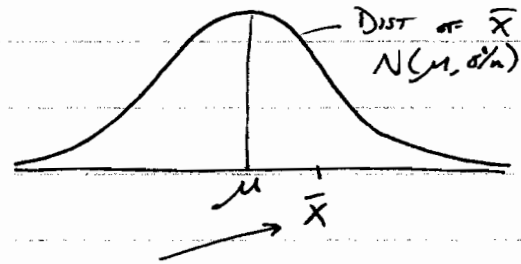


2/5 Suppose $X_1, \dots, X_n \stackrel{iid}{\sim} N(\mu, \sigma^2)$ with μ UNKNOWN AND σ^2 KNOWN
 WE WOULD LIKE TO ESTIMATE μ WITH A CERTAIN DEGREE OF CERTAINTY.

$$\bar{X} \sim N(\mu, \sigma^2/n)$$

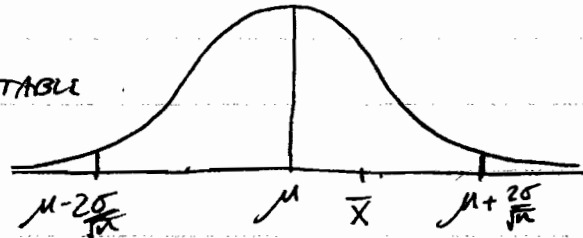


IF THIS \bar{X} IS FROM OUR 1ST SAMPLE,
 HOW GOOD IS IT?

SUPPOSE IF \bar{X} FALLS WITHIN 2 STD'S OF THE MEAN μ , WE ARE SATISFIED.

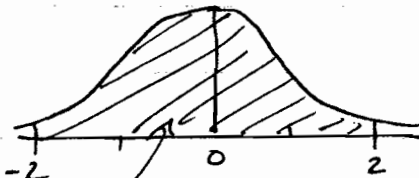
USING 68-95-99.7 RULE OR TABLE

ABOUT 95% OF ALL SAMPLES
 WILL HAVE \bar{X} 'S IN THIS REGION



$$\text{RECALL } Z = \frac{\bar{X} - \mu}{\sigma/\sqrt{n}} \sim N(0, 1)$$

95% OF STANDARDIZED MEANS ARE HERE



$$\Pr(-2 < Z < 2) = .9545$$

$$\Pr(-2 < \frac{\bar{X} - \mu}{\sigma/\sqrt{n}} < 2) = .9545$$

$$\Pr(-\frac{2\sigma}{\sqrt{n}} < \bar{X} - \mu < \frac{2\sigma}{\sqrt{n}}) = .9545$$

$$\Pr(\mu - \frac{2\sigma}{\sqrt{n}} < \bar{X} < \mu + \frac{2\sigma}{\sqrt{n}}) = .9545 \quad \text{--- WHAT WE SAID ABOVE, } \bar{X} \text{ WITHIN 2 STD'S OF } \mu.$$

REWRITE AS

$$\Pr(\bar{X} - \frac{2\sigma}{\sqrt{n}} < \mu < \bar{X} + \frac{2\sigma}{\sqrt{n}}) = .9545$$

↑ UNKNOWN μ

THE CONFIDENCE INTERVAL (CI) AT 95% FOR THE UNKNOWN MEAN μ IS

$$\text{ROUGHLY } \bar{X} - \frac{2\sigma}{\sqrt{n}} \leq \mu \leq \bar{X} + \frac{2\sigma}{\sqrt{n}}$$

$$\text{MORE PRECISELY } \bar{X} - 1.96 \frac{\sigma}{\sqrt{n}} \leq \mu \leq \bar{X} + 1.96 \frac{\sigma}{\sqrt{n}} \text{ OR } \bar{X} \pm 1.96 \frac{\sigma}{\sqrt{n}}$$

3/5

EX SUPPOSE THAT THE MEAN OF THE 100 CARS WAS KNOWN $\bar{X} = 12.04$ LBS.
FIND A 95% CONFIDENCE INTERVAL (CI) FOR THE MEAN μ .

$$\text{Var}(\bar{X}) = \frac{\sigma^2}{n} = .0025$$

$$95\% \text{ CI FOR } \mu: \bar{X} - 1.96 \frac{\sigma}{\sqrt{n}} \leq \mu \leq \bar{X} + 1.96 \frac{\sigma}{\sqrt{n}}$$

$$12.04 - 1.96 \sqrt{.0025} \leq \mu \leq 12.04 + 1.96 \sqrt{.0025}$$

$$11.942 \leq \mu \leq 12.138$$

INTERPRETATION: THE ^{RANDOM} INTERVAL (11.942, 12.138) ~~CONTAINS~~ μ WITH 95% CONFIDENCE. ~~THE~~
OR, IN 95% OF RANDOM SAMPLES, THE INTERVAL OBTAINED WILL CONTAIN μ .

HANDOUT 7]

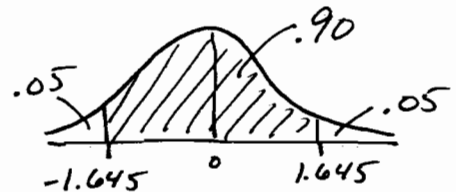
NOTE: IT IS TEMPTING TO CONCLUDE THAT μ IS IN THE INTERVAL WITH PROBABILITY .95. HOWEVER, μ IS FIXED AND UNKNOWN, AND THE INTERVAL IS RANDOM AND KNOWN. ONCE THE INTERVAL IS CONSTRUCTED, ~~IT IS EITHER RIGHT OR WRONG~~ ^{THE INTERVAL CONTAINS OR DOESN'T CONTAIN μ .} YOU ARE EITHER RIGHT OR WRONG. THIS IS WHY THE ABOVE INTERPRETATION IS CORRECT.

NOTES

1. CAN COMPUTE ANY SIZED ^{CONFIDENCE} INTERVAL.

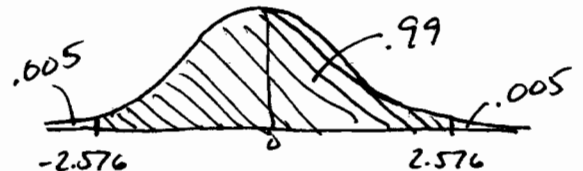
EX. 90% CI FOR μ :

$$\bar{X} \pm 1.645 \frac{\sigma}{\sqrt{n}}$$



EX. 99% CI FOR μ :

$$\bar{X} \pm 2.576 \frac{\sigma}{\sqrt{n}}$$



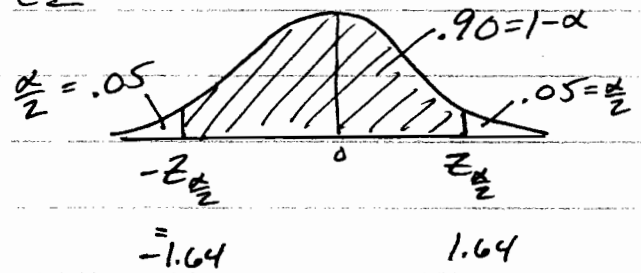
4/5

IN GENERAL, $100(1-\alpha)\%$ CI

EX 90% $\Rightarrow 1-\alpha = .9$

$$\bar{X} \pm Z_{\frac{\alpha}{2}} \frac{\sigma}{\sqrt{n}}$$

TABLE II | Φ | or IV



EX 80% $\Rightarrow 1-\alpha = .8$

$\alpha = .2$, $\frac{\alpha}{2} = .1$

$$Z_{\frac{\alpha}{2}} = 1.28$$

2. CI CAN BE WRITTEN AS $\bar{X} \pm Z_{\frac{\alpha}{2}} \frac{\sigma}{\sqrt{n}}$
 ESTIMATE \pm MARGIN-OF-ERROR (ME)

CAN FIX MARGIN-OF-ERROR TO SELECT SAMPLE SIZE.

σ EITHER KNOWN OR CAN GUESS (OR ESTIMATE).

HAVE CONTROL OF α AND n .

$$n = \left(\frac{Z_{\frac{\alpha}{2}} \sigma}{(ME)} \right)^2 \text{ ROUNDED UP } \uparrow$$

3. ~~CONFIDENCE~~ WITH EVERYTHING ELSE HELD CONSTANT, THE WIDTH OF THE CI WILL:

INCREASE AS α INCREASES \rightarrow INCREASED CONFIDENCE

INCREASE AS σ INCREASES \rightarrow INCREASED VARIABILITY

DECREASE AS n INCREASES \rightarrow INCREASED INFORMATION.

4. TYPICAL VALUES OF α ARE

α	C	$Z_{\frac{\alpha}{2}}$
.1	90%	1.645
* .05	95%	1.960
.01	99%	2.576

5/5

EX BIOLOGISTS STUDYING THE HEALING OF SKIN WOUNDS MEASURED THE RATE AT WHICH NEW CELLS CLOSED ON A RAZOR CUT MADE IN THE SKIN OF AN ANESTHETIZED R. NEUT. THE DATA FOR $n=18$ NEUTS IN MICROMETERS / HOURS:

29 27 34 40 22 28 14 35 26
35 12 36 23 18 11 22 23 33

ASSUMING THE NEUTS ARE A RANDOM SAMPLE FROM THEIR SPECIES, AND THAT THE POPULATION STANDARD DEVIATION IS 8 mm/hr, FIND A 90% CI FOR THE MEAN HEALING RATE OF NEUTS.

1. STEM PLOT

1	1 2 4 8
2	2 2 3 3 6 7 8 9
3	0 3 4 5 5
4	0

ROUGHLY SYMMETRIC, UNIMODAL.

LOOKS FAIRLY NORMALLY DISTRIBUTED.

μ = MEAN HEALING RATE OF POPULATION OF NEUTS

$\sigma = 8$ mm/hr, $n = 18$.

90% CI $\Rightarrow Z_{\frac{\alpha}{2}} = 1.645$

$\bar{X} = \frac{1}{18}(29+27+34+\dots+33) = 25.67$ mm/hr.

90% CI FOR μ : $\bar{X} \pm Z_{\frac{\alpha}{2}} \frac{\sigma}{\sqrt{n}}$

$25.67 \pm 1.645 \left(\frac{8}{\sqrt{18}} \right)$

25.67 ± 3.10

$(22.57, 28.77)$

THE INTERVAL $(22.57, 28.77)$ CONTAINS μ WITH 90% CONFIDENCE.

8.3 1/3

8.3 CI ON MEAN OF NORMAL DISTRIBUTION, VARIANCE UNKNOWN.

PREVIOUSLY, WE ASSUMED σ WAS KNOWN.

IF WE KNOW σ , WE KNOW μ !

TYPICALLY σ IS UNKNOWN.

IF THE POPULATION STANDARD DEVIATION IS UNKNOWN, AND THE SAMPLE SIZE IS LARGE ($n > 40$), THEN ^{BY} THE CENTRAL LIMIT THEOREM (CLT) $\bar{X} \approx N(\mu, \frac{\sigma^2}{n})$ APPROXIMATELY.

ALSO $S \rightarrow \sigma$ AS $n \rightarrow \infty$.

SINCE σ UNKNOWN, USE S INSTEAD.

SO $\frac{\bar{X} - \mu}{S/\sqrt{n}} \approx N(0, 1)$.

BUT, IF THE SAMPLE SIZE IS SMALL ($n \leq 40$), THE SAMPLE DISTRIBUTION OF \bar{X} LOOKS NORMAL, BUT HAS INCREASED VARIABILITY: THE t DISTRIBUTION.

$T = \frac{\bar{X} - \mu}{S/\sqrt{n}} \sim t_{n-1}$

$n-1 = \text{degrees of freedom} = df$

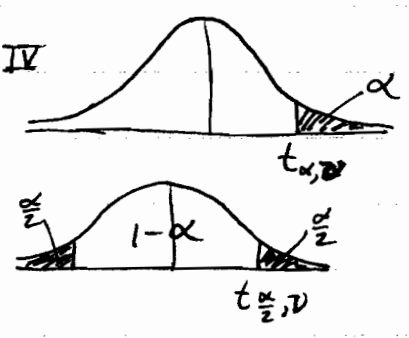
THERE ARE AN INFINITE NUMBER OF t DISTRIBUTIONS INDEXED BY df .



A $100(1-\alpha)\%$ CI OF μ IS

$\bar{X} \pm \underbrace{t_{\frac{\alpha}{2}, n-1}}_{\text{NOW } t \text{ INSTEAD OF } z_{\frac{\alpha}{2}}} \frac{S}{\sqrt{n}}$

TABLE IV



IN OUR CONTEXT OF A CI, WE WANT SO BE CAREFUL!

EX.	n	C	$t_{\frac{\alpha}{2}, n-1}$
	15	90%	$t_{.05, 14} = 1.761$
	23	95%	$t_{.025, 22} = 2.074$
	5	99%	$t_{.005, 4} = 7.172$

IF df NOT IN TABLE, ROUND DOWN TO BE CONSERVATIVE WITH A WIDER INTERVAL.

GENERAL FORMS FOR CIs:	NORMAL, KNOWN σ	LARGE SAMPLE NORMAL UNKNOWN σ $n \geq 40$	SMALL SAMPLE NORMAL UNKNOWN σ $n < 40$	LARGE SAMPLE POPULATION PROPORTION APPROX AND ALL PITS
PARAMETER OF INTEREST: EST PAR	μ	μ	μ	p
ESTIMATE OF PARAMETER: EST EST	\bar{x}	\bar{x}	\bar{x}	\hat{p}
STANDARD ERROR OF EST: SE(EST) SE(EST)	$\frac{\sigma}{\sqrt{n}}$	$\frac{s}{\sqrt{n}}$	$\frac{s}{\sqrt{n}}$	$\sqrt{\frac{\hat{p}(1-\hat{p})}{n}}$
DISTRIBUTION: $\frac{EST - PAR}{SE(EST)} \sim \text{DIST}$	$N(0,1)$	$N(0,1)$	t_{n-1}	$N(0,1)$

$$EST \pm C^* \cdot SE(EST)$$

↑
CUT OFF FROM DISTRIBUTION; EITHER $Z_{\alpha/2}$ OR $t_{\alpha/2, n-1}$

HANDOUT 8]

ASSUMPTIONS TO USE SMALL SAMPLE ($n < 40$) t PROCEDURE:

X_1, \dots, X_n ARE IID AND ROUGHLY NORMAL: SYMMETRIC, UNIMODAL, NO OUTLIERS
(SMALL DEVIATIONS FROM NORMALITY ARE EXPECTED IN SMALL SAMPLES).

CHECK NORMALITY WITH STEM-AND-LEAF PLOT.

OR

WHY THE t -DISTRIBUTION? (NOT ON EXAM)

$$\frac{\bar{X} - \mu}{\sigma/\sqrt{n}} \sim N(0,1) \text{ IF } \sigma \text{ IS KNOWN}$$

$$\frac{\bar{X} - \mu}{s/\sqrt{n}} \approx N(0,1) \text{ IF } n \text{ IS LARGE, BUT IN SMALL SAMPLES IT ISN'T.}$$

WILLIAM S. GOSSET (STUDENT), WITH DEGREES IN BOTH MATH AND CHEM, OBTAINED A POST AS A CHEMIST WITH ARTHUR GUINNESS SON AND CO IN 1894. HE INVENTED THE t -TEST TO HANDLE SMALL SAMPLES FOR QUALITY CONTROL IN BREWING.

8.5 1/1

8.5 LARGE SAMPLE CI FOR POPULATION PROPORTION, P.

RECALL $X \sim \text{Bin}(n, p)$, X COUNTS THE NUMBER OF SUCCESSSES OUT OF n INDEPENDENT TRIALS.

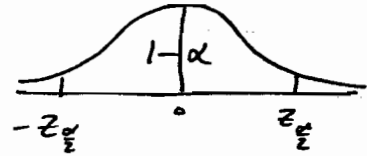
p = PROBABILITY OF SUCCESS.

THINK OF n AS THE SAMPLE SIZE FROM A LARGE POPULATION.

$$\left. \begin{aligned} E(X) &= np \\ \text{Var}(X) &= np(1-p) \end{aligned} \right\} Z = \frac{X - np}{\sqrt{np(1-p)}} \stackrel{a}{\sim} N(0, 1), \text{ APPROXIMATELY.}$$

FACTOR OUT AN n , $Z = \frac{\frac{X}{n} - p}{\sqrt{\frac{p(1-p)}{n}}}$, LET $\hat{p} = \frac{X}{n}$ = SAMPLE PROPORTION.

THEN $P(-z_{\frac{\alpha}{2}} \leq Z \leq z_{\frac{\alpha}{2}}) = 1 - \alpha$



$$P\left(-z_{\frac{\alpha}{2}} \leq \frac{\frac{X}{n} - p}{\sqrt{\frac{p(1-p)}{n}}} \leq z_{\frac{\alpha}{2}}\right) = 1 - \alpha$$

$$P\left(\hat{p} - z_{\frac{\alpha}{2}} \sqrt{\frac{p(1-p)}{n}} \leq p \leq \hat{p} + z_{\frac{\alpha}{2}} \sqrt{\frac{p(1-p)}{n}}\right) = 1 - \alpha$$

→ DON'T KNOW POPULATION PROPORTION, p , SO ESTIMATE WITH \hat{p} .

$$P\left(\hat{p} - z_{\frac{\alpha}{2}} \sqrt{\frac{\hat{p}(1-\hat{p})}{n}} \leq p \leq \hat{p} + z_{\frac{\alpha}{2}} \sqrt{\frac{\hat{p}(1-\hat{p})}{n}}\right) = 1 - \alpha$$

A $100(1-\alpha)\%$ CI FOR p IS: $\hat{p} \pm z_{\frac{\alpha}{2}} \sqrt{\frac{\hat{p}(1-\hat{p})}{n}}$

$PAR = p$
 $EST = \hat{p} = \frac{X}{n}$
 $SE(EST) = \sqrt{\frac{\hat{p}(1-\hat{p})}{n}}$
 $DIST \text{ OF } \frac{EST - PAR}{SE(EST)} \sim N(0, 1)$

MARGIN-OF-ERROR
 $ME = z_{\frac{\alpha}{2}} \sqrt{\frac{\hat{p}(1-\hat{p})}{n}}$. FOR A GIVEN ME, CONFIDENCE LEVEL AND GUESSED/ESTIMATED PROPORTION, WHAT IS REQUIRED SAMPLE SIZE? USE CONSERVATIVE $\hat{p} = .5$
 $n = \left(\frac{z_{\frac{\alpha}{2}}}{ME}\right)^2 \hat{p}(1-\hat{p}) \nearrow$ ROUNDED UP

ASSUMPTIONS: RANDOM SAMPLE OF n "INDIVIDUALS"

SAMPLE SIZE IS LARGE: $n\hat{p} > 5$ AND $n(1-\hat{p}) > 5$
 # OF SUCCESSES # OF FAILURES

[HANDOUT 9]