

Major Points

- •Sampling distribution of the mean revisited
- oTesting hypotheses: sigma known
  - An example
- oTesting hypotheses: sigma unknown
  - An example
- •Factors affecting the test
- oMeasuring the size of the effect
- •Confidence intervals

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REVIEW: HYPOTHESIS TESTING STEPS

- 1. State Null Hypothesis
- 2. Alternative Hypothesis
- 3. Decide on  $\alpha$  (usually .05)
- 4. Decide on type of test (distribution; z, t, etc.)
- 5. Find critical value & state decision grule
- 6. Calculate test
- 7. Apply decision rule



SAMPLING DISTRIBUTIONS  oIn reality, we take only one samp of a specific size (N) from a population and calculate a statistic of interest.  oBased upon this single statistic from a single sample, we want to know "How likely is it that I could get a sample statistic of this value from a population if the corresponding population parameter was"	Psy 320 - Cal State N	
SAMPLING DISTRIBUTIONS •BUT, in order to answer that question, we need to know what the entire range of values this statistic could be. •How can we find this out? •Draw all possible samples of size of from the population and calculate sample statistic on each of these samples (Chapter 8) •Or we can calculate it	Psy 320 - Cal State Northridge	
SAMPLING DISTRIBUTIONS  •A distribution of all possible statistics calculated from all possible samples of size N drawn from a population is called a Sampling Distribution.  •Three things we want to know	Psy 320 - Cal State Northridge	
about <i>any</i> distribution?  • – Central Tendency, Dispersion, Shape	6	

AN EXAMPLE – BACK TO IQPLUS

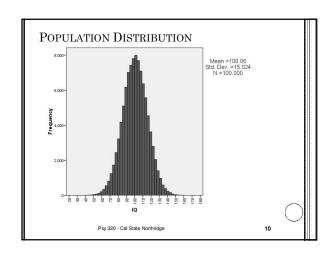
- •Returning to our study of IQPLUS and its affect on IQ
- •A group of 25 participants are given 30mg of IQPLUS everyday for ten days
- **o**At the end of 10 days the 25 participants are given the Stanford-Binet intelligence test.

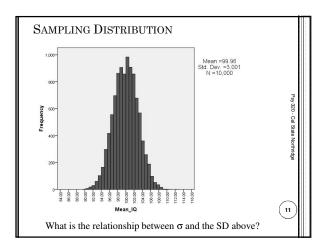
#### **IQPLUS**

- The mean IQ score of the 25 participants is 106
  - $\mu = 100, \sigma = 15$
- o Is this increase large enough to conclude that IQPLUS was affective in increasing the participants IQ?

SAMPLING DISTRIBUTION OF THE MEAN

- •Formal solution to example given in Chapter 8.
- **o**We need to know what kinds of sample means to expect if IQPLUS has no effect.
  - i. e. What kinds of means if  $\mu = 100$  and  $\sigma = 15$ ?
  - This is the sampling distribution of the mean (Why?)





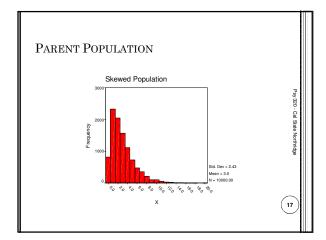
SAMPLING DISTRIBUTION OF THE MEAN	
•The sampling distribution of the	-
mean depends on  • Mean of sampled population	Psy 320 - Cal State Northridge
<ul><li>• St. dev. of sampled population</li></ul>	ate Northridge
<ul><li>•Why?</li><li>• Size of sample</li></ul>	
oWhy?	12

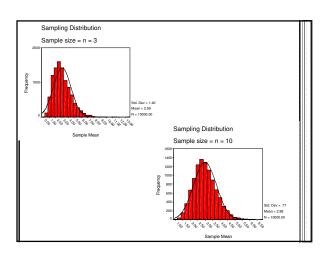
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SAMPLING DISTRIBUTION OF THE MEAN		
• Approaches normal	ס	
• Approaches normal oWhy?	sy 320 - Cal State Northridge	
Rate of approach depends on sample size	State Nort	
oWhy?	hridge	
•Basic theorem		-
• Central limit theorem	13	
		1
CENTRAL LIMIT THEOREM		
oCentral Tendency		
• The mean of the Sampling	Psy3	
Distribution of the mean is denoted as $\mu_{ar{\chi}}$	sy 320 - Cal State Northridge	
oDispersion	ate Northrid	
• The Standard Deviation of the	ge	
Sampling Distribution of the mean is called the <b>Standard Error of the</b>		
<b>Mean</b> and is denoted as $oldsymbol{\sigma}_{ar{\chi}}$	14	
		]
CENTRAL LIMIT THEOREM		,
Standard Error of the Mean		
<ul> <li>We defined this manually in Chapter 8</li> <li>And it can be calculated as: σ</li> </ul>	Psy 320	
$\sigma_{\bar{X}} = \frac{\sigma}{\sqrt{n}}$	20 - Cal Sta	
$\circ$ Shape $\forall n$	te Northridg	
• The shape of the sampling distribution of the mean will be normal if the	je .	
original population is normally distributed <b>OR</b>	$\mathbb{I}$	
• if the sample size is "reasonably large."	15	
		<u> </u>

#### DEMONSTRATION

- **o**Let a population be very skewed
- •Draw samples of size 3 and calculate means
- **o**Draw samples of size 10 and calculate means
- •Plot means
- •Note changes in means, standard deviations, and shapes

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#### DEMONSTRATION

- •Means have stayed at 3.00 throughout
  - Except for minor sampling error
- •Standard deviations have decreased appropriately
- **o**Shape has become more normal as we move from n = 3 to n = 10
  - See superimposed normal distribution for reference

Testing Hypotheses:  $\mu$  and  $\sigma$  known

Called a 1-sample Z-test

- $oH_0$ :  $\mu = 100$
- $oH_1$ :  $\mu \neq 100$  (Two-tailed)
- **o**Calculate p (sample mean) = 106 if  $\mu = 100$
- **o**Use *z* from normal distribution
- **o**Sampling distribution would be normal

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Using z to Test  $H_0 \rightarrow 2\text{-tailed}_{\alpha\,=\,.05}$ 

 $\circ$ Calculate z

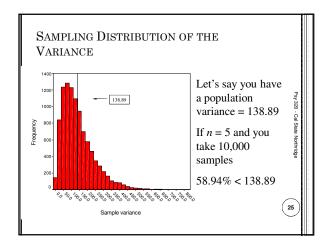
$$z_{\overline{X}} = \frac{\overline{X} - \mu}{\sigma_{\overline{X}}} = \frac{\overline{X} - \mu}{\overline{X}} = \frac{\overline{X} -$$

oIf  $z > \pm 1.96$ , reject  $H_0$  (Why 1.96?)

- o\_\_\_\_ > 1.96
  - The difference is significant.

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Using z to Test  $H_0 \rightarrow 1$ -tailed $_{\alpha = .05}$ oCalculate z (from last slide) oIf  $z > \pm 1.64$ , reject  $H_0$  (Why 1.64?) **o**\_\_\_\_ > 1.64 • The difference is significant. Z-TEST  $\circ$ Compare computed z to histogram of sampling distribution oThe results should look consistent. oLogic of test • Calculate probability of getting this mean if null true. • Reject if that probability is too small. Testing Hypotheses:  $\mu$  known σ NOT KNOWN  $\circ$ Assume same example, but  $\sigma$  not known **o**We can make a guess at  $\sigma$  with sullet But, unless we have a large sample, s is likely to underestimate  $\sigma$  (see next slide) •So, a test based on the normal distribution will lead to biased results (e.g. more Type † errors)



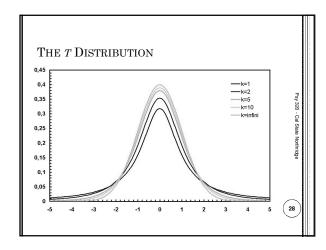
# Testing Hypotheses: $\mu$ known $\sigma$ not known

- oSince s is the best estimate of  $\sigma ; S_{\overline{X}}$  is the best estimate of  $\sigma_{\overline{X}}$
- •Since Z does not work in this case we need a different distribution
  - ullet One that is based on s
  - Adjusts for the underestimation
  - And takes sample size (i.e. *degrees of freedom*) into account

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#### The T Distribution

- $\circ$ Symmetric, mean = median = mode = 0.
- Asymptotic tails
- oInfinite family of t distributions, one for  $\frac{3}{8}$  every possible df.
  - For low *df*, the t distribution is more leptokurtic (e.g. spiked, thin, w/ fat tails)
  - For high *df*, the t distribution is more normal
  - With  $df = \infty$ , the t distribution and the z distribution are equivalent.



#### DEGREES OF FREEDOM

- **o**Skewness of sampling distribution of variance decreases as n increases
- ot will differ from z less as sample size increases
- **o**Therefore need to adjust t accordingly
- **o**Degrees of Freedom: df = n 1
- ot based on df

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TESTING HYPOTHESES: μ KNOWN

σ NOT KNOWN

Called a 1-sample *t*-test

- $oH_0$ :  $\mu = 100$
- $oH_1$ :  $\mu \neq 100$  (Two-tailed)
- oCalculate p (sample mean) = 106 if  $\mu = 100$
- **o**Use *t*-table to look up critical value using *degrees of freedom*
- **o**Compare  $t_{
  m observed}$  to  $t_{
  m critical}$  and make decision

Using T to Test  $\mathrm{H}_0 \to 2$ -tailed $_{\alpha\,=\,.05}$ 

**o**Same as z except for s in place of σ. **o**Let's say for the 25, s = 7.78

**o**With  $\alpha = .05$ , df=24, 2-tailed

 $t_{\text{critical}} =$  \_\_\_\_\_ (Table D.6; see next slide)

 $\bullet$ Since  $\_\_$  >  $\_\_$  reject  $H_0$ 

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df				es of Stu			
1-tailed	0.1	0.05	0.025	0.01	0.005	0.0005	
2-tailed	0.2	0.1	0.05	0.02	0.01	0.001	
1	3.078	6.314	12.706	31.821	63.657	636.619	T
2	1.886	2.92	4.303	6.965	9.925	31.598	-
3	1.683	2.353	3.182	4.5415	5.841	12.941	DISTRIBUTION
4	1.533	2.132	2.776	3.747	4.604	8.61	DISTRIBUTION
5	1.476	2.015	2.571	3.365	4.032	6.859	
6	1.44	1.943	2.447	3.143	3.707	5.959	
7	1.415	1.895	2.365	2.998	3.499	5.405	7
- 8	1.397	1.86	2.306	2.896	3.355	5.041	rsy Acci - call state routing
9	1.383	1.833	2.262	2.821	3.25	4.781	, and a second
10	1.372	1.812	2.228	2.764	3.169	4.587	ģ
11	1.363	1.796	2.201	2.718	3.106	4.437	<u> </u>
12	1.356	1.782	2.179	2.681	3.055	4.318	2
13	1.35	1.771	2.16	2.65	3.012	4.221	The state of the s
14	1.345	1.761	2.145	2.624	2.977	4.14	
15	1.341	1.753	2.131	2.602	2.947	4.073	į.
16	1.337	1.746	2.12	2.583	2.921	4.015	· ·
17	1.333	1.74	2.11	2.567	2.898	3.965	
18	1.33	1.734	2.101	2.552	2.878	3.922	
19	1.328	1.729	2.093	2.539	2.861	4.883	
20	1.325	1.725	2.086	2.528	2.845	3.85	
21	1.323	1.721	2.08	2.518	2.831	3.819	
22	1.321	1.717	2.074	2.508	2.819	3.792	( 32
23	1.319	1.714	2.069	2.5	2.807	3.767	
24	1.318	1.711	2.064	2.492	2.797	3.745	_
25	1.316	1.708	2.06	2.485	2.787	3.725	

Using $T$ to Test $\mathrm{H}_0 \to 1\text{-tailed}_\alpha$	=
05	

o $H_0$ :  $\mu$  ≤ 100

 $oH_1$ :  $\mu > 100$  (One-tailed)

o<br/>The  $t_{observed}$  value is the same  $\rightarrow$ 

 $\bullet$  With  $\alpha$  = .05, df=24, 1-tailed  $t_{\rm critical}$  = \_\_\_\_ (Table D.6; see next slide)  $\bullet$  Since \_\_\_\_ > \_\_\_ reject  $_{\rm H_0}$ 

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df							
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7	1.415	1.895	2.365	2.998	3.499	5.405	g.
8	1.397	1.86	2.306	2.896	3.355	5.041	Psy 320
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CONCLUSION	S
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- **o**With n = 25,  $t_{observed}(24) =$ \_\_\_\_\_
- $oldsymbol{\circ}$  Because \_\_\_\_\_ is larger than both \_\_\_\_\_ (1-tailed) and \_\_\_\_\_ (2-tailed) we reject  $H_0$  under both 1-and 2-tailed hypotheses
- •Conclude that taking IQPLUS leads to a higher IQ than normal.

### FACTORS AFFECTING...

#### ot test

- Difference between sample and population means
- Magnitude of sample variance
- Sample size

#### Decision

- $\bullet$  Significance level  $\alpha$
- One-tailed versus two-tailed test

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SIZE OF THE EFFECT

- **o**We know that the difference is significant.
  - That doesn't mean that it is important.
- •Population mean = 100, Sample mean = 106
- •Difference is 6 words or roughly a 6% increase.
- oIs this large?

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EFFECT SIZE

- •Later we develop this more in terms of standard deviations.
- oFor Example:
  - In our sample s = 7.78

Effect size = 
$$\frac{\overline{X} - \mu}{s} = \frac{106 - 100}{7.78} = \frac{6}{7.78} = .77$$

• over 3/4 of a standard deviation



CONFIDENCE INTERVALS ON MEAN

- •Sample mean is a point estimate
- **o**We want interval estimate
- oGiven the sample mean we can calculate an interval that has a probability of containing the population mean
- $\circ$ This can be done if  $\sigma$  is known or not



CONFIDENCE INTERVALS ON MEAN

oIf  $\sigma$  is known than the 95% CI is

$$CI_{.95} = \overline{X} \pm 1.96(\sigma_{\overline{X}})$$

oIf  $\sigma$  is <u>not</u> known than the 95% CI is

$$CI_{.95} = \overline{X} \pm \left(t_{(2-tailed,\alpha=.05)} * s_{\overline{X}}\right)$$

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For Our Data Assuming  $\sigma$  known

$$CI_{.95} = \overline{X} \pm (1.96 * \sigma_{\overline{X}})$$

$$= 106 \pm (1.96 * \underline{\hspace{0.5cm}})$$

$$= 106 \pm \underline{\hspace{0.5cm}}$$

$$= \underline{\hspace{0.5cm}} \leq \mu \leq \underline{\hspace{0.5cm}}$$

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FOR OUR DATA ASSUMING  $\sigma$  NOT KNOWN

$$CI_{.95} = \overline{X} \pm \left(t_{(2-tailed,\alpha=.05)} * s_{\overline{X}}\right)^{\frac{p_{y}}{20} \cdot \frac{1}{Gal}}$$

$$= 106 \pm (\underline{\qquad} * \underline{\qquad})$$

$$= 106 \pm \underline{\qquad}$$

$$= \underline{\qquad} \le \mu \le \underline{\qquad}$$

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#### CONFIDENCE INTERVAL

- ${\bf o}$  Neither interval includes 100 the population mean of IQ
- ullet Consistent with result of t test.
- •Confidence interval and effect size tell us about the magnitude of the effect.

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**o**What else can we conclude from confidence interval?