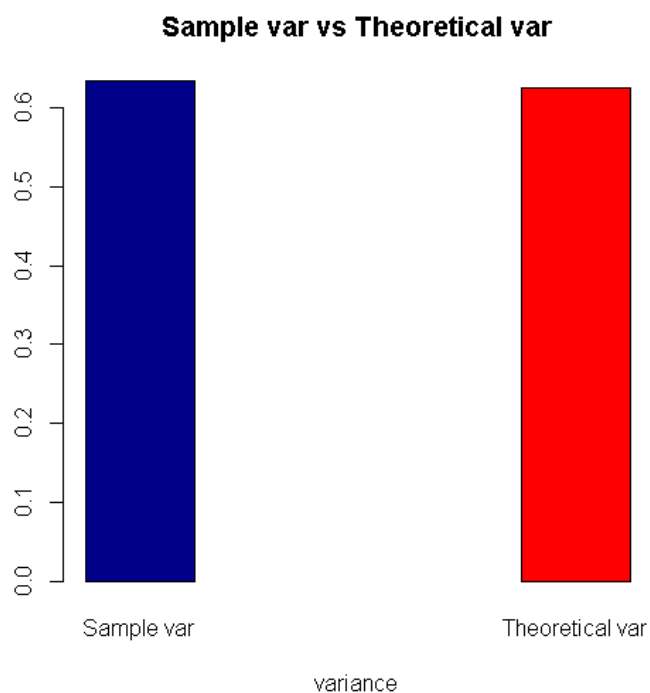
```
[1] 0.625
```

```
# Compare Sample variance and Theoretical variance via bar chart
```

```
var_diff <- c(samp_var, theor_var)
```

```
barplot(var_diff, main="Sample var vs Theoretical var",
```

```
        xlab="variance", names.arg=c("Sample var", "Theoretical var"), col=c("darkblue", "red"), space = 3)
```



**Conclusion:** The Sample variance is very close to the Theoretical variance.

Question 3: Show that the distribution is approximately normal.

The distribution is plotted to visually compare against a Normal distribution.

The *central limit theorem* states that the distribution of the standard score  $Z_n$  converges to the standard normal distribution as  $n \rightarrow \infty$ .

And it gets clearer from the chart below.

Bars – represent distribution of sample values

Blue lines belong to sample; Red lines belong to Theoretical normal.

```
# Visually compare the actual distribution with Normal distribution
```

```
hist(avg_sim_mat_byrow, prob=T,breaks=40,  
     main="Actual distribution vs Normal distribution",  
     xlab="Averages of exponentials",  
     ylab="Density of Averages",  
     col='yellow')
```

```
# Density of the means of sample exponentials
```

```
lines(density(avg_sim_mat_byrow),col="blue", lty=1, lwd =3)
```

```
# Theoretical Mean
```

```
abline(v=mean(avg_sim_mat_byrow), col='red',lty=1,lwd=6)
```

```
# Sample Mean
```

```
abline(v=samp_mean,col='blue',lty=1, lwd=3)
```

```
# Normal theoretical density of the exponential distribution
```

```
xfit <- seq(min(avg_sim_mat_byrow), max(avg_sim_mat_byrow), length=100)
```

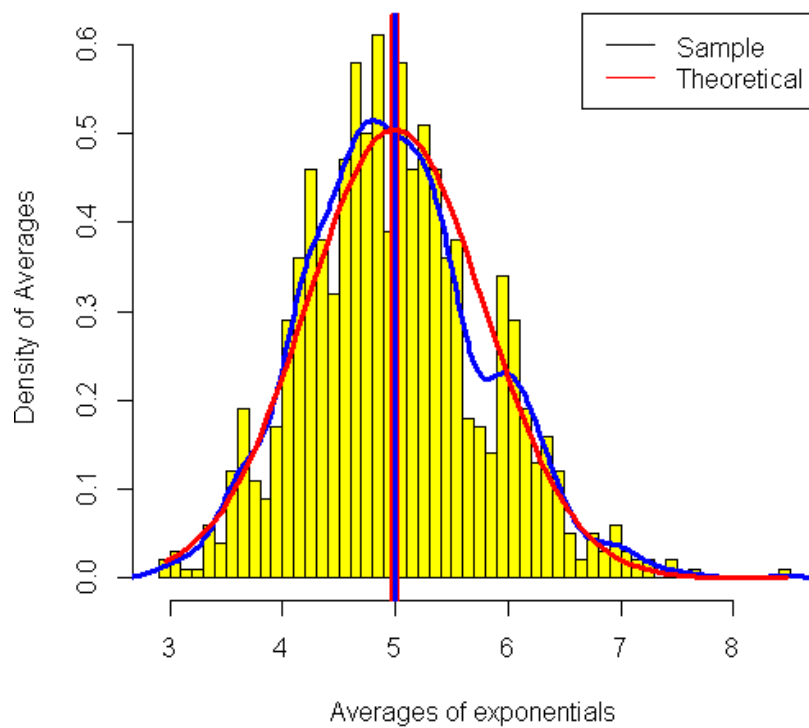
```
yfit <- dnorm(xfit, mean=1/lambda, sd=(1/lambda/sqrt(exp_invest)))
```

```
lines(xfit, yfit, col="red", lty=1, lwd =3)
```

```
legend('topright', c("Sample", "Theoretical"),
```

```
      col=c("black", "red"), lty=c(1,1))
```

### Actual distribution vs Normal distribution



Here, we can see the shape and bar (mean) of the sample distribution approximates a Normal distribution curve.