## Class Example 1.

## The Central Limit Theorem and the Sampling Distribution of the Sample Mean

A captain of a city cat ferry is a hobbyist statistician. Every time he passes next to 'Brisbane Eye' in South Bank, he records the clockwise angular position of a specific unique damaged carriage. He also liked trigonometry in high school, so his recordings are in radians.
Denote his recordings after $N$ passes as, $X_{1}, \ldots, X_{N}$ (note each observation recorded is a capital - as each observation is a random variable).
(a) Argue why it is perhaps sensible that $X_{1}, \ldots, X_{N}$, are i.i.d. (independent and identically distributed) and uniformly distributed on $[-\pi, \pi]$. What would be reasons for violating this assumption?
(b) What is $E\left[X_{i}\right]$ and $\operatorname{Var}\left(X_{i}\right)$ ?
(c) Draw the pdf of $X_{i}$.

```
using PyPlot
x = [-pi,-pi,pi,pi]
y = [0.,1/(2*pi),1/(2*pi),0]
ylim(0.0,0.2)
xlabel("Angle (radians)")
ylabel("PDF (C)")
PyPlot.plot(x,y,label="Eye_PDF");
```



Figure 1: Probability density function of the Brisbane Eye
(d) Assume that the captain passes next to the eye $N$ times a day (each day has a different $N$ ), for $N=2,3,4,5,10,20$ and then calculates the sample means:

$$
\bar{X}_{N}=\frac{1}{N} \sum_{i=1}^{N} X_{i} .
$$

```
N=[2,3,4,5,10,20];
```

[mean(rand(Uniform(-pi,pi),N[_])) for _ in 1:length(N)]
(e) Calculate $E\left[\bar{X}_{N}\right]$ and $\operatorname{Var}\left(\bar{X}_{N}\right)$ for each $N$.
(f) Use Monte-Carlo to draw estimates of the pdfs of $X_{N}$ for each $N$, each time with 10,000 samples.

```
using Distributions
base = 320
N = [2, 3,4,5,10,20]
for i in 1:length(N)
    subplot(base+i)
    PyPlot.plt[:hist]([mean(rand(Uniform(-pi,pi),N[i]))
        for _ in 1:10000],100)
end
savefig("BrisEye_SampleHistograms.png")
```



Figure 2: Probability density function of the Brisbane Eye
(g) Comment on how this illustrates the Central Limit Theorem.
(h) Assuming that the uniform distribution assumption is wrong, but the mean and variance estimates in (b) are the same. Would the distribution of $\bar{X}_{N}$ for large $N$ (e.g. 20) change?

## Class Example 2. Confidence intervals and Hypothesis test for large samples

 Consider the data file, class4_2.csv containing 100 observations.(a) Load the data file and carry out a descriptive statistic summary. What is the sample mean? What is the sample standard deviation?
(b) Determine (large sample) confidence intervals of confidence levels: $90 \%, 95 \%$ and $99 \%$.
(c) You now wish to test the Hypothesis: $H_{0}: \mu=203$ vs. $H_{1}: \mu \neq 203$. Carry out a hypothesis test ( $z$-test), and find the associated p -value. What are your conclusions with $\alpha=0.1,0.05,0.01,0.005$ ?

Class Example 3. Confidence intervals and Hypothesis test for small samples Consider the data file, class4_3.csv containing 10 observations.
(a) Load the data file and carry out a descriptive statistic summary. What is the sample mean? What is the sample standard deviation?
(b) Determine confidence intervals of confidence levels: $90 \%, 95 \%$ and $99 \%$.
(c) You now wish to test the Hypothesis: $H_{0}: \mu=30$ vs. $H_{1}: \mu<30$. Carry out a hypothesis test ( t -test). What are your conclusions with $\alpha=0.1,0.05,0.01,0.005$ ?

## Question 1. Seeing the CLT with Simulation

Consider the following random variables:

$$
\begin{aligned}
U & \sim \operatorname{Uniform}(5,10) \\
V & \sim \operatorname{Exponential}(5) \\
W & \sim \operatorname{Binomial}(10,0.2)
\end{aligned}
$$

(a) What is the mean and variance of each?
(b) Consider now,

$$
X_{n}=\sum_{i=1}^{n} X_{i},
$$

where $X$ is either $U, V$ or $W$ and different $X_{i}$ are assumed indepdnent. What is the mean and variance of this random sum (a function of $n$ )?
(c) For $X$ either $U, V$ or $W$, define,

$$
\tilde{X}_{n}=\frac{X_{n}-E\left(X_{n}\right)}{\sqrt{\operatorname{var}\left(X_{n}\right)}} .
$$

Use the CLT to postulate the distribution of $\tilde{X}_{n}$ for non-small $n$.
(d) Generate Monte Carlo estimates of $P\left(\left|\tilde{X}_{n}\right|>2.0\right)$ using no less than $10^{6}$ generations of $\tilde{X}_{n}$ for every $n$, (separately for each $U, V$ or $W$ ). Compare your results to $P(|Z|>2.0$ ) taken from a normal distribution table, where $Z$ is a standard normal random variable. Do this for $n=5,10,20$. Tabulate and explain your results.

## Question 2. Sample Mean

Suppose that samples of size $n=25$ are selected at random from a normal population with mean 100 and standard deviation 10 . What is the probability that the sample mean falls in the interval from $\mu_{\bar{X}}-1.8 \sigma_{\bar{X}}$ to $\mu_{\bar{X}}-1.0 \sigma_{\bar{X}}$.

## Question 3. Choice of Sample Size

A normal population has a mean 100 and variance 25 . How large must the random sample be if you want the standard error of the sample average to be 1.5 ?

## Question 4. Polymer Elasticity

The elasticity of a polymer is affected by the concentration of a reactant. When low concentration is used, the true mean elasticity is 55 , and when high concentration is used, the mean elasticity is 60. The standard deviation of elasticity is 4 regardless of concentration. If two random samples of size 16 are taken, find the probability that $\bar{X}_{\text {high }}-\bar{X}_{\text {low }} \geqslant 2$.

## Question 5. Building up Confidence

For a normal population with known variance $\sigma^{2}$, answer the following questions:
(a) What is the confidence level for the interval $\bar{x}-2.14 \sigma / \sqrt{n} \leqslant \mu \leqslant \bar{x}+2.14 \sigma / \sqrt{n}$ ?
(b) What is the confidence level for the interval
$\bar{x}-2.49 \sigma / \sqrt{n} \leqslant \mu \leqslant \bar{x}+2.49 \sigma / \sqrt{n}$ ?
(c) What is the confidence level for the interval
$\bar{x}-1.85 \sigma / \sqrt{n} \leqslant \mu \leqslant \bar{x}+1.85 \sigma / \sqrt{n}$ ?
(d) What is the confidence level for the interval $\bar{x}-1.96 \sigma / \sqrt{n} \leqslant \mu \leqslant \bar{x}+1.96 \sigma / \sqrt{n}$ ?

## Question 6. Beverage Machine

A postmix beverage machine is adjusted to release a certain amount of syrup into a chamber where it is mixed with carbonated water. A random sample of 25 beverages was found to have a mean syrup content of $\bar{x}=1.10$ fluid ounce and a standard deviation of $s=0.015$ fluid ounce. Find a $95 \%$ CI on the mean volume of syrup dispensed. State any assumptions that are made.

## Question 7. P-Value

For the hypothesis test $H_{0}: \mu=10$ against $H_{1}: \mu>10$ and variance known, calculate the $P$-value for each of the following test statistics:
(a) $z=2.05$
(b) $z=-1.84$
(c) $z=0.4$

## Question 8. Sodium Content in Organic Cornflakes

The sodium content of twenty 300 -gram boxes of organic cornflakes was determined. The data (in milligrams) is contained in (9-65.csv).
(a) Can you support a claim that mean sodium content of this brand of cornflakes differs from 130 milligrams? use $\alpha=0.05$, state your hypothesis clearly, find the $P$-value and make a conclusion.
(b) Check that sodium content is normally distributed (e.g. using the code for Normal probability plots from Assignment 3).
(c) Compute the power of the test if the true mean sodium content is 130.5 milligrams.
(d) What sample size would be required to detect a true mean sodium content of 130.1 milligrams if you wanted the power of the test to be at least 0.75? Explain your answer.
(e) Explain how the question in part (a) could be answered by constructing a two-sided confidence interval on the mean sodium content.

