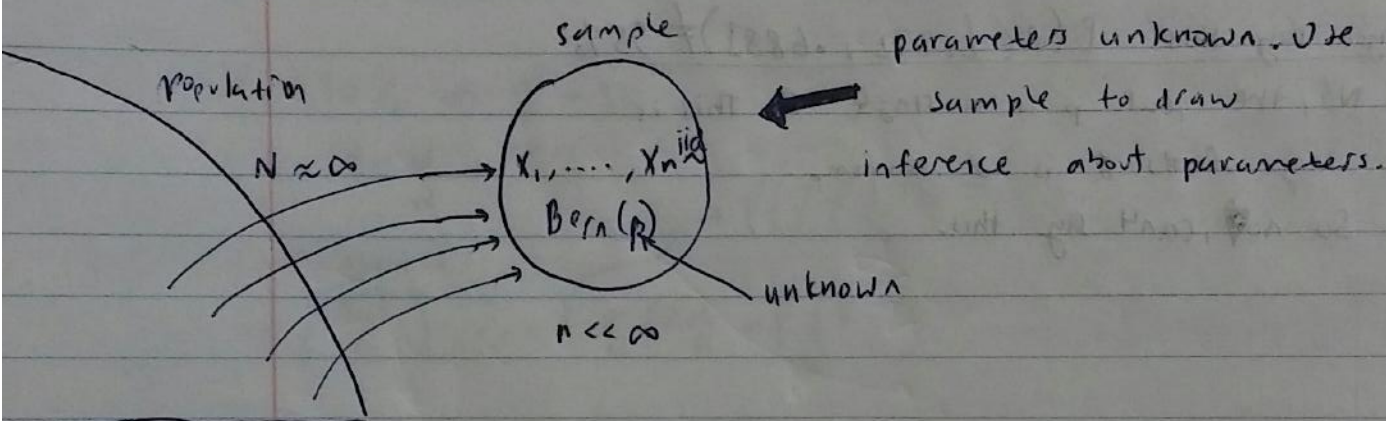


"Inverse Problem"



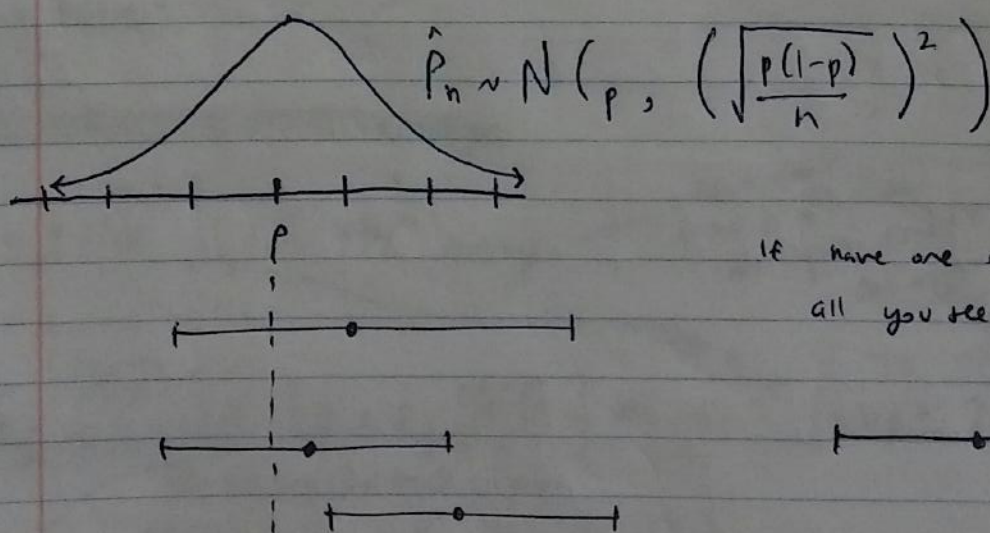
~~Statistical Inference~~

### • Statistical Inference

① Point estimation: Best guess:  $\hat{p}$  ← Not gonna do better than  $\hat{p}$

② Interval estimation:

→ Confidence Interval:  $CI_{1-\alpha, p} := \left[ \hat{p} \pm \frac{z_\alpha}{2} \sqrt{\frac{\hat{p}(1-\hat{p})}{n}} \right]$



If have one experiment,  
all you see is this:

→ Interpretation of CI (confidence intervals)

①  $\frac{\#\{p \in CI\}}{n} \xrightarrow{\text{"cover"}} 1-\alpha$



② Before experiment,  
 $P(p \in (I)) = 1 - \alpha$

③ If you believe in subjective probability (Bayesian), then under prior information, you can say  $P(p \in (I)) = 1 - \alpha$ .

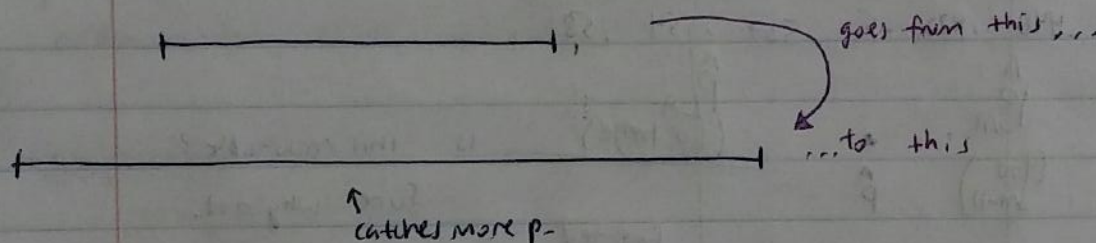
constant

$$P\left(p \in \left[\hat{p} \pm \frac{Z_{\alpha}}{2} \sqrt{\frac{\hat{p}(1-\hat{p})}{n}}\right]\right)$$

+ No help after done experiment b/c no r.v.  
 + Before, does help because  $\hat{p}$  replaced by r.v.

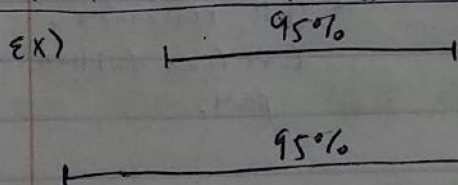
• If want greater ~~more~~ coverage, what can I do?

$$\alpha \downarrow \Rightarrow 1 - \alpha \uparrow \Rightarrow \frac{Z_{\alpha}}{2} \uparrow$$



However, if interval gets too big, usefulness goes down.

\* How can I make interval smaller, but keep usefulness same?



How do I do that?

↓

This will cost  
 $n$  going up, which  
 means more trials, which  
 means more work

more useful because the interval expands less, only focusing on areas close about it.

• Statistical Inference continued

③ Parameter Value Testing (Hypothesis testing)

\* Gender ratio in human births.  $\rightarrow p: = P(\text{Male})$

♥ His theory:  $p \neq 0.5$  i.e. unequal gender ratios. Crazy?  $\Rightarrow$  Yes

♥ Default / "null" hypothesis denoted:  $H_0: p = 0.5$

The crazy story is the alternate hypothesis

♥  $H_a: H_0$  is false:  $p \neq 0.5$



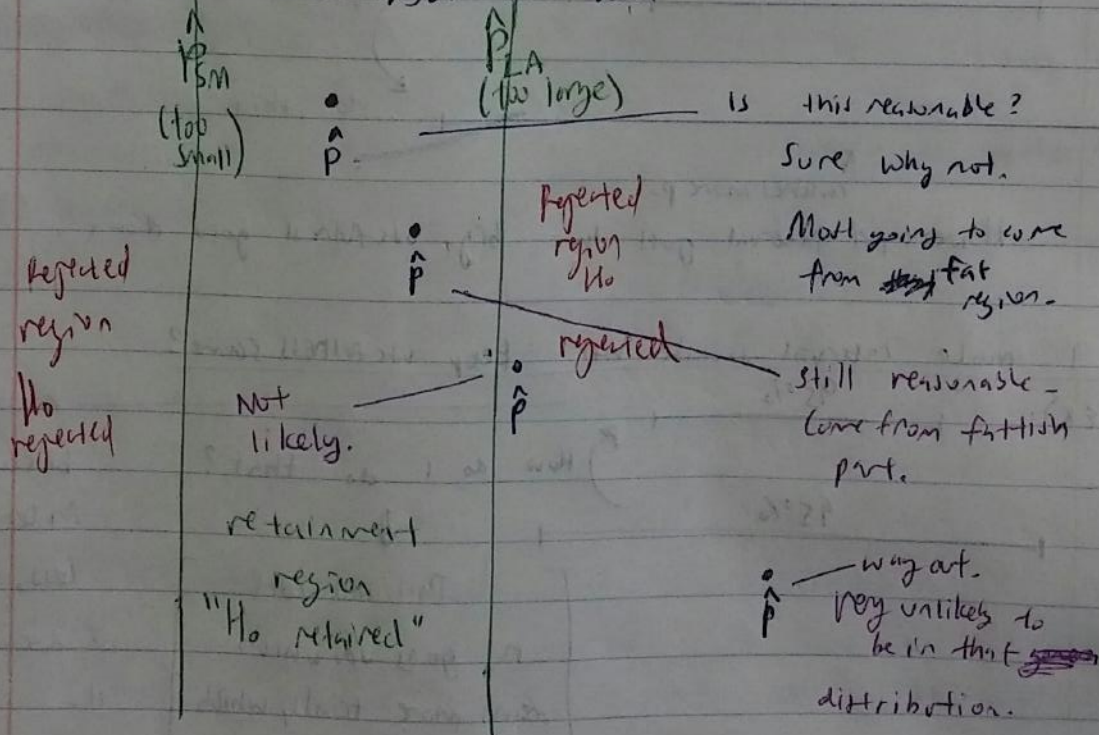
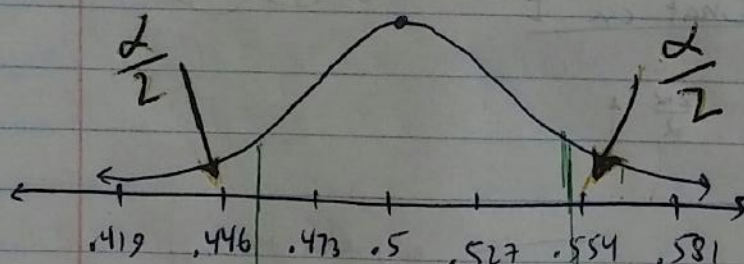
♥ Assume  $H_0$  is true

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

$\begin{matrix} \text{0.5} & \text{0.5} \\ \swarrow & \searrow \\ \text{0.5} & \end{matrix}$   
 $n=345$  would calculate to be .0269.

We take a sample of size  $n=345$ .

so we have  $\hat{p} \sim N(0.5, 0.0269^2)$



~~Let  $\alpha := P(\text{too rare})$ .~~

$1 - \alpha := P(H_0 \text{ retained})$

$= P(\hat{p} \in [\hat{p}_{\text{small}}, \hat{p}_{\text{large}}])$

$= P(\hat{p} \in [p \pm \text{margin}])$

$= P\left(\hat{p} \in \left[p \pm \frac{z_{\alpha/2}}{2} \sqrt{\frac{p(1-p)}{n}}\right]\right)$



~~Retainment region~~

$$\text{Retainment region} = \left[ p \pm \frac{z\alpha}{2} \sqrt{\frac{p(1-p)}{n}} \right]$$

$$\text{Rejection region} = \left[ p \pm \frac{z\alpha}{2} \sqrt{\frac{p(1-p)}{n}} \right]^c$$

We take a sample size of  $n=345$ . Calculate  $\hat{p}$ .

① If  $\hat{p} \in \text{Retainment region} \Rightarrow \text{Retain } H_0$ . We ~~do not~~ do not have sufficient evidence to reject null hypothesis.

② If  $\hat{p} \in \text{Rejection region} \Rightarrow \text{Reject } H_0$ . Also accept  $H_a$ . We have sufficient evidence to reject ~~the~~ the null hypothesis.

\* Experiment

$$n=345, \alpha = 5\%$$

$$\text{Retainment region} = \left[ 0.5 \pm 2 \sqrt{\frac{0.5(1-0.5)}{345}} \right] = [0.446, 0.554]$$

0.0269

If 169 babies were male  $\Rightarrow \hat{p} = \frac{169}{345} = 0.48 \in \text{Retainment region} \Rightarrow$

thus we do not have sufficient evidence to reject ~~the null hypothesis~~ human gender ratio equality.

### • 3 scenarios

① Flip a coin 100 times. You want to know if coin is fair.  $p = 0.5$

\* Scenario I: Get 51 heads. Fair?  $\Rightarrow$  Yes

\* Scenario II: Get 98 heads. Fair?  $\Rightarrow$  No because too far away from what you'd expect.

\* Scenario III: 61 heads. Fair?  $\Rightarrow$

$$H_0: p = 0.5$$

$$H_a: p \neq 0.5$$

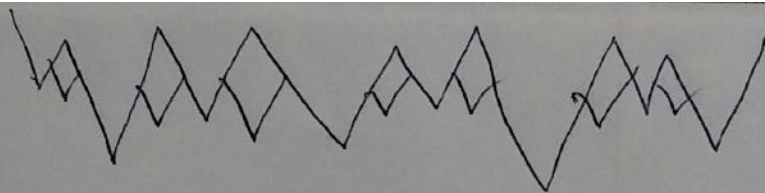
$$\alpha = 5\%$$

$$\text{Retainment range} = \left[ p \pm \frac{z\alpha}{2} \sqrt{\frac{p(1-p)}{n}} \right] = \left[ 0.5 \pm 2 \sqrt{\frac{0.5(1-0.5)}{100}} \right] = [0.4, 0.6]$$



Cheat sheet

$$\alpha = 5\% = 2$$
$$\alpha = 1\% = 2.84$$



Under scenario III:  $\hat{p} = \frac{61}{100} = 0.61$ . Is it in retainment region?  $\Rightarrow$  No, not in retainment region. Thus, reject  $H_0 \Rightarrow$  coin is not fair.

- Mars, a candy company, says that the proportion of blue M&M's is 20%. You think otherwise. (typical hypothesis test)

Let  $p := p(\text{Blue})$

$$H_0: p = 0.2 \quad \left. \begin{array}{l} \\ \end{array} \right\} \text{"two-sided test"}$$

$$H_a: p \neq 0.2$$

$n = 615$  M&M's

$\alpha = 1\% \leftarrow$  want to be sure Mars company is wrong

$$\text{Retainment region} := \left[ p \pm \frac{z_\alpha}{2} \sqrt{\frac{p(1-p)}{n}} \right]$$

$$= \left[ 0.2 \pm 2.84 \sqrt{\frac{(0.2)(1-0.2)}{615}} \right] = [0.1542, 0.2458]$$

$\uparrow$   
 $0.0458$

\* 158 blue m&m's

$$\hat{p} = \frac{158}{615} = 0.2569 \Rightarrow$$

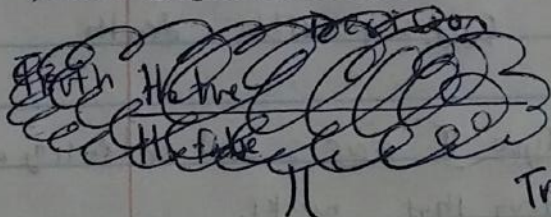
$\hat{p}$  is not inside the region. Not in the retainment region.

Reject  $H_0$ . The probability of blue M&M's is not 20%.



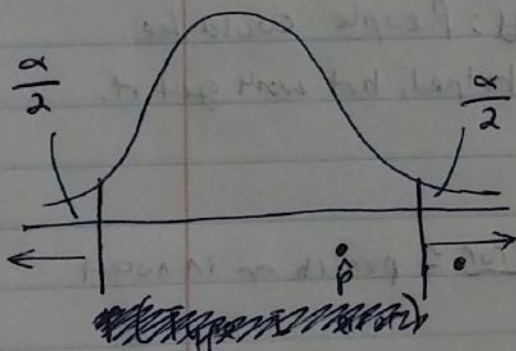
- <sup>given</sup>
- $\hat{p}$  is drawn from  $\hat{p} | H_0 \sim N(p, (\sqrt{\frac{p(1-p)}{n}})^2)$   
 $\rightarrow$  Is little  $\hat{p}$  a random distribution? : Yes

\* Mistakes could have made



Truth

	Decision	
	Retain $H_0$	Reject $H_0$
$H_0$ true	✓	Type I error
$H_0$ false	Type II error	✓



\* There are two different mistakes you can make. \*

\*  $P(\text{Type I error}) = \alpha$

$\rightarrow$  Type I error : reject even if true.

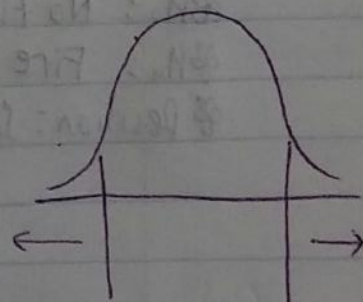
$\alpha$  is your choice. If you are skeptical person, will make  $\alpha$  really small.

\*  $P(\text{Type II error}) =$  beyond the scope of this class.

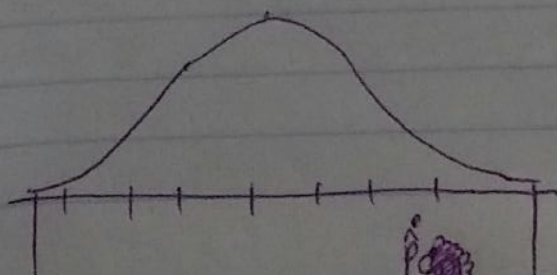
\*  $P(\text{Reject } H_0 | H_0 \text{ false}) = \text{POWER}$ .

•  $\alpha \uparrow \Rightarrow P(\text{Type I error}) \uparrow \Rightarrow P(\text{Type II error}) \downarrow$

going to make more rejections, more likely to think ~~is~~ Hypothesis is wrong.



•  $\alpha \downarrow \Rightarrow P(\text{Type I error}) \downarrow \Rightarrow P(\text{Type II error}) \uparrow$



### • 3 scenarios

#### \* Clinical trial

- ⊗  $H_0$ : drug doesn't work
- ⊗  $H_a$ : drug does work
- ⊗ Decision: release drug to market

\* Type I error: release a drug that does not work  
Cost: possible death

\* Type II error: Not releasing a drug that works.

Cost: People could be helped, but won't get it.

#### \* Court Case

- ⊗  $H_0$ : Not guilty
- ⊗  $H_a$ : Guilty
- ⊗ Decision: punish or not

\* Type I error: punish an innocent person

\* Type II error: let a guilty person go free.

#### \* Fire Alarm

- ⊗  $H_0$ : No fire
- ⊗  $H_a$ : Fire
- ⊗ Decision: set off alarm

\* Type I error: False alarm  
Cost: Waste time

\* Type II error: There's a fire, but no alarm.

Cost: someone dying

↳  $\alpha$  should be high.