

## A/B test.

- Can only test A or B, can't tell you what is missing.

- Need clear control. and clear metrics.

1. What A/B testing can do and can't do.

can't

- if too long or don't have data  
(buy a car, or refer)

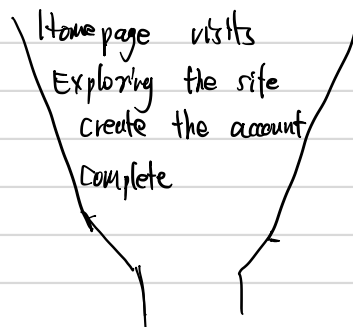
can do

- test layout: clear control, clear metrics

- Surprisingly emotional.

(New logo, needs long time to watch.)

- Customer funnel



- End to End.

1. Choose a metric

① Initial the hypothesis: 'changing the 'start now' button from orange to pink will increase the number of students exploring the site

② Refine the hypothesis:

- Which metric to use?

- X • Total number of courses completed : will take too much time to get a result

- X • Number of clicks : total number or fraction?

- number of clicks : click-through rate / CTR.  
number of page views.

- ✓ • unique visitors who click : click-through probability  
unique visitors to page

③ updated hypothesis: Change the 'start new' button from orange to pink will increase the click-through-probability of the button

### click-through-rate vs click-through-probability

- if want to measure the usability of the button, use .. rate  
because users have a variety of different places on the page that they can choose to click on and rate will show how often they actually find the button
- If you want to know how they would get into the next level, use .. probability.  
because you need to exclude the probability of double click, reload and so on

## 2. Review statistics

① which surprise you most? 150, 900.? why?

a. Binomial distribution:

• with mean =  $p$ , standard deviation =  $\sqrt{\frac{p(1-p)}{n}}$

When can use binomial

- 2 types of outcomes
- Independent.
- Identical distribution  
-  $p$  for all.

b. confidence interval

$$\hat{p} = \frac{\# \text{ of users who clicked}}{\# \text{ of users}} = \frac{100}{1000} = 0.1$$

$\Rightarrow N$

margin of error  
0.1

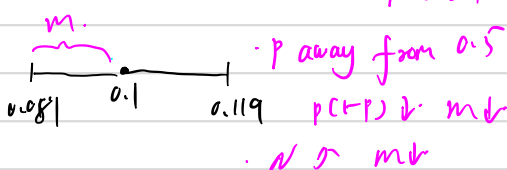
To use normal: check  $N \cdot \hat{p} > 5$  and  $N(1 - \hat{p}) > 5$

$$m = z^* SE$$

$$= z^* \times \sqrt{\frac{\hat{p}(1-\hat{p})}{N}}$$

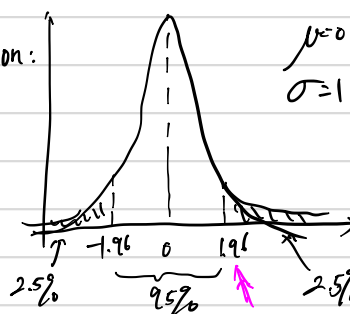
$$m = 0.019$$

$\Downarrow$



$z$ : confidence level, SE: standard error

$z$  distribution:



$\Rightarrow 1.96$  for 97.5%

$z$ -score 97.5%

two-tailed test  $\Rightarrow 99\% \rightarrow 1\% \rightarrow 0.5\% \rightarrow 99.5\% \Rightarrow z = 2.58$

ex:  $N=2000$ ,  $x=300$ . confidence level = 99%.

$$\hat{p} = \frac{300}{2000} = 0.15$$

$$m = 2.58 \times \sqrt{\frac{0.15 \times 0.85}{2000}} \approx 0.17$$

## ② Establish statistical Significance

Hypothesis testing: How likely it is that your results occurred by chance.

a. null hypothesis / baseline: no difference of probability between our experiment and control group

b. Alternative hypothesis:

⇓.

$p_{con}$        $p_{exp}$ .

a. Null hypothesis:  $p_{con} = p_{exp} \Rightarrow p_{con} - p_{exp} = 0$   
 $H_0$

b. Alternative hypothesis  $H_1$ :  $p_{con} \neq p_{exp} \Rightarrow p_{con} - p_{exp} \neq 0$

c. measure  $p_{con}$ , and  $p_{exp}$   
calculate  $P(\hat{p}_{exp} - \hat{p}_{con} | H_0) = \alpha$

d. reject null if  $\alpha$  is small enough  
 $\alpha$  is same type of significance threshold as a confidence interval  
reject null if  $\alpha < 0.05$