## AUA CS108, Statistics, Fall 2020 Lecture 37

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## Contents

► Confidence Intervals

**Example:** Assume we are interested in the proportion of smokers in AUA. We ask 120 persons at AUA and learn that 55 of them are smokers. Construct a CI for the proportion of smokers in AUA of 95% confidence level.

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**Example:** Continuing the above Example: now assume we want to find that Proportion within the Error Margin 0.1, with the CL 95%.

At least, how many persons at AUA we need to ask?

Solution: OTB

Problem: Assume we have a Random Sample

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Assume  $\sigma^2$  is known. Given  $\alpha \in (0,1)$ , we want to construct a CI of CL  $1-\alpha$  for  $\mu$ , using a Pivot.

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**Answer:** The interval

$$\left(\overline{X}-z_{1-\frac{\alpha}{2}}\cdot\frac{\sigma}{\sqrt{n}},\ \overline{X}+z_{1-\frac{\alpha}{2}}\cdot\frac{\sigma}{\sqrt{n}}\right)$$

is a  $(1 - \alpha)$ -level CI for  $\mu$ , when  $\sigma^2$  is known (using the Pivoting).

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Note: The Margin of Error in this case is

$$z_{1-\frac{\alpha}{2}}\cdot\frac{\sigma}{\sqrt{n}}.$$

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R gives:

## [1] 1.959964

so our 95% CI will be

$$\left(\overline{X}-1.96\cdot\frac{\sigma}{\sqrt{n}},\ \overline{X}+1.96\cdot\frac{\sigma}{\sqrt{n}}\right).$$

**Example with R:** We generate random numbers from  $\mathcal{N}(2.31,4)$  (so here we assume we know the true parameter value of  $\mu$ ).

```
sigma <- 2
n <- 20
smpl <- rnorm(n, mean = 2.31, sd = sigma)
smpl</pre>
```

```
## [1] 1.0307146 3.3838580 5.6066839 3.2954158 1.5813
## [7] -2.2018976 4.4390909 6.8156058 4.0429737 1.6520
## [13] 0.1586965 2.8670176 2.8652911 2.9551670 8.5463
```

## [19] -0.4402966 2.2230537

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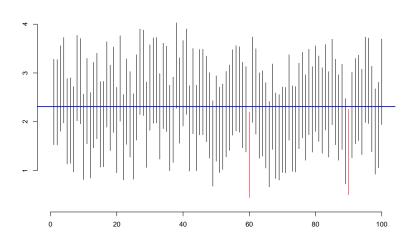
Now we construct the 95% CI by the above formula:

```
me <- 1.96* sigma/sqrt(n) #the Margin of Error
c(mean(smpl) - me, mean(smpl) + me)</pre>
```

```
## [1] 2.021886 3.774963
```

## Example, Simulation

#### Normal Mean Model, CI by Pivots



## Example. Simulation. Code mu <- 2.31; sigma <- 2 $conf.level \leftarrow 0.95$ ; a = 1 - conf.levelsample.size <- 20; no.of.intervals <- 100</pre> $z \leftarrow qnorm(1-a/2)$ ## our quantile ME <- z\*sigma/sqrt(sample.size) #Marqin of Error plot.new() plot.window(xlim = c(0,no.of.intervals), ylim = c(mu-2,mu+2)) axis(1); axis(2)title("Normal Mean Model, CI by Pivots") for(i in 1:no.of.intervals){ x <- rnorm(sample.size, mean = mu, sd = sigma) lo $\leftarrow$ mean(x) - ME; up $\leftarrow$ mean(x) + ME if(lo > mu || up < mu){</pre> segments(c(i), c(lo), c(i), c(up), col = "red")} else{ segments(c(i), c(lo), c(i), c(up))

abline(h = mu, lwd = 2, col = "blue")

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**Answer:** The following interval:

$$\left(\overline{X}-t_{n-1,1-\alpha/2}\cdot\frac{S}{\sqrt{n}},\ \overline{X}+t_{n-1,1-\alpha/2}\cdot\frac{S}{\sqrt{n}}\right)$$

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Here  $t_{n-1,\beta}$  is the  $\beta$ -quantile of the Student's T-Distribution with n-1 degrees of freedom, which we denote by t(n-1).

## CI for $\mu$ , Normal Model, Notes

**Note:** To compare:

▶ If  $\sigma$  is known,  $(1 - \alpha)$ -level CI for  $\mu$  is

$$\overline{X} \pm z_{1-\frac{\alpha}{2}} \cdot \frac{\sigma}{\sqrt{n}}$$

▶ If  $\sigma$  is unknown,  $(1 - \alpha)$ -level CI for  $\mu$  is

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**Note:** If we will compare the quantiles of the same level of  $\mathcal{N}(0,1)$  with t(n-1), we will see that CIs for the case when  $\sigma$  is unknown are wider than for the case when  $\sigma$  is known. This is intuitive, of course - to compensate the uncertainty in  $\sigma$ , we need to take a wider interval:

```
c(qnorm(0.975), qt(0.975, df = 3), qt(0.975, df = 20))
```

## [1] 1.959964 3.182446 2.085963

**Example:** Assume we want to estimate the average time  $\mu$  our Stat students are spending for a homework. We collect information from 10 students for the last hw, and get the following responses (in hrs):

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$$X_1, X_2, ..., X_{10} \sim \mathcal{N}(\mu, \sigma^2).$$

We construct a 95% CI for  $\mu$ , the average time to solve the hw, by the above formula:

## [1] 1.253748 2.066252

```
n <- 10
cl <- 0.95; a = 1-cl
t <- qt(1-a/2, df = n-1)
smpl<-c(2.17,1.42,2.13,0.56,1.21,2.22,1.35,2.37,1.47,1.70)
s <- sd(smpl)
me <- t*s/sqrt(n) #the Margin of Error
c(mean(smpl) - me, mean(smpl) + me)</pre>
```