



# Avoiding Common Pitfalls in Conjoint Analysis





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# ABOUT ME



## Section 1

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# **SURVEY DESIGN PITFALLS**



# Backwards Marketing Research

- ▶ 1985 Harvard Business Review article by Alan Andreasen
  - <https://hbr.org/1985/05/backward-market-research>
- ▶ “Here are some things I don’t know. When the results come in, I’ll know more. And when I know more, then I can figure out what to do.”
- ▶ “The research mostly told me things I already knew”
  - Brand preference
  - Price importance
  - Segmentation
  - Demographics



# Backwards Marketing Research

- ▶ Begin with the end in mind
- ▶ Think about your simulations
- ▶ Can you come up with one-sentence questions the conjoint exercise is going to answer and how you will answer them?
  - ~~“We want to figure out which features are important to our customers, what they are willing to pay for them”~~



# Backwards Marketing Research

- ▶ “We want to figure out which features are important to our customers, and what they are willing to pay for them”
- ▶ We want to figure out which features are important to our customers, **so we are including features X/Y/Z as binary attributes so we can modify each feature independently and observe how demand changes**
- ▶ We want to investigate willingness to pay, **so we are going to to test +/- 20% price, allow all features to show up with each brand, and then see what kind of trade-offs people are willing to make**



# The Goal of a Conjoint Analysis

- ▶ Build a generalized model of preference that fits a series of choices/ratings/rankings provided by a respondent
- ▶ Too many people approach conjoint analysis as product testing
  - Prohibitions
  - Complicated pricing
  - Not including proper competition or proper “none” choice



# The Goal of a Conjoint Analysis

- ▶ Conjoint exercise builds the generalizable model
- ▶ Market Simulators make predictions of specific scenarios (here's where the product testing comes in)



# Conjoint Design

- ▶ Keep it simple!
- ▶ Attributes and levels need to be mutually exclusive
- ▶ Better data on fewer price points is probably better



## Section 2

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# TESTING PITFALLS

# Test Your Survey!



Created by Makyzz - Freepik.com

# Test Your Survey!

- ▶ Test your survey yourself!
- ▶ Have someone not familiar with the project test your survey
- ▶ Mturk?
- ▶ Run through all the analysis with test data
- ▶ Run some simulations with test models



## Section 3

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# ANALYSIS PITFALLS

# Average Utilities and Importances

- ▶ Averages can be misleading



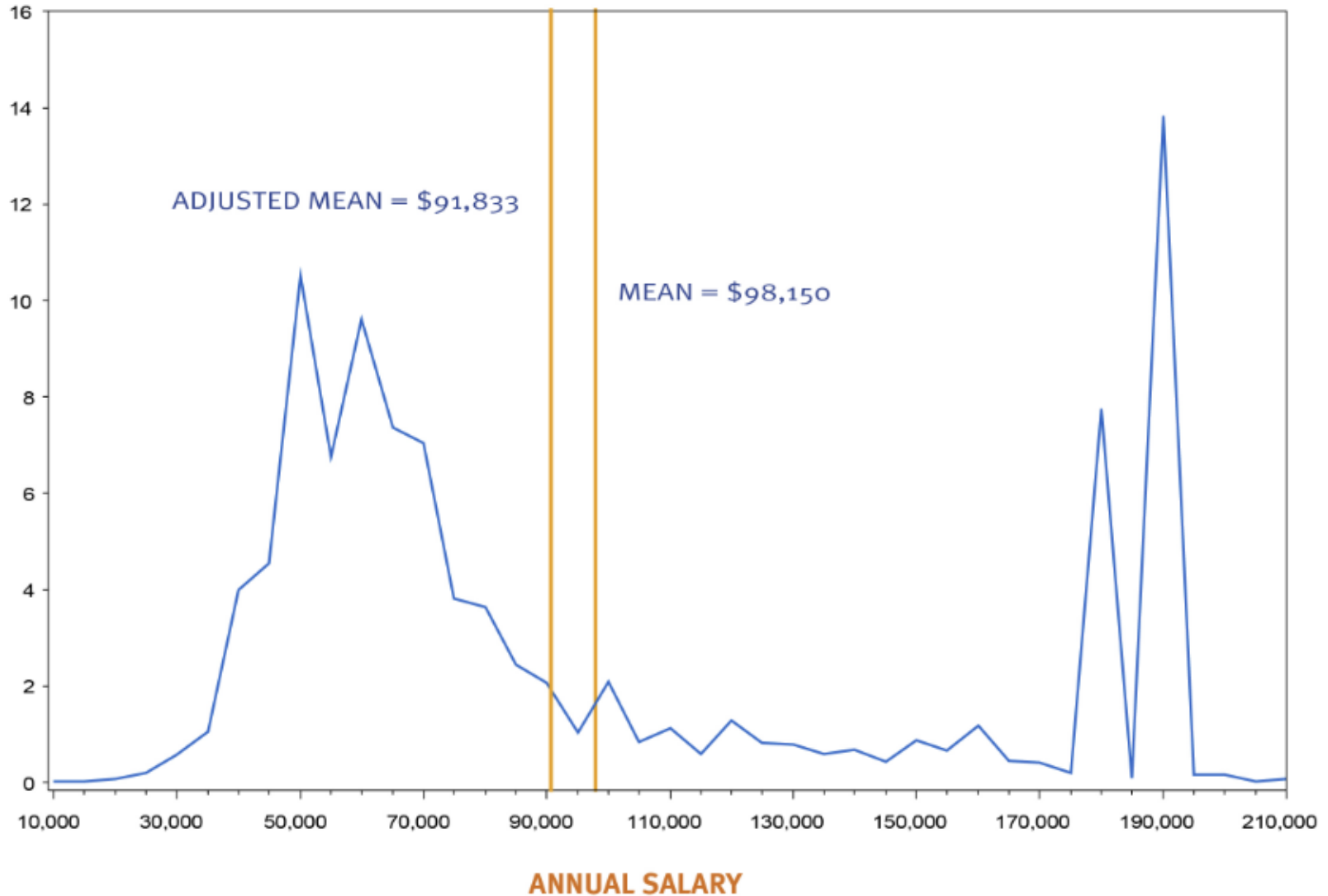
# Average Starting Salary Law School Graduates 2018

\$98,150





# Average Starting Salary Law School Graduates 2018







# Average Utilities and Importances

Assume a situation where your population consists of opposites

	Prefer Coke	Prefer Pepsi
Coke	90	-100
Pepsi	-100	90
Sprite	10	10

Survey 50 people from each group  
Calculate average utilities...

Level	Average Utility
Coke	-5
Pepsi	-5
Sprite	10

# Design Repercussions Flow Into Analysis

- ▶ Brian would love to drive a Tesla
- ▶ Conjoint design reflects realistic pricing for Tesla
- ▶ Brian does not choose Tesla in the survey 😞
- ▶ How does the software model Brian's preference for Tesla?

# Design Repercussions Flow Into Analysis

- ▶ Brian likes Tesla
  
- ▶ Conjoint design reflects appropriate pricing through prohibitions
  - Price: \$25,000, \$35,000, \$55,000, \$75,000, \$85,000
  - Toyota shows at Prices 1-3, Tesla shows at prices 3-5
  
- ▶ Brian chooses Tesla often 😊
  
- ▶ How does the software model my preference on Price?



## Section 4

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# **MARKET SIMULATORS**



## Section 4

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**MARKET  
SIMULATORS  
ARE AWESOME**

# Why Conduct Market Simulations?

- ▶ Simulations better reflect real-world behavior
  - Represent idiosyncratic preferences of segments and individuals (remember, you don't have to appeal to the “fat” part of the market to carve out a profitable business)
- ▶ A “choice laboratory” for testing multitude of real-world possibilities
- ▶ Results expressed in terms that make sense to management and are actionable



# Why Conduct Market Simulations?

- ▶ At what price do people switch to a competitor?
- ▶ Will new product cannibalize our own sales?
- ▶ Should we launch a high-end product or a budget model?
- ▶ How much more price sensitive are people this year than last?
- ▶ Is adding feature X worth it?

# Conjoint Market Simulation Assumptions

- ▶ We have interviewed the right people
- ▶ Each person is in the market to buy
- ▶ We've used a proper measurement technique
- ▶ Respondents have answered reliably and truthfully
- ▶ All attributes that affect buyer choices in the real world have been accounted for





# More Conjoint Market Simulation Assumptions

- ▶ Equal availability (distribution)
- ▶ Respondents are aware of all products
- ▶ Long-range equilibrium (equal time on market)
- ▶ Equal effectiveness of sales force
- ▶ No out-of-stock conditions



# Market Simulators

- ▶ Not crystal balls!
- ▶ Still useful!
- ▶ Recognize weaknesses
- ▶ Shore up those weaknesses?

# External Effects

- ▶ How we tap into that “other stuff”



# Adjusting for Distribution

- ▶ **Good**
  - Respondent steps into “the market” each shopping trip and sees different products on “the shelf”
- ▶ **Better**
  - Respondents have a probability to walk into a specific store each shopping trip, each store has different products for sale
- ▶ **Best**
  - Each respondent has individual store visit probabilities based on survey data, each store has different products for sale

# Adjusting for Awareness

- ▶ Typically done based on a survey question
  - Which of these brands would you consider?
  - Which of these brands have you heard of?
- ▶ Awareness adjustment effectively removes the product from an individual's choice set



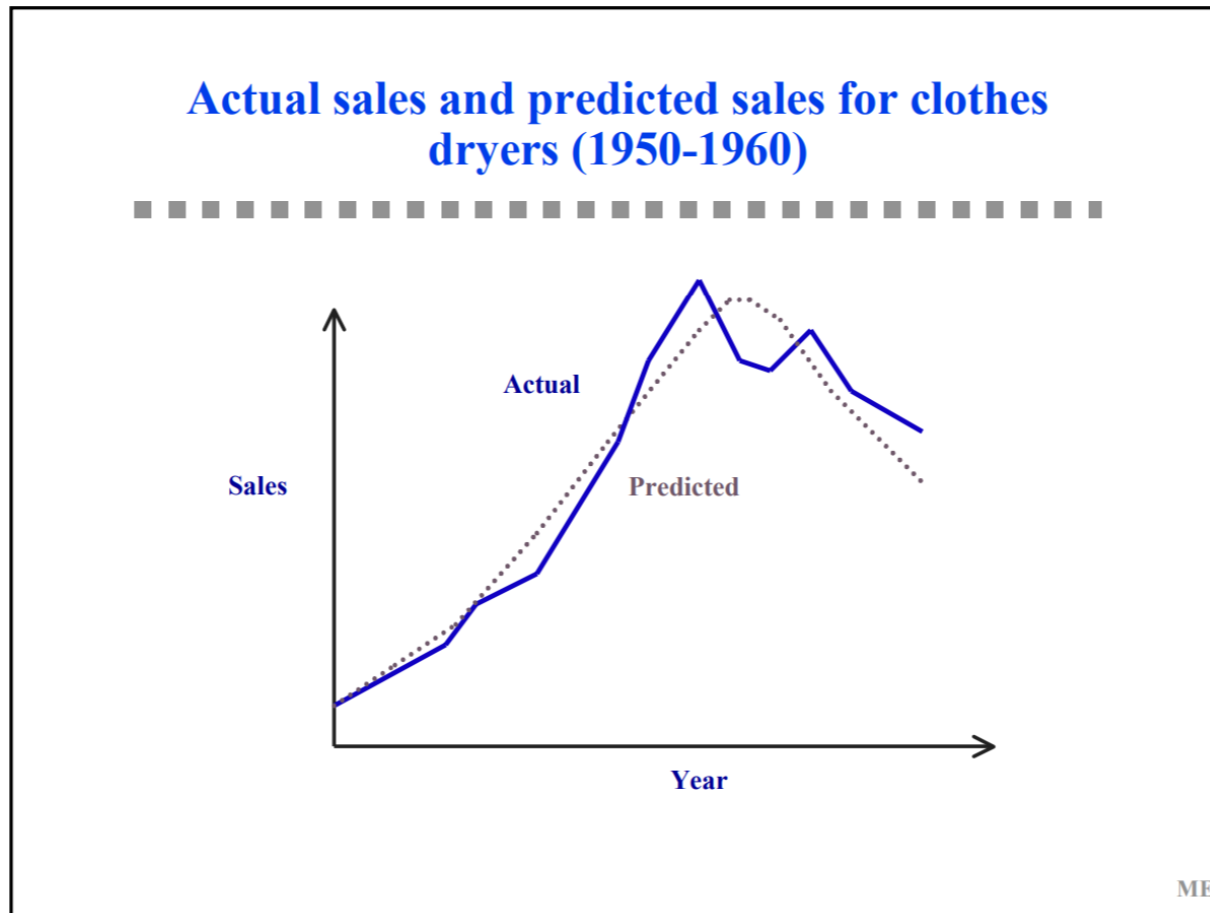
# Other Adjustments?

- ▶ Top N simulation assumes people don't really consider all of the options in a simulation

Product Label	Utility	Traditional Share of Preference	Top 3 Share of Preference
Product 1	2.36	52.8	54.2
Product 2	1.98	36.1	37.1
Product 3	0.53	8.5	8.7
Product 4	-1.24	1.4	0.0
Product 5	-1.48	1.1	0.0
	Total:	100.0	100.0

# Other Adjustments?

- ▶ Bass diffusion model?





## Section 5

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**ASK QUESTIONS!**



# Thanks for attending!



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