

# Discussion: Conjoint Controversy

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# What Is the Controversy All About?

- Average Marginal Component Effect (AMCE)

$$\mathbb{E}\{Y_i([1BC], [A'B'C']) - Y_i([0BC], [A'B'C'])\}$$

Average difference in the probability of choosing candidate  $ABC$  over candidate  $A'B'C'$  when changing  $A$  from 0 to 1

- Abramson, Kocak, and Magazinnik (AKM)

- 1 AMCE does not reflect majority preferences
- 2 AMCE combines direction and intensity of preferences

- majority prefers Male over Female regardless of party (Democrat and Republican)

- AMCE (Male vs. Female) < 0

- V1 – V3 care more about party
- V4 – V5 care more about gender

| Rank | V1        | V2        | V3        | V4        | V5        |
|------|-----------|-----------|-----------|-----------|-----------|
| 1.   | <i>MR</i> | <i>MR</i> | <i>MR</i> | <i>FD</i> | <i>FD</i> |
| 2.   | <i>FR</i> | <i>FR</i> | <i>FR</i> | <i>FR</i> | <i>FR</i> |
| 3.   | <i>MD</i> | <i>MD</i> | <i>MD</i> | <i>MD</i> | <i>MD</i> |
| 4.   | <i>FD</i> | <i>FD</i> | <i>FD</i> | <i>MR</i> | <i>MR</i> |

TABLE 2—PREFERENCES OVER CANDIDATE PROFILES

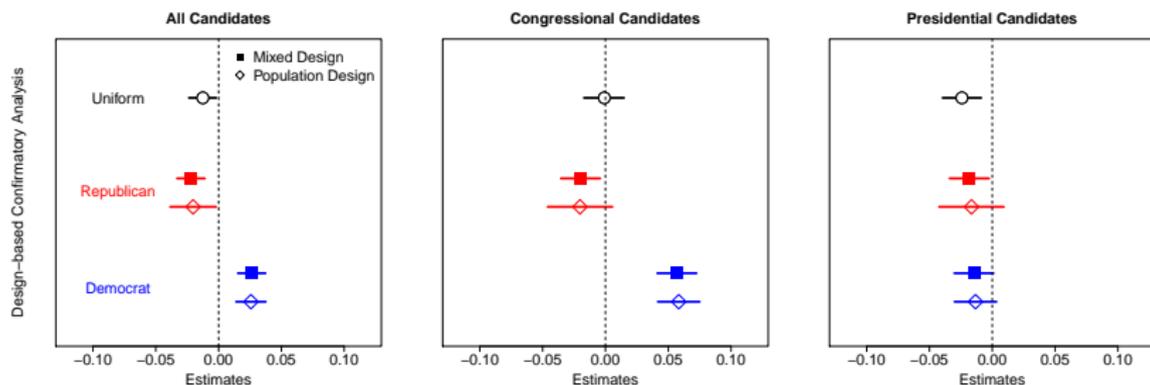
- Two interpretations of the AMCE
  - 1 AMCE as an average rank = Borda rule (AKM)
  - 2 AMCE as an average difference in voteshare  $\rightsquigarrow$  original interpretation
  
- All of these claims are true:
  - No disagreement on what AMCE is and is not
  - Disagreement is about whether AMCE is useful for electoral studies

# AMCE is Based on Averages

- Three averages define the AMCE

$$\mathbb{E}\{Y_i([1BC], [A'B'C']) - Y_i([0BC], [A'B'C'])\}$$

- 1 other attributes of one's own  $BC$
  - 2 attributes of one's opponent  $A'B'C'$
  - 3 respondents  $Y_i([abc], [a'b'c'])$
- Choice of **profile distributions** matter (de la Cuesta, Egami & Imai, in-press)



- Do not use uniform distributions without justification!

# Interactions, Interactions, Interactions

- Conjoint is all about interactions
  - no interaction  $\rightsquigarrow$  “Do you prefer male or female candidates?”
  - taste-based vs. statistical discrimination
- Two kinds of interactions may interact: attributes and respondent characteristics
- If there is no interaction,
  - ACME is invariant to the profile distributions
  - No disagreement between AKM and BHHY
- BHHK: “Beyond AMCEs”
  - 1 Probability of winning for a candidate with  $A = a$ :  
$$\mathbb{E}[1_{\{\mathbb{E}_Y[Y_i([aBC], [A'B'C'])] > 0.5\}}]$$
  - 2 Fraction of voters preferring a candidate with  $A = a$ :  
$$\mathbb{E}_Y[1_{\{\mathbb{E}[Y_i([aBC], [A'B'C'])] > 0.5\}}] \neq \mathbb{E}_Y[1_{\{\mathbb{E}[Y_i([aBC], [ABC])] > 0.5\}}]$$
- AKM+S estimates the 2nd quantity (AFCP) using machine learning
- Both of these quantities require modeling of preferences

# Modeling Multidimensional Preferences

- (Saturated) Random utility model:  $U_i(abc) \sim a * b * c$
- With a typical sample size, three-way or higher order interactions can be ignored
- ANOVA with sum-to-zero constraints

$$U_i(ABC) = \mu + \sum_a \beta_a \mathbf{1}_{\{A=a\}} + \sum_b \beta_b \mathbf{1}_{\{B=b\}} + \sum_c \beta_c \mathbf{1}_{\{C=c\}} + \\ \sum_{ab} \beta_{ab} \mathbf{1}_{\{A=a, B=b\}} + \sum_{bc} \beta_{bc} \mathbf{1}_{\{B=b, C=c\}} + \sum_{ca} \beta_{ca} \mathbf{1}_{\{A=a, C=c\}} + \epsilon_i(ABC)$$

where, for example,  $\beta_a$  is AMCE and  $\beta_{ab}$  is AMIE

- Forced choice:

$$Y_i([ABC], [A'B'C']) \\ = \mathbf{1}_{\{U_i(ABC) > U_i(A'B'C')\}} \\ = \mathbf{1}_{\{\sum_a \beta_a [\mathbf{1}_{\{A=a\}} - \mathbf{1}_{\{A'=a\}}] + \dots + \sum_{ab} \beta_{ab} [\mathbf{1}_{\{A=a, B=b\}} - \mathbf{1}_{\{A'=a, B'=b\}}] + \dots + \epsilon_i^* > 0\}}$$

- Linear probability, logistic regression models with regularization

# Concluding Remarks

- The debate between AKM and BHHY has clarified:
  - ① What AMCE is and is not
  - ② Importance of profile distributions and interactions
  - ③ Potential roles of alternative quantities of interest
  - ④ Use of machine learning for modeling multidimensional preferences
- The only disagreement is NOT methodological:
  - Which quantity of interest is more appropriate?
  - Must be judged for a given application
- Future research of interest
  - Estimation of heterogeneous preferences (initiated by AMK+S)
  - Hypothesis testing using machine learning