

## Testing hypotheses

Ex.) Is a coin "fair"?

Let  $p$  = population proportion of "heads" in my coin

Two hypotheses competing

null hypoth.  $\rightarrow H_0: p = 0.5$  (meaning of "fair" coin)

alternative hyp.  $\rightarrow H_a: p \neq 0.5$

Test using random sample

$n = 50$  (50 flips)

H H H T H T T H T T . . .

count heads: 21, say

sample proportion  $\hat{p} = \frac{21}{50} = 0.42$

test statistic

Is this notable  
for a fair coin?

Last week

- Built CI for  $p$
- called  $\hat{p}$  a "point estimate" of  $p$

This week

- When testing hypotheses statements for  $p$
- Call  $\hat{p}$  a "test statistic"

Answer comes via constructing a special sampling dist called a "null distribution"

- sampling dist for our test statistic
- takes our sample size into account
- takes our null hypothesis as true (hypothetically true)

P-value: relative freq. of seeing a result at least as extreme as our test statistic in a world where  $H_0$  holds true

In our case:  $\hat{p} = 0.42$  corresponds to

P-value of  $\sim 0.33$

Note: A P-value is a relative frequency, so lies between 0 and 1.

Note: The smaller the P-value, the stronger the evidence against  $H_0$  (in favor of  $H_a$ ).

Typically, one sets a threshold, called "significance level"  $\alpha$ , and require P to be smaller than  $\alpha$  before we are willing to reject  $H_0$  in favor of  $H_a$ .

Typical values used

$$\left. \begin{array}{l} \alpha = 0.1 \\ \rightarrow \alpha = 0.05 \\ \alpha = 0.01 \end{array} \right\} \begin{array}{l} \text{Require } P < \alpha \\ \text{in order to conclude} \\ H_0 \text{ is false, } H_a \text{ true.} \end{array}$$

In case of 50 flips of coin: P-value = 0.328

Not significant  
at any of these  
levels  $\alpha$

Say, when P not significant,

"Fail to reject  $H_0$ "

"My sample is consistent w/  $H_0$  being true"

Never say:  $H_0$  is true (can't be proven)

Ex. Quant. var.: body temperature

$H_0: \mu = 98.6$  ← "null value" is where null distribution should be centered

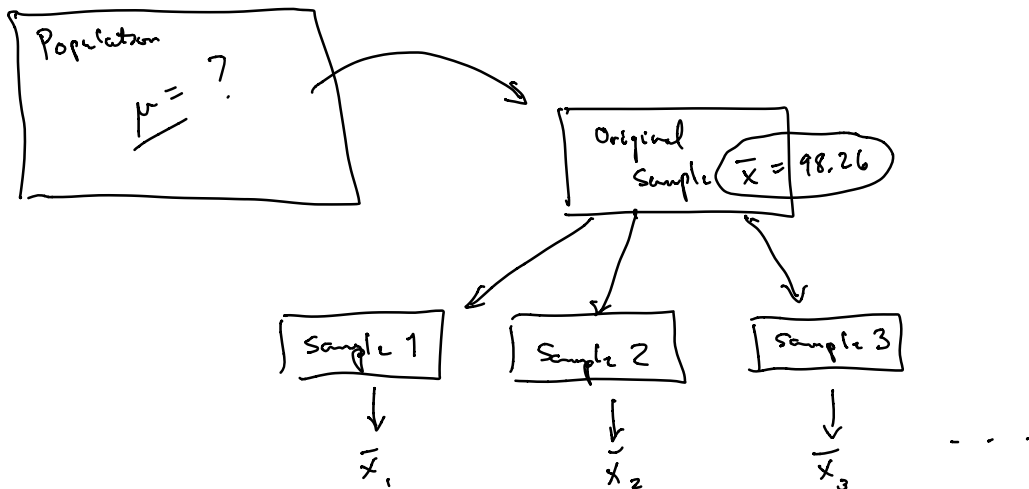
$H_a: \mu \neq 98.6$  (2-sided alt. hyp. — use both tails in null dist.)

Sample  $n = 50$

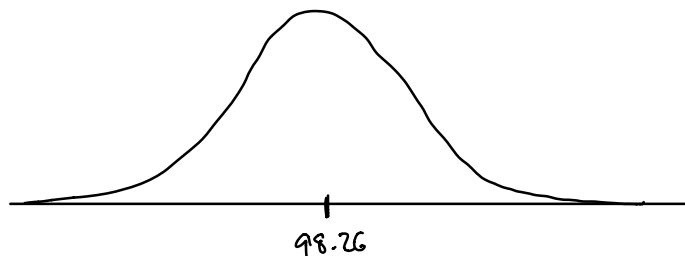
$\bar{x} = 98.26$  (test statistic)

Want null distribution - sampling dist for  $\bar{x}$  where  $H_0$  is true, and samples are of size 50.

Last week we bootstrapped

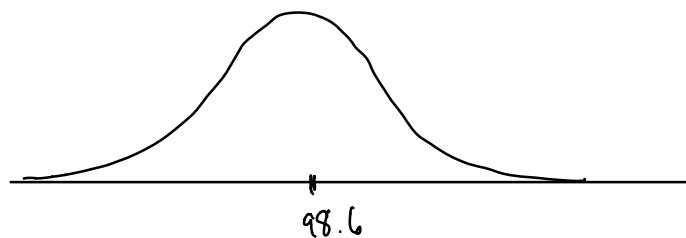


Bootstrap  
Distribution



Last week:  
great for  
CI const.

Get "randomization distribution" (an approximate null distribution) by sliding over so it is centered at null value



Examples above involve univariate data

1. Coin tosses, a categorical variable which is binary (2 values: H, T)
2. Body temperatures, a quantitative variable

Bivariate Scenarios (all have "apps" in the Randomization Hyp. Tests panel)

3. Explanatory variable: binary categorical (group-identifier var.)  
Response variable: quantitative

$$H_0: \mu_1 - \mu_2 = 0 \quad (\text{or } \mu_1 = \mu_2)$$

$$\text{test statistic: } \bar{x}_1 - \bar{x}_2$$

4. Explanatory variable and response var. are both binary categorical

$$H_0: p_1 - p_2 = 0 \quad (\text{or } p_1 = p_2)$$

$$\text{test statistic: } \hat{p}_1 - \hat{p}_2$$

5. Explanatory and response are both quantitative

$$H_0 \text{ can be either } \rho = 0 \quad (\text{true correlation is zero})$$

$$\text{or } \beta_1 = 0 \quad (\text{true regression line slope} = 0)$$

$$\text{test statistic is } r \text{ or } b, \text{ depending on which } H_0 \text{ used.}$$

In all of cases 3-5,

- the null hypothesis expresses "no association between vars"
- the alternative hypothesis, whether 1- or 2-sided, says "there is an association."