### 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  $E[X_i]$  and  $Var(X_i)$ ?
- (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");
```

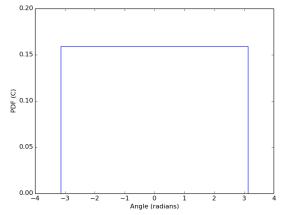


Figure 1: Probability density function of the Brisbane Eye

(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:

$$\overline{X}_N = \frac{1}{N} \sum_{i=1}^N X_i.$$

N=[2,3,4,5,10,20]; [mean(rand(Uniform(-pi,pi),N[\_])) for \_ in 1:length(N)]

- (e) Calculate  $E[\overline{X}_N]$  and  $Var(\overline{X}_N)$  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")
```

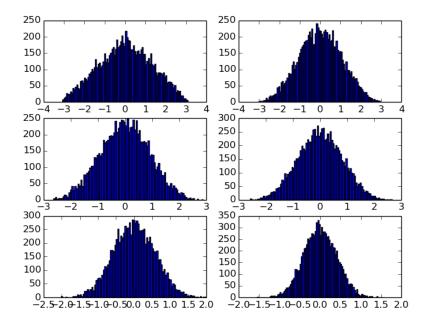


Figure 2: Probability density function of the Brisbane Eye

- (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  $\overline{X}_N$  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:

$$U \sim \text{Uniform}(5, 10)$$
  
 $V \sim \text{Exponential}(5)$   
 $W \sim \text{Binomial}(10, 0.2)$ 

- (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,

$$\tilde{X}_n = \frac{X_n - E(X_n)}{\sqrt{var(X_n)}}.$$

Use the CLT to postulate the distribution of  $\tilde{X}_n$  for non-small n.

(d) Generate Monte Carlo estimates of  $P(|\tilde{X}_n| > 2.0)$  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  $\mu_{\overline{X}} - 1.8 \sigma_{\overline{X}}$  to  $\mu_{\overline{X}} - 1.0 \sigma_{\overline{X}}$ .

## 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  $\overline{X}_{high} - \overline{X}_{low} \ge 2$ .

## 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  $\bar{x} 2.14\sigma/\sqrt{n} \leq \mu \leq \bar{x} + 2.14\sigma/\sqrt{n}$ ?
- (b) What is the confidence level for the interval  $\bar{x} 2.49\sigma/\sqrt{n} \leq \mu \leq \bar{x} + 2.49\sigma/\sqrt{n}$ ?
- (c) What is the confidence level for the interval  $\bar{x} 1.85\sigma/\sqrt{n} \leq \mu \leq \bar{x} + 1.85\sigma/\sqrt{n}$ ?
- (d) What is the confidence level for the interval  $\bar{x} 1.96\sigma/\sqrt{n} \le \mu \le \bar{x} + 1.96\sigma/\sqrt{n}$ ?

### 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.