## 11.3) A/B Testing

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December 2019

## Reference

Tables, Graphics, and Figures from

## A/B Testing: The Most Powerful Way to Turn Clicks into Customers

Siroker & Koomen (2013)

Free via WSU Library:

https://wayne.skillport.com/skillportfe/assetSumma

### A/B Testing

From TIME to The Atlantic to Businessweek to Forbes: "2012 presidential campaign fundraising machines as being the most sophisticated, data-driven, and efficient organizations that politics had ever seen"

ECO 7100 Econometrics I





## $H_0$ : any video would lead more sign up than image

**Sam's Video**: compilation of some of the most powerful moments in Obama's speeches



### One Image and Button Combination

#### ORIGINAL



VARIATION



Sign up Rate \( \psi \) 40.6%

- = 2.8M e-mail subscribers
  - + 288,000 volunteers
    - + \$57M in donations

#### Sequential Design



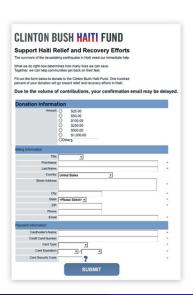


6/18

Donation amount should come first, then personal information, then billing, and occupation/employer lasts

5% conversion increase

## $H_0$ : image of earthquake victims $\rightarrow$ + donations



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#### Confound: image pushed down the form



## + \$1M in donations

#### Less is More

#### ORIGINAL



#### VARIATION

	First Name:
	Last Name:
United States	Country:
	Street Address:
	City:
<please select=""> ▼</please>	State:
	ZIP:
	Email:

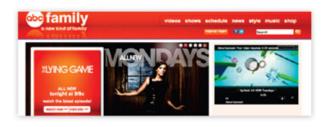
## + 11% in U\$ per pageview

#### **Call to Action**



+ million dollars

#### Disney expected a lift of 10 to 20%





Result: + 600% clicks

4 D > 4 B > 4 B > 4 B >

#### $H_0$ : people read from left to right

#### ORIGINAL



#### VARIATION



# Middle block most clicked regardless of content

## $H_0$ : unlimited training subscription o + training

Lumosity's scientists recommend that users train for 15 to 20 minutes a day, 4 to 5 times per week

Users stay logged in for many hours, but frequency of logins decline



#### "You're done. You can leave the site now"



# People were training more as a result of being limited

# Most liked comment: "New Netflix interface is complete crap"

#### ORIGINAL



#### VARIATION



Retention ↑ by 20 to 55 bp Engagement ↑ by 30 to 140 bp

# Original Wikipedia (\$5, \$20, \$50, or whatever you can) vs "five dollars" banner variation



Average donation↓ by 29% Rate of donation ↑ by 80% Net Revenue ↑ by 88%

#### **Geo-Targeting, State by State: Romney 2012**



Visitors entered email and zip code + 19% But personalization doesn't work for Wikipedia

### Anchoring in Action: Judy's Book Club



Free listing column increases clicks on basic paid listing by 198.6%