

## Chapter 15: Sampling Distribution Models

P 433

- **Normal approximation for counts and proportions**

Draw a SRS of size  $n$  from a large population having population  $p$  of success. Let  $X$  be the count of success in the sample and  $\hat{p} = X/n$  the sample proportion of successes. When  $n$  is large, the sampling distributions of these statistics are approximately normal:

$X$  is approx.  $N(np, \sqrt{np(1-p)})$

$\hat{p}$  is approx.  $N\left(p, \sqrt{\frac{p(1-p)}{n}}\right)$

## Assumptions and Conditions

1. Randomization Condition: The sample should be a simple random sample of the population.
2. 10% Condition: If sampling has not been made with replacement, then the sample size,  $n$ , must be no larger than 10% of the population.
3. Success/Failure Condition: The sample size has to be big enough so that both  $np$  and  $nq$  are greater than 10.

# Sampling distribution of a sample mean

If a population has the  $N(\mu, \sigma)$ , then the sample mean  $\bar{X}$  of  $n$  independent observations has the  $N(\mu, \sigma/\sqrt{n})$

## The central limit theorem p485

Draw a SRS of size  $n$  from a population with mean  $\mu$  and std dev.  $\sigma$ . When  $n$  is large, sampling distribution of a sample mean  $\bar{X}$  is approximately normal with mean  $\mu$  and std dev.  $\sigma/\sqrt{n}$ .

Note: The normal approximation for the sample proportion and counts is an important example of the central limit theorem.

Usually ok with *much smaller*  $n$  (eg.  $n=30$  often big enough).

A sample of size  $n=25$  is drawn from a population with mean 40 and SD 10. What is prob that sample mean will be between 36 and 44? (Assume Central Limit Theorem applies.)

Ex Suppose that the weights of airline passengers are known to have a distribution with a mean of 75kg and a std. dev. of 10kg. A certain plane has a passenger weight capacity of 7700kg. What is the probability that a flight of 100 passengers will exceed the capacity?

Ans: By CLT  $T \sim N(7500, \sqrt{100 \times 100})$   $P(T > 7700) = P(Z > 2) = 0.0228$

## Chapter 16: Confidence intervals for proportions p467

- The sampling distribution model of  $\hat{p}$  is centred at  $p$ , with standard deviation  $\sqrt{\frac{p(1-p)}{n}}$ .
- Since we don't know  $p$ , we can't find the true standard deviation of the sampling distribution model, so we need to find the standard error:

$$SE(\hat{p}) = \sqrt{\frac{\hat{p}(1-\hat{p})}{n}}$$

Sampling distribution approx normal (when  $np \geq 10$ , and  $n(1-p) \geq 10$ )

Example Opinion poll with 1000 randomly sampled Canadians, 91% believe Canada's health care system better than US's.

$$SE(\hat{p}) = \sqrt{\frac{(0.91)(1-0.91)}{1000}} = 0.0090.$$

Sampling distribution approx normal:  $np \geq 10$ ,  
 $n(1-p) \geq 10$

If we repeat sampling, about 95% of the time, sample proportion  $\hat{p}$  should be inside

$$\left( p - 2(0.0090), p + 2(0.0090) \right) = p \pm 0.0180$$

that is,  $p$  and  $\hat{p}$  should be less than 0.0180 apart.

In general, in repeated sampling, 95% of the intervals calculated using the formula

$$\hat{p} \pm 1.96 \sqrt{\frac{\hat{p}(1-\hat{p})}{n}} \text{ will contain } p.$$

For any given sample the interval calculated

using the formula  $\hat{p} \pm z^* \sqrt{\frac{\hat{p}(1-\hat{p})}{n}}$  is called a **confidence interval**.

Note 2: **Margin of error** of the CI =  $z^* \sqrt{\frac{\hat{p}(1-\hat{p})}{n}}$

The above CI can be written as  $\hat{p} \pm z^* SE(\hat{p})$ .

In the above example a 95% CI for the population proportion is

$$0.91 \pm 1.96 \times \sqrt{\frac{0.91(1-0.91)}{1000}} = (0.891, 0.927)$$

Find  $z^*$  for 90% interval:

– leftover is  $10\% = 0.1000$

– half that is  $5\% = 0.0500$

– Table:  $z = -1.64$  or  $-1.65$  has  $0.0500$  less

–  $z = 1.64$  or  $1.65$  has  $0.0500$  more ( $0.9500$  less).

– so  $z^* = 1.64$  or  $1.65$ .

– Handy table:

| Confidence level | $z^*$ |
|------------------|-------|
| 90%              | 1.645 |
| 95%              | 1.960 |
| 99%              | 2.576 |

What does "95% of the time" mean? *In 95% of all possible samples.* But different samples have different  $\hat{p}$ 's, and give different confidence intervals.

Eg. another sample, with  $n=1000$ , might have  $\hat{p}=0.89$ , giving 95% confidence interval for  $p$  of  $(0.870, 0.910)$ .

*So our confidence in procedure rather than an individual interval.*

## Chapter 17, p 496: Testing Hypotheses about Proportions

A newsletter reported that 90% of adults drink milk. A survey in a certain region found that 652 of 750 randomly chosen adults (86.93%) drink milk. Is that evidence that the 90% figure is not accurate for this region?

Difference between 86.93 and 90, but might be chance.

One approach: confidence interval.

$$\sqrt{\frac{\hat{p}(1-\hat{p})}{n}} = 0.0123, \text{ so}$$

95% CI is 0.845 to 0.893

99% CI is 0.838 to 0.901

so now what?

Hypothesis testing. Think about logic first by analogy.

Court of law

|       |          | Decision   |               |
|-------|----------|------------|---------------|
|       |          | Not guilty | Guilty        |
| Truth | Innocent | Correct    | Serious error |
|       | Guilty   | Error      | Correct       |

- Truth (unknown)
- Decision (we hope reflects truth)
  - based on *evidence*: does it contradict accused being innocent?
- Null hypothesis  $H_0$  is “presumption of innocence”
- Alternative hypothesis  $H_A$  is that  $H_0$  is false. Need evidence (data) to be able to reject  $H_0$  in favour of  $H_A$ .

## Hypothesis testing

|       |             | Decision             |              |
|-------|-------------|----------------------|--------------|
|       |             | fail to reject $H_0$ | reject $H_0$ |
| Truth | $H_0$ true  | Correct              | Type I error |
|       | $H_0$ false | Type II error        | Correct      |

Compare this with our example:

### Court of law

|       |          | Decision   |               |
|-------|----------|------------|---------------|
|       |          | Not guilty | Guilty        |
| Truth | Innocent | Correct    | Serious error |
|       | Guilty   | Error      | Correct       |

Example: A newsletter reported that 90% of adults drink milk. A survey in a certain region found that 652 of 750 randomly chosen adults (86.93%) drink milk. Is that evidence that the 90% figure is not accurate for this region?

**Step 1 Set up the null and the alternative hypotheses:**

- $H_0: p = 0.90$
- $H_A: p \neq 0.90$

**Step 2: Calculate the test statistics:**

$$z = \frac{\hat{p} - p_0}{\sqrt{\frac{p_0(1-p_0)}{n}}}$$

In our case,  $H_0: p=0.90$  and  $\hat{p}=652/750=0.8693$ . If  $H_0$  true, value of  $Z$  we might observe is approx standard normal.

$$z = \frac{\hat{p} - p_0}{\sqrt{\frac{p_0(1-p_0)}{n}}} = \frac{0.8693 - 0.9}{\sqrt{\frac{0.9(1-0.9)}{750}}} = -2.79$$

### Step 3: P-value

**P-value:** The chance (the proportion) of getting a  $\hat{p}$  as far or further from  $H_0$  than the value observed.

The area under the std Normal curve below -2.79 is 0.0026.

Could have observed  $\hat{p}$  above 0.90 too, so P-value twice this. i.e. P-value =  $2 \times 0.0026 = 0.0052$

## Step 4 Conclusion:

Reject the null hypothesis if the p-value is small.

How to decide whether P-value small enough to reject  $H_0$  ?

Choose  $\alpha$  ahead of time:

– if rejecting  $H_0$  an important decision, choose small  $\alpha$  (0.01)

“default”  $\alpha = 0.05$ .

Reject  $H_0$  if P-value less than the  $\alpha$  you chose.

a value of  $\hat{p}$  like the one we observed very unlikely *if*  $H_0: p=0.90$  were *true* and so we reject  $H_0$  .

## One-sided and two-sided tests

Ex. Leroy, a starting player for a major college basketball team, made only 38.4% of his free throws last season. During the summer he worked on developing a softer shot in the hope of improving his free-throw accuracy. In the first eight games of this season Leroy made 25 free throws in 40 attempts. Let  $p$  be his probability of making each free throw he shoots this season.

(a) State the null hypothesis  $H_0$  that Leroy's free-throw probability has remained the same as last year and the alternative  $H_a$  that his work in the summer resulted in a higher probability of success.

(b) Calculate the  $z$  statistic for testing  $H_0$  versus  $H_a$ .

(c) Do you accept or reject  $H_0$  for  $\alpha = 0.05$ ?

Find the P-value.

(d) Give a 90% confidence interval for Leroy's free-throw success probability for the new season.

Are you convinced that he is now a better free-throw shooter than last season?

(a)  $H_0: p = 0.384$  vs.  $H_a: p > 0.384$ . (b)  $\hat{p} = \frac{25}{40} = 0.625$ , and  $z = \frac{0.625 - 0.384}{\sqrt{(0.384)(0.616)/40}} = 3.13$ . (c) Reject  $H_0$

(because the P-value  $< 0.05$ );  $P = 0.0009$ . (d)  $SE_{\hat{p}} = \sqrt{\hat{p}(1 - \hat{p})/40} = \sqrt{(0.625)(0.375)/40} = 0.0765$ , so the 90% confidence interval is  $0.625 \pm (1.645)(0.0765)$ , or 0.4991 to 0.7509. Since this interval lies well above 0.384, there is strong evidence that Leroy has improved.