

USING INFERRED VALUATION TO DISENTANGLE RESPONSE BIASES IN STATED PREFERENCE DISCRETE CHOICE EXPERIMENTS

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Stated preference discrete choice experiments

- Many advantages:
 - Capture use and passive-use values (e.g., existence value)
 - Go beyond the scope of the existing data
 - Provide relatively clean identification of policy effects, values of separate attributes of the goods
- But also disadvantages:
 - Not based on market behavior = subject to various **survey response biases**
 - May be viewed as not related to direct consequences – **hypothetical bias**
 - May encourage respondents to answer in a manner to appear better and be positively viewed by others – **social desirability bias / warm glow**
 - May encourage **strategic responses** to affect the actual outcome
 - ...

Inferred (indirect) valuation

Lusk and Norwood (2009)

- Instead of directly asking: Which good do you prefer the most?
The inferred valuation asks indirectly: Which good does the population prefer the most?
- Alleviate hypothetical bias, particularly, resulting from social desirability bias?
- Some evidence from the growing literature in psychology and an indirect questioning approach developed and tested by Fisher (1993)

Inferred (indirect) valuation


Lusk and Norwood (2009)

- Theoretical model in brief
- A utility function involves two components:
 1. standard indirect utility V , which depends on wealth and provision of a good, and
 2. morality M , which depends on honesty and fulfilling social norms
- A respondent may gain utility from the value of a good (captured in V) but also from the act of saying they will pay for the good (captured in M)
- For inferred valuation (expected preferences of others), $M=0$ (no extra utility from declaring noble intentions)

How does inferred valuation perform for various preference elicitation formats?

- Lusk and Norwood (2009): “One of the key advantages of inferred valuation is that the theory underpinning the methodology **does not depend on a particular elicitation format** or type of good. Inferred valuation [...] **can be applied with any elicitation format** and for public and private goods.”
- Various studies have applied the inferred valuation but, to our knowledge, none of them has examined the method across varying elicitation formats

1. We study the inferred valuation in a discrete choice experiment, upon varying the number of choice alternatives: 2, 3 and 4
2. For each number of choice alternatives, we compare the inferred values with the values elicited in a traditional (direct) way



6 split-sample
preference elicitations

What response biases/effects can affect value estimates in our study?

| | 2 choice alternatives | 3 and 4 choice alternatives |
|--------------------|--|---|
| Inferred valuation | True value | True value + number-of-alternatives related effects (e.g., complexity, preference matching) |
| Direct valuation | True value + social desirability bias | True value + social desirability bias + number-of-alternatives related effects (e.g., complexity, preference matching) + strategic responding |

As everyone faced a sequence of choice tasks, we assume that anchoring and sequencing effects do not differ across the elicitation formats.

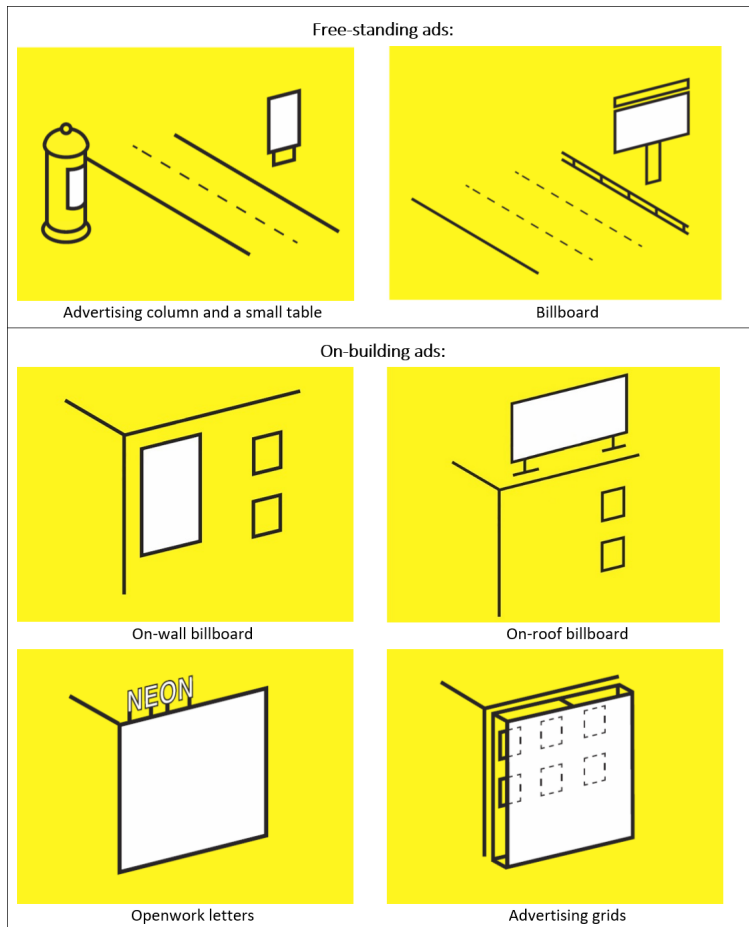
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We aim to contribute to understanding how these response effects affect discrete choice value estimates

Empirical data

Czajkowski et al. (forthcoming). Valuing externalities of outdoor advertising in an urban setting - the case of Warsaw. Journal of Urban Economics.



- Discrete choice experiment (DCE) to elicit residents' preferences towards reducing outdoor advertisement in Warsaw, Poland
- Motivated by the "Landscape Bill" in Poland, which granted local governments a law to impose local regulations on outdoor advertising

| Attributes | Attribute levels |
|--|--|
| Free-standing advertising | 100% (no change) 75% (small reduction) 50% (medium reduction) 25% (large reduction) 0% (ban) |
| On-buildings advertising | 100% (no change) 75% (small reduction) 50% (medium reduction) 25% (large reduction) 0% (ban) |
| Annual cost for respondent's household | 0 (no change), 10, 25, 50, 75, 100, 200 PLN |

Administration of the study and example of a choice card

- 12 choice tasks per respondent, 2,3 or 4 alternatives per choice task
- CAWI-based, December 2017 to January 2018
- Representative sample of 1250 adult inhabitants of Warsaw
- Response rate 48.7%

| Choice situation 1 | Alternative A (Status quo) | Alternative B | Alternative C |
|--------------------------------|-------------------------------|---------------------------|--------------------------|
| Free-standing advertising | 100% (no change) | 50% (medium reduction) | 75% (small reduction) |
| On-buildings advertising | 100% (no change) | 0% (ban) | 25% (large reduction) |
| Annual cost for your household | 0 PLN (no change) | 25 PLN | 50 PLN |
| <u>Your choice:</u> | <input type="checkbox"/> | <input type="checkbox"/> | <input type="checkbox"/> |

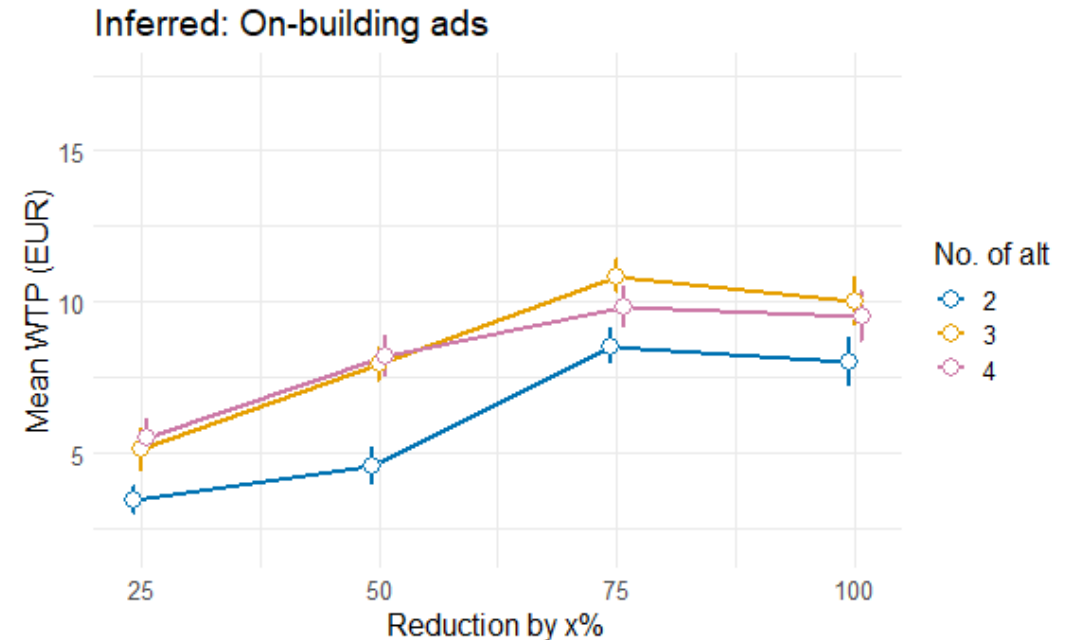
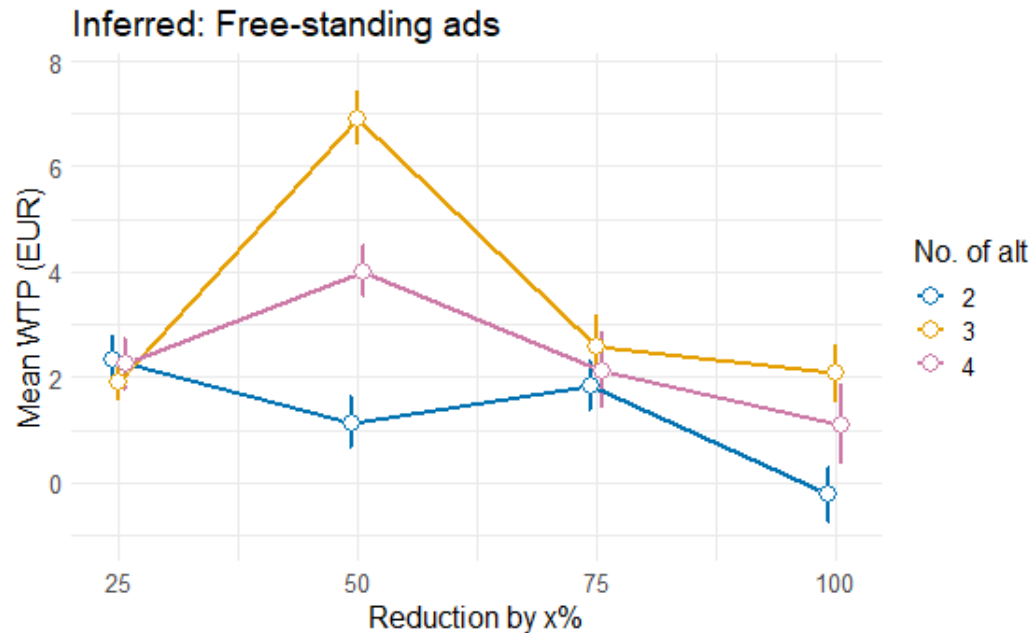
Empirical data – treatments

- Two series of choice tasks in the DCE:
 - Direct valuation: Choose the best alternative for your household (a series of 12 tasks)
 - Inferred valuation: Choose the alternative that you think is most preferred by Warsaw residents (a series of 6 tasks)
- We rotated the order of the two series
Here, we use data only from the series displayed first
- Three treatments varying the number of choice alternatives: 2, 3 and 4
- In brief: 2 x 3 split-sample design

Econometric approach

- Two separate mixed (random-parameter) logit models: one for inferred valuation and one for direct valuation
- Heterogeneous preferences described by continuous distributions of the parameters on choice attributes – all normal, except for the log-normal cost
- All preference parameters interacted with 3- and 4-alternative elicitations
- Willingness-to-pay (WTP) space – parameters represent WTP in EUR per year
- Maximum likelihood method; 4,000 scrambled Sobol draws

Results: Inferred values across various elicitation formats



Compared to the 2-alternative elicitation, in 3- and 4-alternative elicitations:

- WTP is statistically higher, except for two levels of free-standing ads
- WTP for avoiding status quo is significantly higher
- WTP values are more similar (not statistically different for all but one cases)

Results: Inferred values across various elicitation formats

- These results signal some significant effects tied to the number of choice alternatives e.g., increased complexity, improved preference matching upon more alternatives
- These differences are NOT related to strategic responses – no incentive for a strategic response when asked about others' preferences
- Inferred valuation does not generate the same value estimates for different numbers of choice alternatives, evidencing that the method is not free from some behavioral effects

Compared to the 2-alternative elicitation, in 3- and 4-alternative elicitations:

- WTP is statistically higher, except for two levels of free-standing ads
- WTP for avoiding status quo is significantly higher
- WTP values are more similar (not statistically different for all but one cases)

Results: Inferred versus direct values

WTP estimates

| | 2 alt. inferred | 2 alt. direct | 3 alt. inferred | 3 alt. direct | 4 alt. inferred | 4 alt. direct |
|---------------------|--------------------|------------------|--------------------|------------------|--------------------|------------------|
| Status quo | -3.3 | -6.5 | -5.3 | -6.1 | -6.0 | -8.0 |
| Free-standing -25% | 2.3 | 1.9 | 1.9 | 2.4 | 2.2 | 2.9 |
| Free-standing -50% | 1.1 | 1.6 | 6.9 | 2.7 | 4.0 | 5.2 |
| Free-standing -75% | 1.8 | 3.7 | 2.6 | 2.6 | 2.1 | 5.7 |
| Free-standing -100% | -0.2 | 3.5 | 2.1 | 1.0 | 1.1 | 2.5 |
| On-building -25% | 3.4 | 4.3 | 5.1 | 5.4 | 5.5 | 8.1 |
| On-building -50% | 4.6 | 5.2 | 7.9 | 9.7 | 8.2 | 13.7 |
| On-building -75% | 8.5 | 5.8 | 10.9 | 8.6 | 9.8 | 14.3 |
| On-building -100% | 8.0 | 7.4 | 10.0 | 9.6 | 9.5 | 15.0 |

Results: Inferred versus direct values

| | 2 alt. | 3 and 4 alt. |
|-----------------|--|--|
| Inferred | True value | True value + number-of-alternatives related effects (e.g., complexity, preference matching) |
| Direct | True value + social desirability bias | True value + social desirability bias + number-of-alternatives related effects (e.g., complexity, preference matching) + strategic responding |

WTP estimates

WTP inferred – WTP direct

| | 2 alt. inferred | 2 alt. direct | 3 alt. Inferred | 3 alt. direct | 4 alt. inferred | 4 alt. direct |
|---------------------|-----------------|---------------|-----------------|---------------|-----------------|---------------|
| Status quo | -3.3 | -6.5 | -5.3 | -6.1 | -6.0 | -8.0 |
| Free-standing -25% | 2.3 | 1.9 | 1.9 | 2.4 | 2.2 | 2.9 |
| Free-standing -50% | 1.1 | 1.6 | 6.9 | 2.7 | 4.0 | 5.2 |
| Free-standing -75% | 1.8 | 3.7 | 2.6 | 2.6 | 2.1 | 5.7 |
| Free-standing -100% | -0.2 | 3.5 | 2.1 | 1.0 | 1.1 | 2.5 |
| On-building -25% | 3.4 | 4.3 | 5.1 | 5.4 | 5.5 | 8.1 |
| On-building -50% | 4.6 | 5.2 | 7.9 | 9.7 | 8.2 | 13.7 |
| On-building -75% | 8.5 | 5.8 | 10.9 | 8.6 | 9.8 | 14.3 |
| On-building -100% | 8.0 | 7.4 | 10.0 | 9.6 | 9.5 | 15.0 |
| Status quo | 3.1 | ** | 0.7 | | 2.0 | ** |
| Free-standing -25% | 0.5 | | -0.5 | | -0.7 | |
| Free-standing -50% | -0.5 | | 4.2 | ** | -1.2 | |
| Free-standing -75% | -1.8 | | 0.0 | | -3.5 | ** |
| Free-standing -100% | -3.7 | ** | 1.1 | | -1.4 | |
| On-building -25% | -0.9 | | -0.3 | | -2.6 | ** |
| On-building -50% | -0.6 | | -1.8 | ** | -5.5 | ** |
| On-building -75% | 2.8 | ** | 2.3 | ** | -4.5 | ** |
| On-building -100% | 0.6 | | 0.4 | | -5.5 | ** |

Results: Inferred versus direct values

2 alternatives:

- Direct WTP is statistically higher for avoiding status quo and banning free-standing advertisement, suggesting positive social desirability bias in direct valuation
- The effect is less clear for 75% reduction in on-building advertisement

3 and 4 alternatives:

- The estimates may include both effects: social desirability and strategic responding
- The estimates in 4 alternatives are in line with predictions based on social desirability bias
- The results in 3 alternatives are much less straightforward – perhaps affected by strategic response considerations

| | 2 alt. inferred | 2 alt. direct | 3 alt. inferred | 3 alt. direct | 4 alt. inferred | 4 alt. direct | |
|---------------------------|---------------------|------------------|--------------------|------------------|--------------------|------------------|------|
| WTP estimates | Status quo | -3.3 | -6.5 | -5.3 | -6.1 | -6.0 | -8.0 |
| | Free-standing -25% | 2.3 | 1.9 | 1.9 | 2.4 | 2.2 | 2.9 |
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| | On-building -100% | 8.0 | 7.4 | 10.0 | 9.6 | 9.5 | 15.0 |
| WTP inferred – WTP direct | Status quo | 3.1 | ** | 0.7 | | 2.0 | ** |
| | Free-standing -25% | 0.5 | | -0.5 | | -0.7 | |
| | Free-standing -50% | -0.5 | | 4.2 | ** | -1.2 | |
| | Free-standing -75% | -1.8 | | 0.0 | | -3.5 | ** |
| | Free-standing -100% | -3.7 | ** | 1.1 | | -1.4 | |
| | On-building -25% | -0.9 | | -0.3 | | -2.6 | ** |
| | On-building -50% | -0.6 | | -1.8 | ** | -5.5 | ** |
| | On-building -75% | 2.8 | ** | 2.3 | ** | -4.5 | ** |
| | On-building -100% | 0.6 | | 0.4 | | -5.5 | ** |

Results: Inferred versus direct values

| | | 2 alt. inferred | 2 alt. direct | 3 alt. inferred | 3 alt. direct | 4 alt. inferred | 4 alt. direct |
|---------------------------------|-------------------------|--------------------|------------------|--------------------|------------------|--------------------|------------------|
| WTP | Small reduction program | 90.9 | 126.2 | 123.5 | 139.0 | 137.7 | 190.2 |
| | Large reduction program | 137.2 | 159.0 | 187.8 | 172.8 | 179.5 | 279.6 |
| | Total ban program | 111.0 | 173.6 | 174.1 | 167.0 | 166.1 | 255.6 |
| WTP direct / WTP inferred | Small reduction program | 1.39 | | 1.12 | | 1.38 | |
| | Large reduction program | 1.16 | | 0.92 | | 1.56 | |
| | Total ban program | 1.56 | | 0.96 | | 1.54 | |

↑
Social desirability bias
in a range of 16-56%

↑
Social desirability bias in a
range similar to
2-alternative version: 38-56%

↑
Substantially different
results – strategic
responses?

Concluding thoughts

- Inferred valuation does not generate the same value estimates for elicitation formats varying in the number of choice alternatives
- The approach appears to be susceptible to behavioral effects (e.g., choice task complexity, preference matching)
- Studies examining social desirability bias by comparing direct and inferred values from choice experiments with more than 2 choice alternatives may confound the bias examination with strategic response bias
- Our estimates of social desirability bias are lower than in some other empirical studies, which may be related to stronger consequentiality beliefs in our study