

# ENDOGENEITY OF SELF-REPORTED CONSEQUENTIALITY IN STATED PREFERENCE STUDIES

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# Stated preference methods

- Widely used to measure the value of non-market goods, especially public goods
- In transportation, marketing, health, culture, environmental economics, ...
- Based on surveys
- Many advantages:
  - Capture use and passive-use values
  - Go beyond the scope of the existing data
- But also important disadvantages:
  - Not based on market behavior
  - Might be viewed as not related to direct consequences
  - Incentive properties insufficiently understood

Conditions for truthful preference disclosure  
(Carson and Groves 2007; Carson et al. 2014; Vossler et al. 2012)

One of the conditions requires the survey consequentiality

A necessary condition for truthful preference disclosure:

# Consequentiality

- “a survey’s results are seen by the agent as potentially influencing an agency’s actions and the agent cares about the outcomes of those actions”

(Carson and Groves 2007)

- “an individual faces or perceives a nonzero probability that their responses will influence decisions related to the outcome in question and they will be required to pay for that outcome”

(*Contemporary Guidance for Stated Preference Studies*, Johnston et al. 2017)

policy consequentiality

payment consequentiality

Other dimensions of consequentiality?

E.g., pivotality?

# Challenges with consequentiality

- **Consequentiality communicated** via survey scripts does not necessarily affect consequentiality perceptions (Czajkowski et al. 2017; Lloyd-Smith et al. 2019)
- • How to **elicit consequentiality perceptions**?
  - A single general question: To what extent do you believe that the survey outcome will affect the decision of public authorities?
  - Questions differentiating between policy and payment consequentiality
  - More indicator (measurement) questions
- • How to include data on consequentiality perceptions in **preference modelling**?
  - Endogeneity concerns: Self-reports on perceived consequentiality are likely driven by similar (unobservable) factors as stated preferences

Our study addresses these questions

# Endogeneity of consequentiality perceptions

explored in previous studies

- Herriges et al. (2010) – an exogenous information treatment and a Bayesian treatment-effect model; importance of controlling for endogeneity
- No significant problem of endogeneity especially in studies using socio-demographics as instruments:
  - Vossler et al. (2012) – a generalized method of moments over-identification test
  - Interis and Petrolia (2014) – a two-step instrumental variable probit model
- Groothuis et al. (2017) – a bivariate probit approach; perceived consequentiality found to be endogenous; unobserved factors strengthen the consequentiality and decrease the likelihood of voting for the program
- Lloyd-Smith et al. (2019) – a special multi-step estimator for a scaled probit model; importance of controlling for endogeneity; with no endogeneity control, perceived consequentiality affects voting behavior, but the effect disappears with the special regressor

# Endogeneity of consequentiality perceptions

explored in previous studies

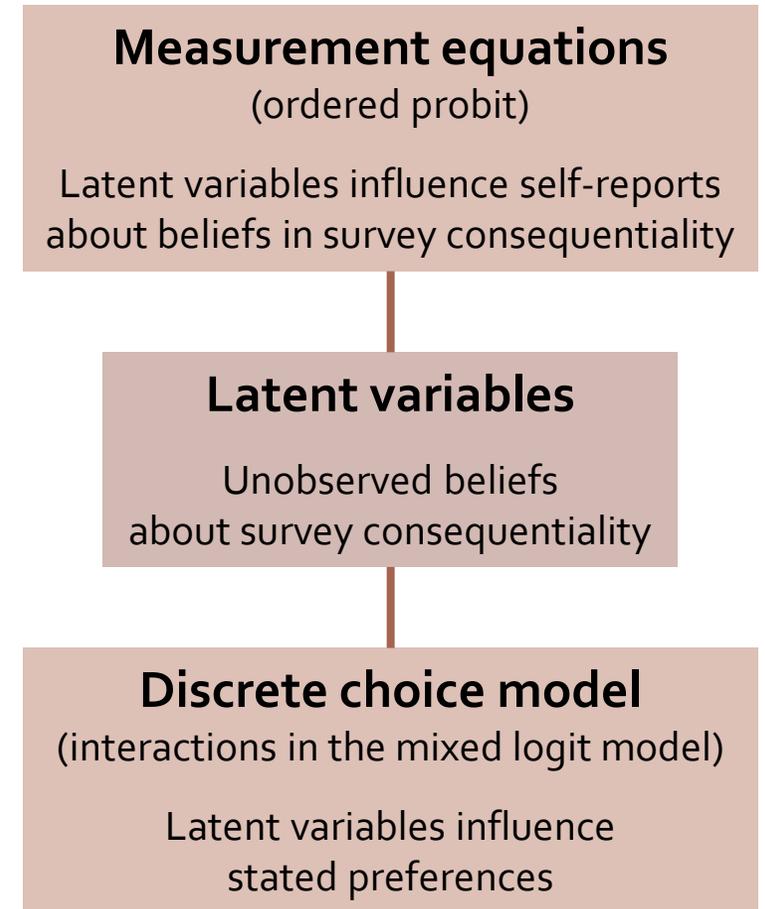
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- No significant problem of endogeneity demographics as instruments:
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- Lloyd-Smith et al. (2019) – a special regressor model; importance of controlling for endogeneity; with no endogeneity control, perceived consequentiality affects voting behavior, but the effect disappears with the special regressor

## Limitations:

- Little evidence – very few studies
- Mixed evidence
- Mostly for binary choice data (not discrete choice experiments)
- Step-wise procedures
- Single indicator (measurement) questions for consequentiality

# Our approach: Hybrid choice model

- Hybrid choice models incorporate 'soft' (not objectively measurable) variables, such as perceptions and attitudes, into the choice model
- Here, the 'soft' variables: beliefs about survey consequentiality
- Directly including indicator variables (e.g., self-reports about perceived consequentiality) into a choice model may lead to biased estimates due to endogeneity and measurement problems
- All equations are estimated simultaneously



# Endogeneity control in hybrid choice models

Budziński and Czajkowski (2018)

## Model 1

- Standard hybrid choice models do not resolve endogeneity
- Two types of endogeneity:
  - 1) Latent variables are endogenous
  - 2) Indicator variables are endogenous, but latent variables are not

## Model 2

- Solutions:
  - Directly modeling the correlation between latent variables and random parameters – help (1)
  - Adding a latent variable to capture the correlation caused by missing covariates – help (1) and (2)

## Model 3

Here, we present the first application of these approaches

### Measurement equations

(ordered probit)

Latent variables influence self-reports about beliefs in survey consequentiality

### Latent variables

Unobserved beliefs about survey consequentiality

### Discrete choice model

(interactions in the mixed logit model)

Latent variables influence stated preferences

# Empirical data

- We use the hybrid choice model to examine the role of consequentiality and of endogeneity control for value estimates
- Data from three large-scale discrete choice experiments
- Samples from 801 to 2,863 respondents
- Various valuation contexts: public theater offer, renewable energy
- Various ways of eliciting consequentiality perceptions: from one to several indicator questions
- This presentation focuses on one application only

# Discrete choice experiment

- Public-good scenario: Extension of public theater offer in Poland (a number of shows)
- 4 choice tasks per person; CAWI; a representative sample of 2,863 residents of Poland

	Variant A	Variant B No changes	Attribute levels
 Entertainment theaters	+ 25%	no change	{ + 25%, + 50%, no change
 Drama theaters	+ 50%	no change	
 Children's theaters	no change	no change	
 Experimental theaters	+ 50%	no change	
Annual cost for you (tax)	50 PLN	0 PLN	5, 10, 20, 50 PLN
Your choice	<input type="checkbox"/>	<input type="checkbox"/>	

# Consequentiality elicitation

- Randomized statements assessed on a Likert scale with seven levels: from 'definitely disagree' to 'definitely agree' + don't know
- Used in the measurement → 9 ordered probit models as measurement equations

I think that ...

[1] ... by participating in this survey, I will have influence on the future theater offer.

[2] ... the results of this survey will determine if to change the theater offer.

[3] ... the results of this survey will be used to decide if to change the theater offer.

[4] ... if the theater offer is decided to be changed, the results of this survey will be used to decide which type of shows will be played more and less.

[5] ... the increase of the theater offer as described in this survey is possible to be implemented.

[6] ... a decision to expand the theater offer will indeed result in more shows and premiers, as described in this survey.

[7] ... a decision to expand the theater offer will indeed result in higher (tax) fees, which will increase my household expenditures, as described in this survey.

[8] ... I am one of many people participating in this survey, so my responses do not have a chance to affect the survey final results.

[9] ... a decision whether to change the theater offer will be taken independently of the survey results.

# Results

## Measurement equations

(ordered probit)

Latent variables influence self-reports about beliefs in survey consequentiality

## Latent variables

Unobserved beliefs about survey consequentiality

## Discrete choice model

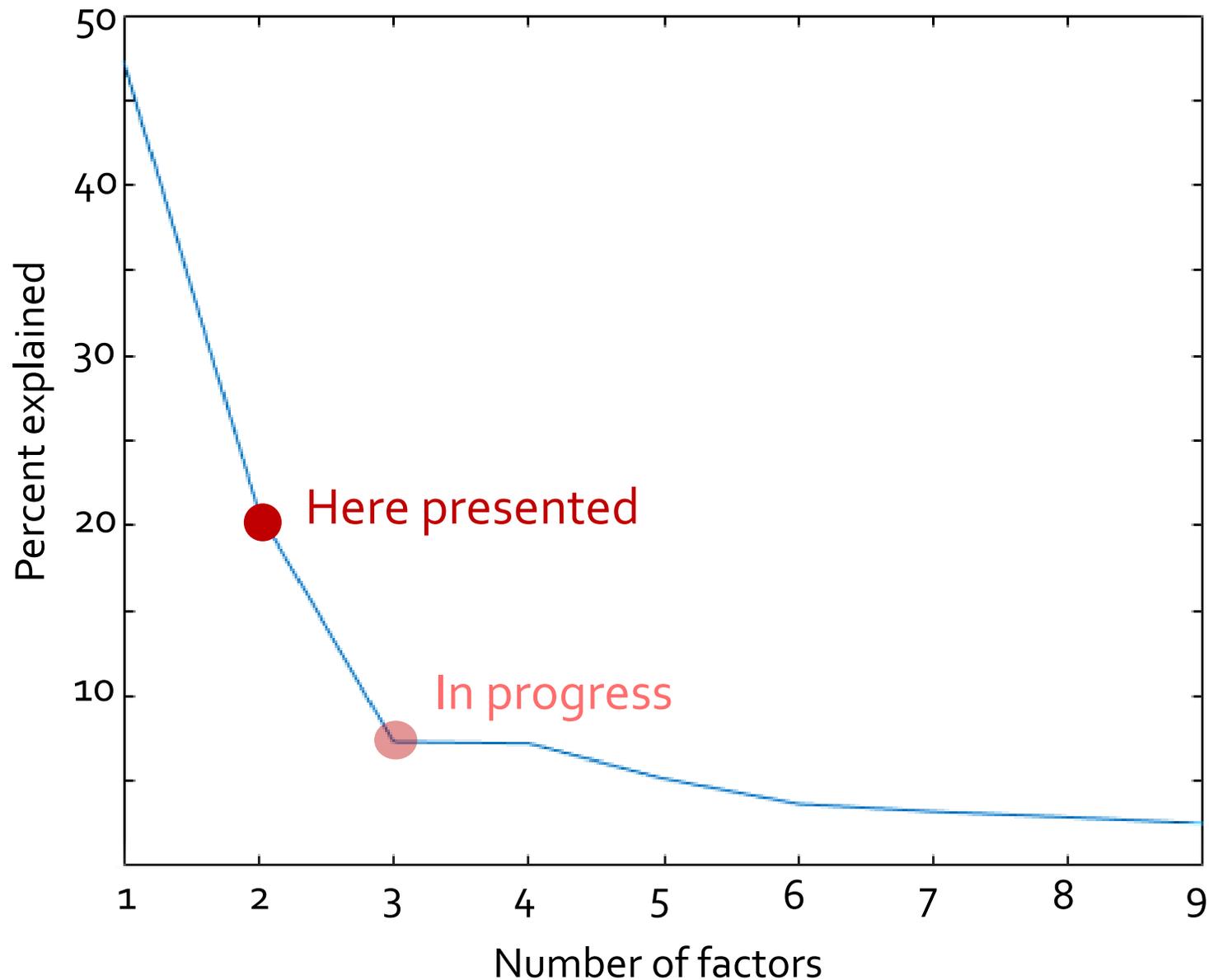
(interactions in the mixed logit model)

Latent variables influence stated preferences

	Model 1	Model 2	Model 3
	Standard	Corr. LVs and random parameters	+ 1 LV

**How many latent variables to include?**

How many dimensions of consequentiality do we have?



# Results

## Measurement equations

(ordered probit)

Latent variables influence self-reports about beliefs in survey consequentiality

## Latent variables

Unobserved beliefs about survey consequentiality

## Discrete choice model

(interactions in the mixed logit model)

Latent variables influence stated preferences

	Model 1	Model 2	Model 3
	Standard	Corr. LVs and random parameters	+ 1 LV
LL	-38,620.1	-38,564.6	-38,465.4
BIC/n	6.834	6.835	6.819

→ better

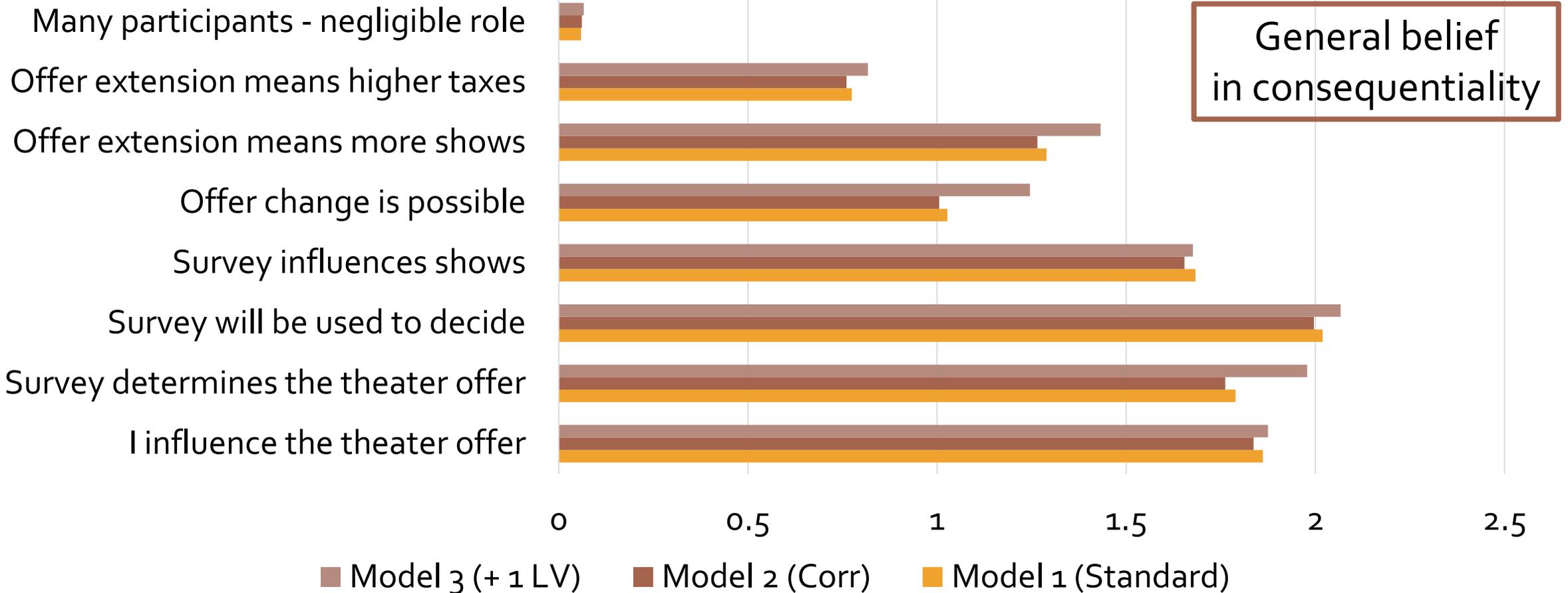
→ even better

- Responses to consequentiality statements are explained with latent variables
- Two latent variables (LVs) expressing perceived consequentiality:
  - General belief in consequentiality
  - Lack of belief in pivotality

# Results: Measurement equations

Ordered probits

## Coefficients on how LV<sub>1</sub> explains each statement



# Results: Measurement equations

Ordered probits

## Coefficients on how LV2 explains each statement

Decision independent of the survey

Many participants - negligible role

Offer extension means higher taxes

Offer extension means more shows

Offer change is possible

Survey influences shows

Survey will be used to decide

Survey determines the theater offer

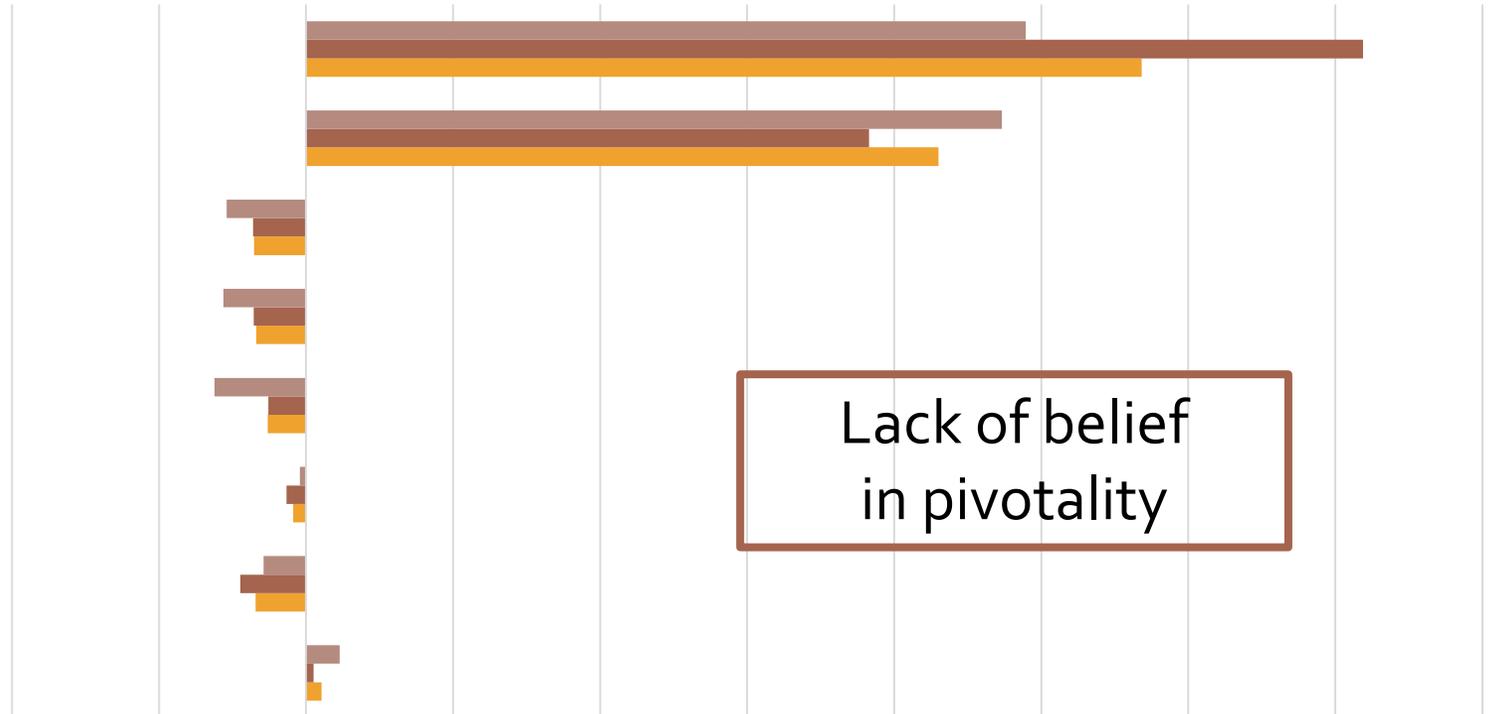
■ Model 3 (+ 1 LV)

■ Model 2 (Corr)

■ Model 1 (Standard)

Lack of belief  
in pivotality

-0.4 -0.2 0 0.2 0.4 0.6 0.8 1 1.2 1.4 1.6



# Results: Measurement equations

Ordered probits

**Additional latent variable in Model 3 (+ 1 LV) to control endogeneity**

Coefficients on how LV3 explains each statement

Decision independent of the survey

Many participants - negligible role

Offer extension means higher taxes

Offer extension means more shows

Offer change is possible

Survey influences shows

Survey will be used to decide

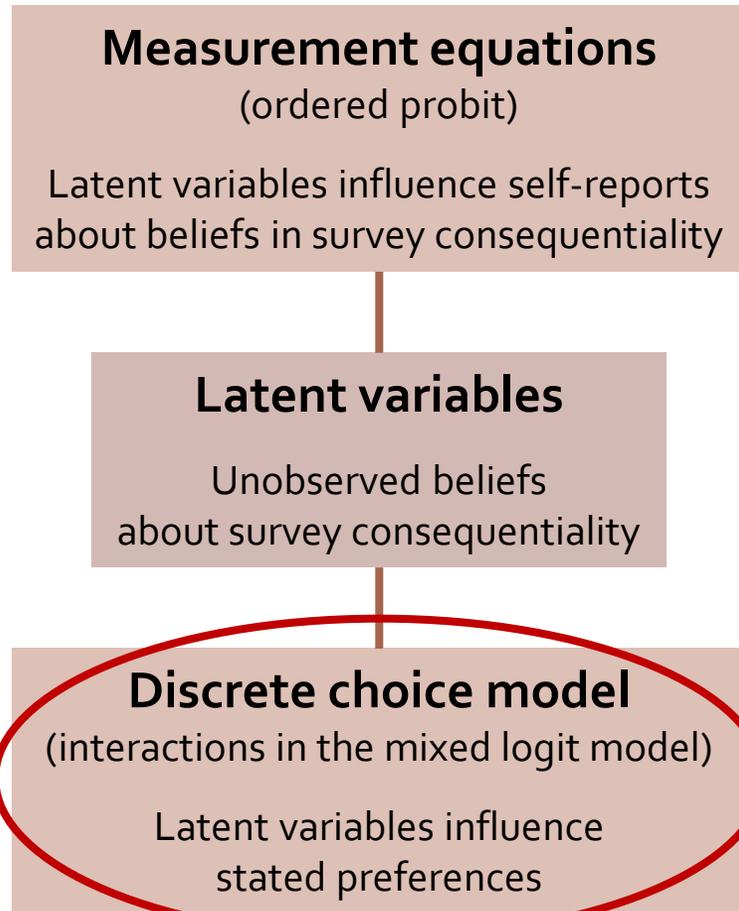
Survey determines the theater offer

I influence the theater offer

-0.6   -0.4   -0.2   0   0.2   0.4   0.6   0.8

Another dimension of consequentiality?

# Results



	Model 1	Model 2	Model 3
	Standard	Corr. LVs and random parameters	+ 1 LV
LL	-38,620.1	-38,564.6	-38,465.4
BIC/n	6.834	6.835	6.819

→ better → even better

- Two latent variables (LVs) expressing perceived consequentiality:
  - General belief in consequentiality
  - Lack of belief in pivotality

# Results: Discrete choice component

Mixed logits with means interacted with LVs

## Mean coefficient estimates

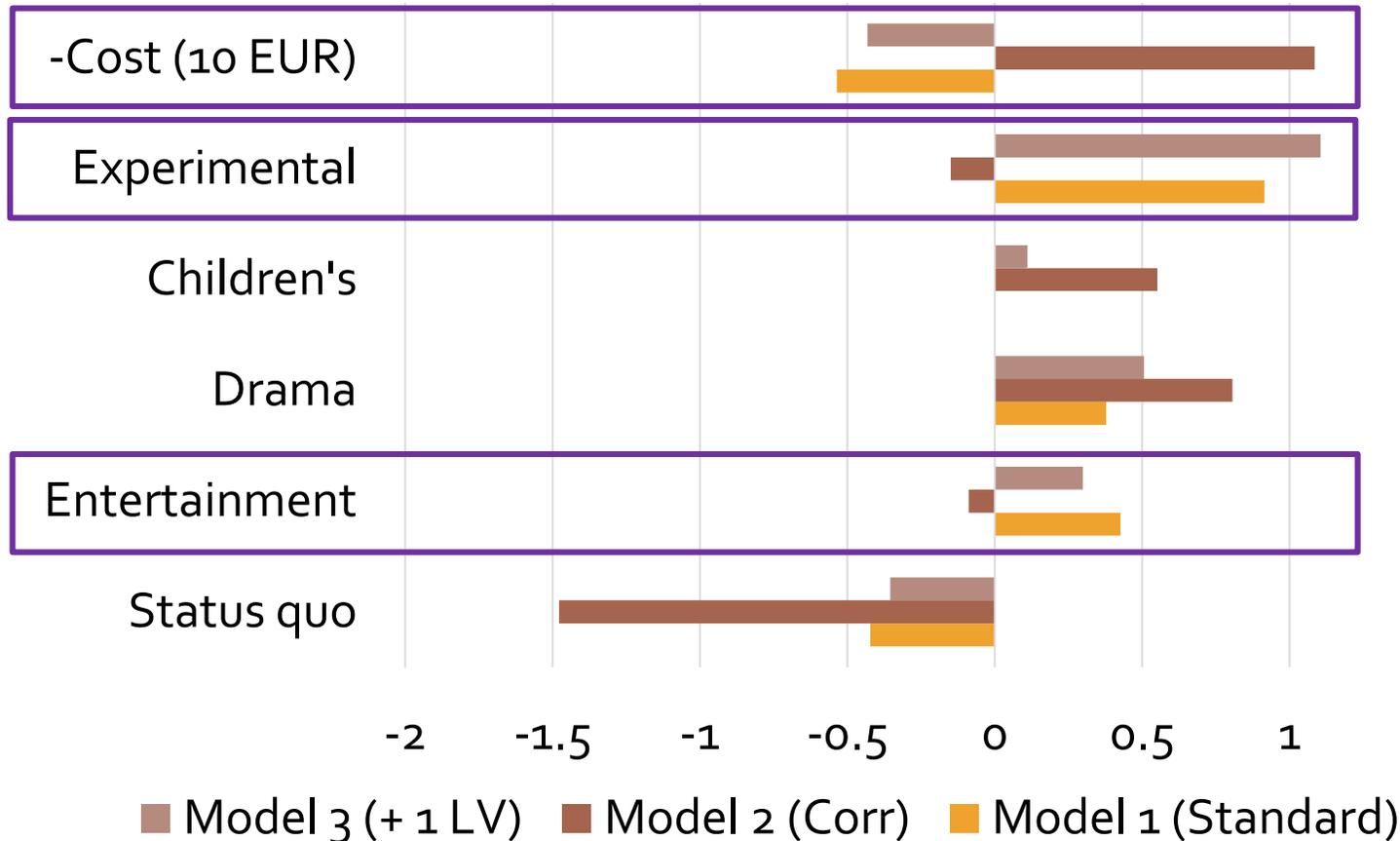
	Model 1	Model 2	Model 3
	Standard	Corr. LVs and random parameters	+ 1 LV
<b>Status quo</b>	0.4719***	0.4459***	0.4711***
<b>Entertainment</b>	0.8926***	0.999***	0.9151***
<b>Drama</b>	0.5769**	0.464*	0.4259
<b>Children's</b>	0.1364	0.1099	0.0443
<b>Experimental</b>	-0.4336	-0.502*	-0.409
<b>- Cost (10 EUR)</b>	3.7752***	3.8161***	3.6282***

- Preference parameters are random
- For all, standard deviations are (highly) significant
- Mean coefficient estimates are similar across models

# Results: Discrete choice component

Mixed logits with means interacted with LVs

## Coefficients of interactions of means with LV<sub>1</sub> (general consequentiality)

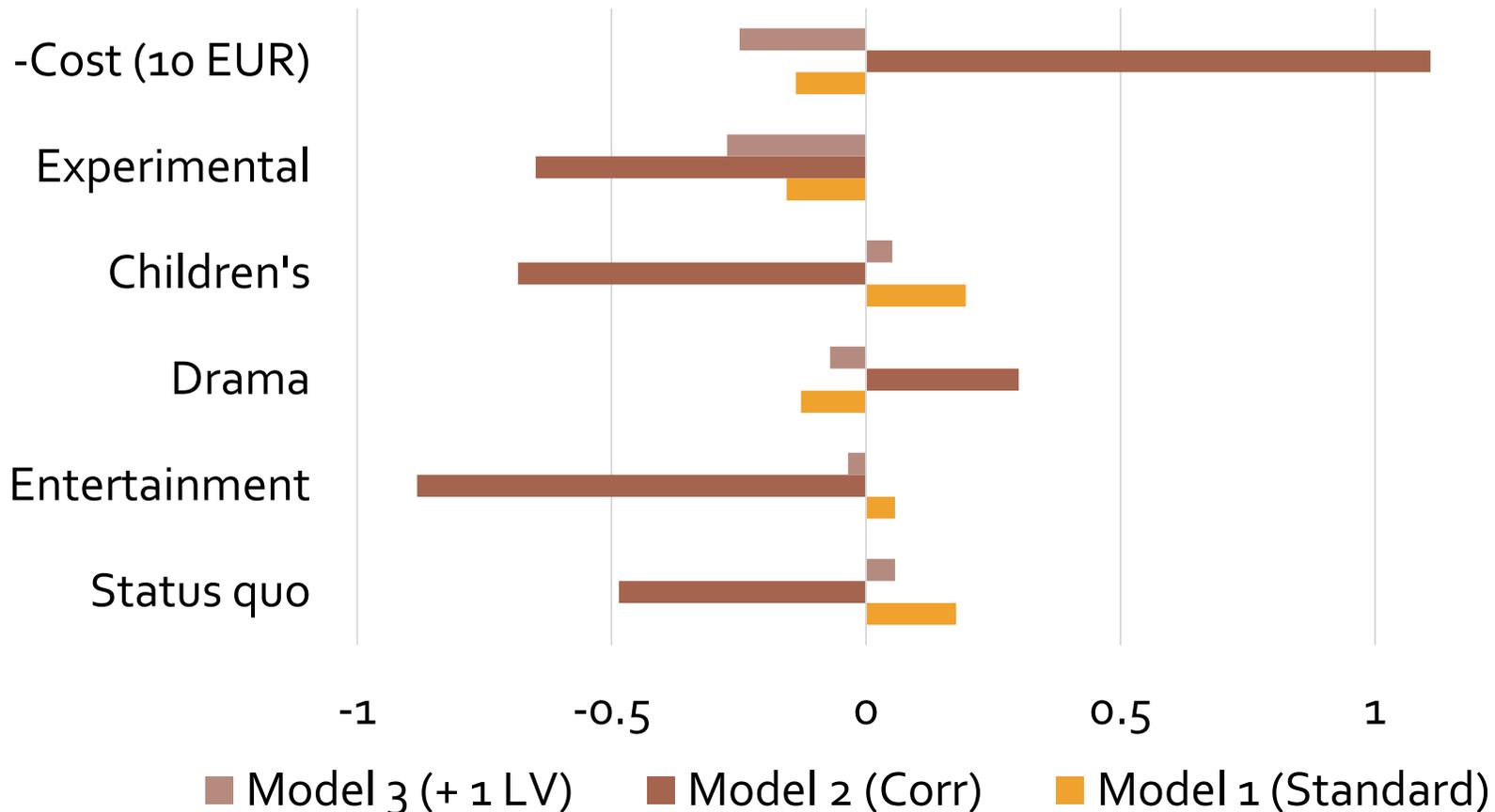


- Model 2 (Corr) accounts for one endogeneity type: endogeneity of the latent variable
- Endogeneity control matters largely for cost
- And so it changes willingness-to-pay values
- In Model 3 (+1 LV), maybe another consequentiality dimension?

# Results: Discrete choice component

Mixed logits with means interacted with LVs

## Coefficients of interactions of means with LV2 (pivotality)

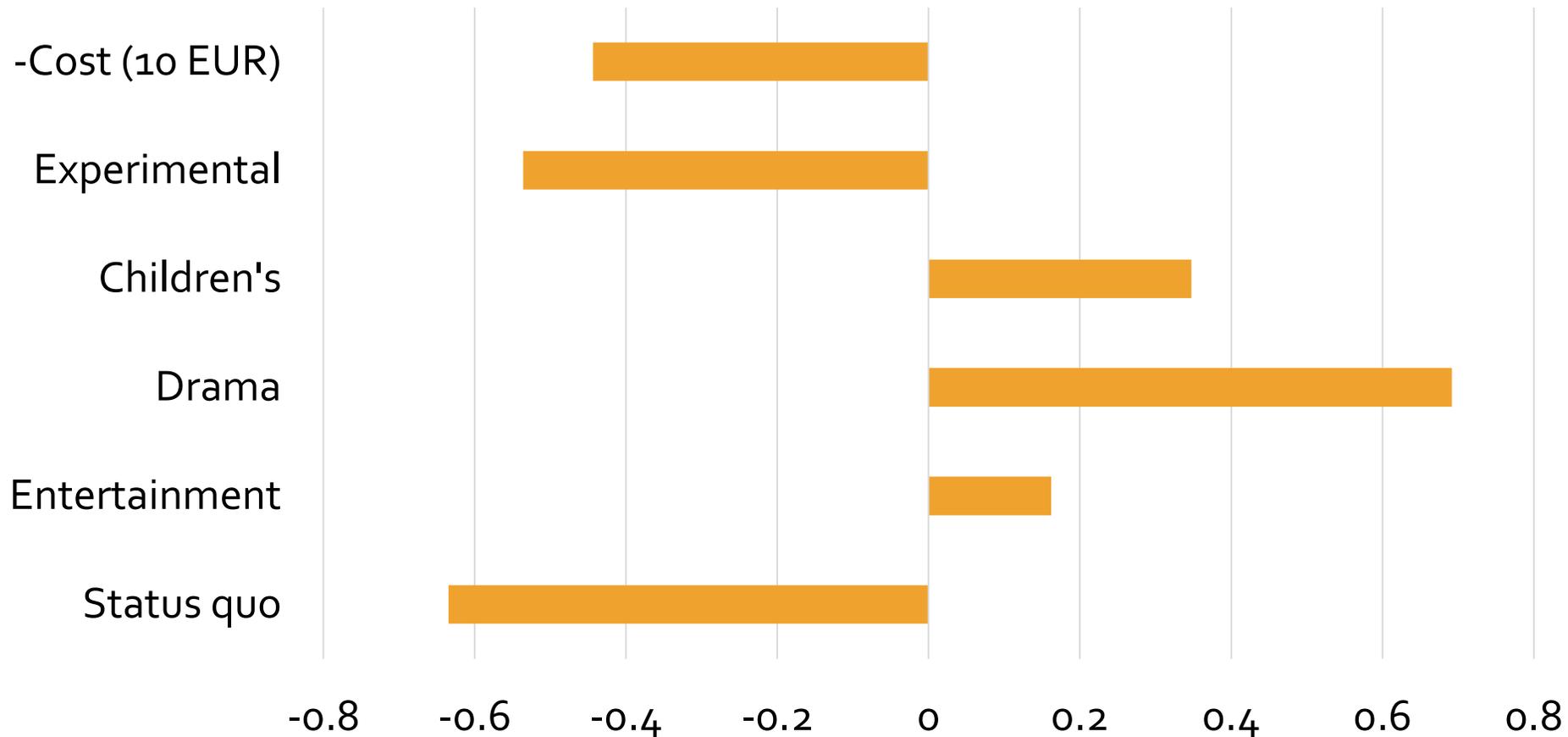


- Similar findings
- Endogeneity control in Model 2 matters for many attributes
- In Model 3, maybe another dimension of consequentiality, rather than endogeneity control?

# Results: Discrete choice component

Mixed logits with means interacted with LVs

## Coefficients of interactions of means with LV<sub>3</sub>



# Closing thoughts

- Similar findings from other datasets we have considered
- Accounting for endogeneity matters
- No theory regarding dimensions of consequentiality (or other attitudes captured)
  - This could guide designing indicator questions to elicit respondents' perceptions
- Some problems with the interpretation of additional LVs
- Design an experiment to make causal inferences?

# THANK YOU!

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