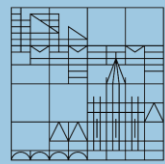


JUST TAKING THE GIFT OR RETURNING THE FAVOR?

A Meta-Analysis on the Effects of Incentives for Survey Participation

Andreas Schneck and Katrin Auspurg

Rational Choice Sociology: Theory and Empirical Applications 2013
Workshop at Venice International University, San Servolo

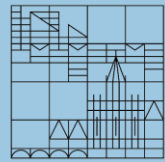


Motivation

- Problem of declining response rates over time (for empirical evidence on decreasing response rates see Aust & Schröder 2009; De Leeuw & De Heer 2002; Groves 2011; Schnell 1997)
- Especially low response rate in web surveys (Shih & Xitao Fan 2008)
- Increased risk of nonresponse bias

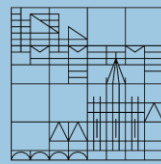
Methods to increase response rates:

- Careful survey design: total (Dillman 1978) or tailored design (Dillman 2007): incentives, reminder, personalization (e.g. hand signature), etc.
- We focus on incentives in self-administered surveys



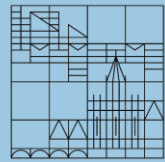
Side note: incentive terminology

- **Conditional:** on completion of survey; after survey participation
- **Unconditional:** with survey request; before survey participation
- **Monetary:** cash or check incentive
- **Nonmonetary:** items, lottery incentives (in this study also monetary lotteries)



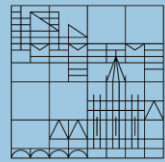
Theory I

- **Norms of reciprocity** (Gouldner 1960; Mauss 1967)
 - Norm to repay gift (unconditional)
 - In general no sanctioning possible – no “loss of face” (Mauss 1967: 41)
- **Exchange theory** (Blau 1967)
 - Focus on possible future interactions (future gains)
 - Unconditional incentive “symbol of trust” (Dillman 1978: 16)
 - Social exchange (unconditional incentive - diffuse obligation) or economic exchange (conditional incentive - payment)
 - Most surveys only one-shot interaction – no future interactions



Theory II

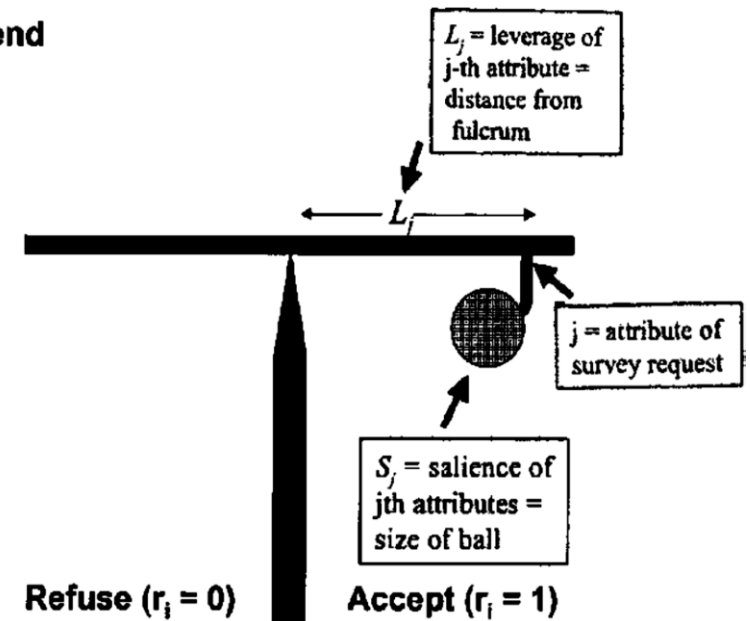
- **Strict RC** pure utility maximizing actors: take incentive – but refuse participation to avoid opportunity costs
 - Surveys: low profit and low cost situation
 - Do only participate in case of conditional incentives
- **Bounded rationality** (Simon 1983)
 - Situations in which the actor isn't aware of all potential costs and benefits
 - Use of simple decision heuristics (e.g.: ignore requests from strangers)



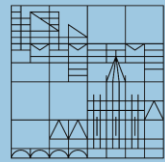
Theory III

- **Leverage salience theory**
(Groves et al. 2000)
 - Leverage (preference set)
 - Salience (trigger preference by making survey attribute salient)
 - Incentives can't convert "hard-core" nonrespondents, but unstable nonrespondents (unconditional = more salient)

Legend

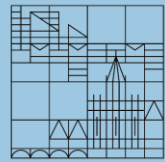


(Groves et al. 2000: 300)



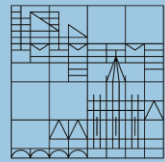
Hypotheses

- H_1 : The higher the incentive, the higher the odds of response (effect with declining rate)
- $H_{2.1}$: Unconditional incentives are more effective than conditional incentives
- $H_{2.2}$: Conditional incentives are more effective than unconditional incentives
- H_3 : Monetary incentives are more effective than nonmonetary incentives
- H_4 : The combination of monetary and unconditional incentives is even more effective



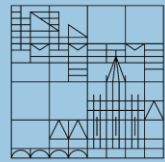
State of research

- Incentives as a central aspect to enhance survey participation.
(e.g. Armstrong 1975; Edwards et al. 2009)
- Unconditional & monetary incentives more effective
- Relationship between incentive-value and odds of response unclear (linear, curvilinear)
- Incentives effective also in telephone (Singer et al. 2000) and face-to-face surveys



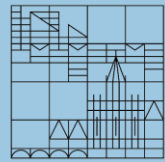
Research gap

- Most studies focus on mean effect sizes and bivariate subgroup analyses only
 - No analysis of the heterogeneity of incentive conditions
 - No in-depth theoretical explanation of incentive-mechanisms
- What are conditions of incentives to be effective under control of study characteristics?



Data

- (Hopefully) all published English and German language incentive experiments (Deadline March 2013)
- Inclusion criteria:
 - Self-administered survey
 - Non-incentive control group
 - Report on number of participants & nonrespondents
 - Description of incentive (incentive amount or incentive value)



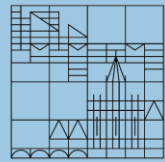
Data

- Extensive literature search
 - Google Scholar, PubMed, Sociological Abstracts, Web of Knowledge, Web Survey Bibliography (WebSM)
 - relevant meta-analyses (e.g. the Cochrane Review: Edwards et al. 2009)*
- Coded effect size (ES) → Odds Ratio (OR)
 - Log(OR) unbound, thus better than Risk Ratio (biased if high control group risk) or Risk Difference (RD)
 - but lower interpretability

Dataset (meeting inclusion criteria):

133 publications/ 175 studies/ 320 trials

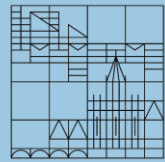
*Special thanks to Phil Edwards for the provision of his dataset (Edwards et al., 2002)!



Methods

Meta-Analysis (MA)

- Weighted mean effect size
 - Problematic if high degree of heterogeneity
- Problem of MAs “statistical fruit salad” (Brüderl 2004) ; problem similar to omitted variable bias (c.f. Greene 2012: 219)
- Control for heterogeneity by Meta Regression Analyses.
For all non-statisticians: we are trying to disentangle the fruits!



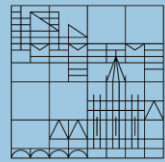
Methods

Meta Regression Analysis (MRA)

- Also possible in a common OLS framework

$$ES_i = \beta_0 + \beta_x M_i + \varepsilon_i$$

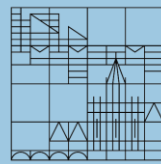
- Problem of heteroskedasticity
 - WLS (weighted least squares) (Stanley & Doucouliagos 2013a: 12)
 - Inverse variance weighted
- Problem of dependent ES (one control-, mult. test-groups)
 - Multilevel models: fixed- (FE-ML) random-effects (RE-ML)



Methods

Advantages of WLS-MRA

- Better coverage and less biased as models typically used in psychology or medicine, especially in case of heterogeneity)
(Stanley & Doucouliagos 2013a; Stanley & Doucouliagos 2013b)
- Good implementation in statistical packages due to the relation to “normal” OLS
(e.g. in Stata: `regress AV UV [aweight=invVar]`) (c.f. MAER-Net)



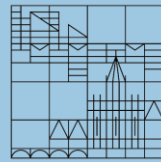
Publication bias

- “Publication of research findings based on the nature and direction of the research results“ (Dickersin 2005: 13)
- Often triggered by significance thresholds (1/ 5/ 10%)
- Biased MRA (similar to nonresponse bias in surveys)

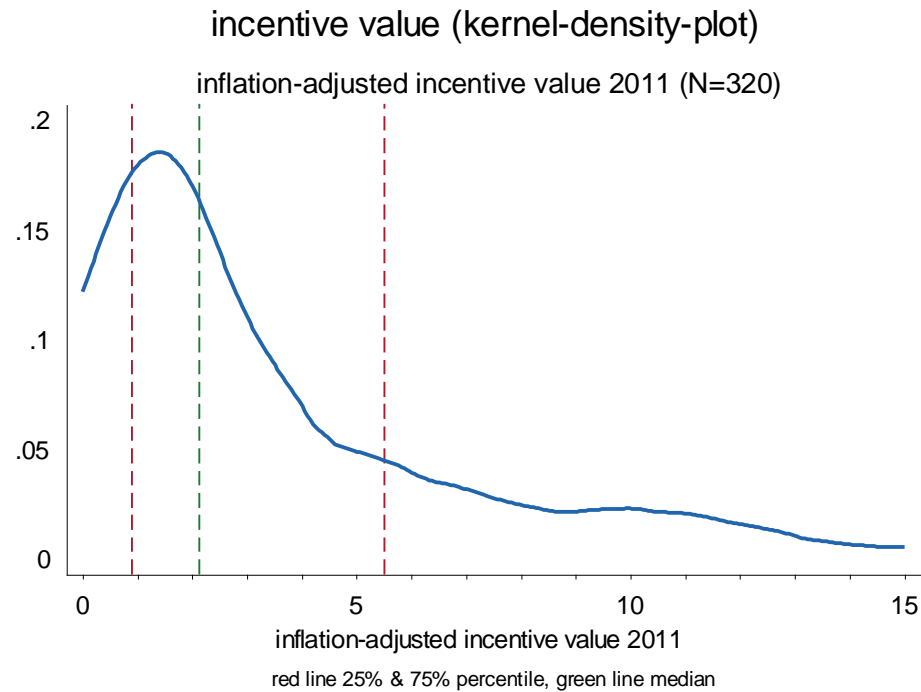
- **MRA identification method** (Stanley 2008)

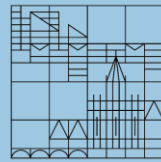
$$ES_i = \beta_0 + \beta_1 SE_i + \beta_x M_i + \varepsilon_i$$

- β_0 Precision-Effect-Test (PET) – any genuine effect of treatment?
- β_1 Funnel-Asymmetry-Test (FAT) – any publication bias?
- **Correction:** PET with squared standard Error (SE_i^2 ; PEESE)

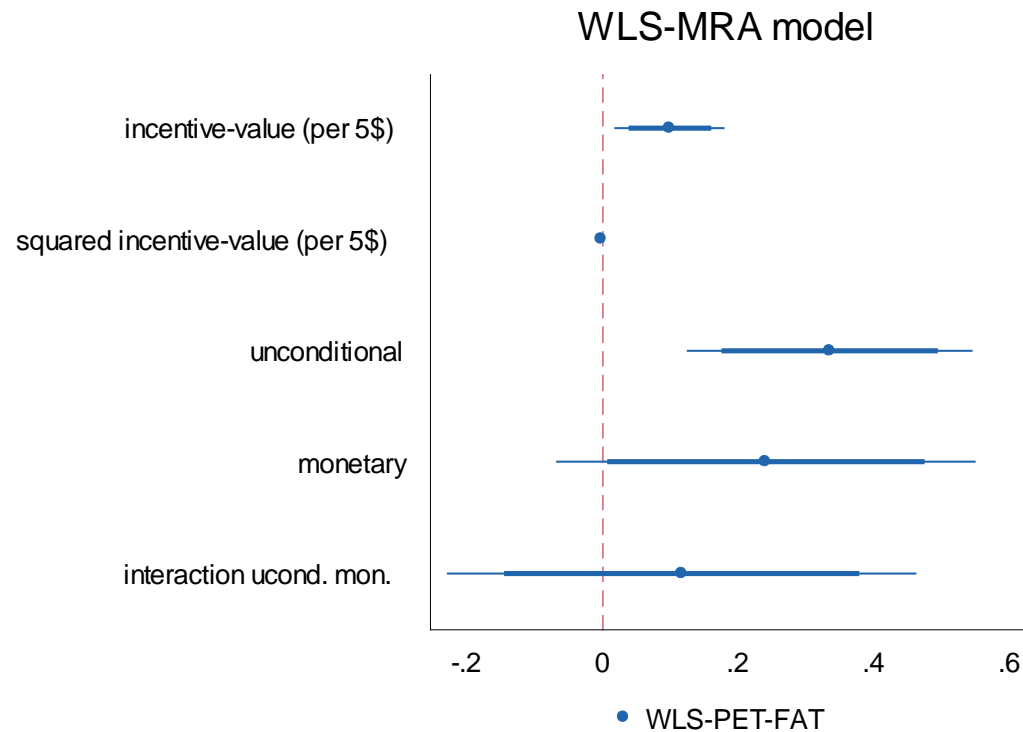


Descriptive results





WLS-MRA



Model with clustered SEs; controls: country of survey, highest lottery incentive, netto sample, surveyed population, study topic, randomisation, survey mode, trial year, reminder not displayed

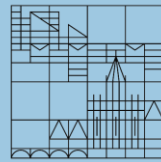
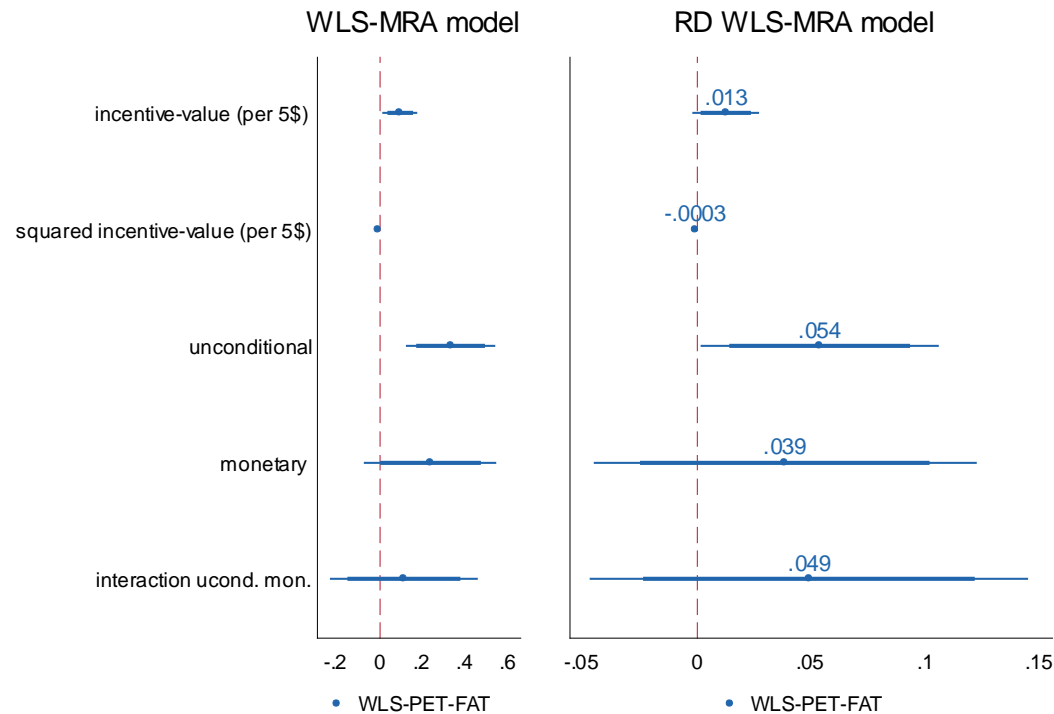
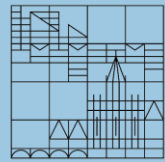


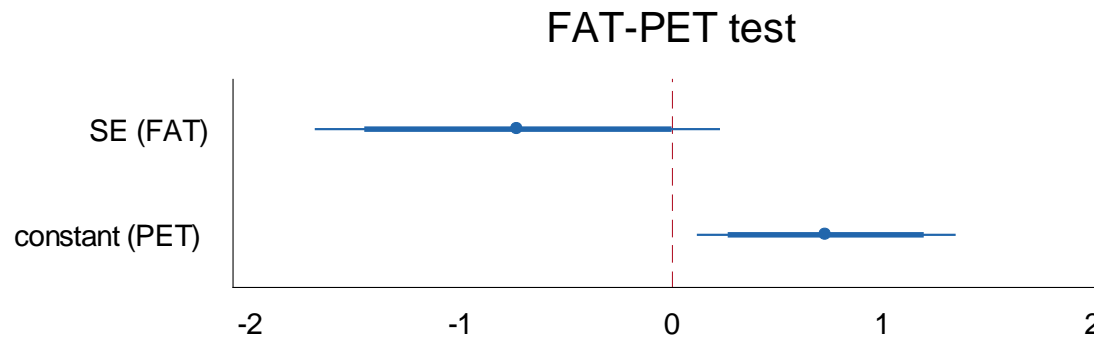
Illustration of effect sizes – RD model



Models with clustered SEs; controls not displayed

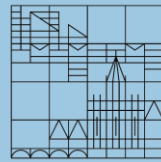


Publication bias test



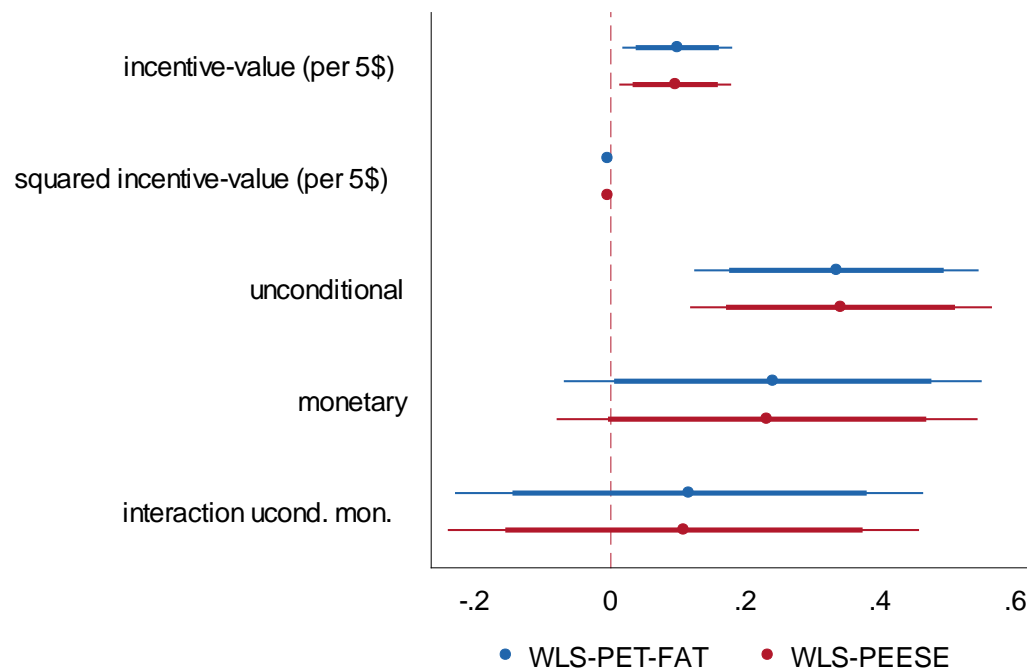
WLS with clustered SEs; controls not displayed

- Marginal significant FAT (but in the other direction as supposed (high SE - high effect))
- Small study effect?
- Significant PET – true overall effect

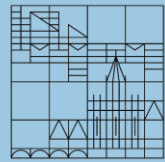


Publication bias correction

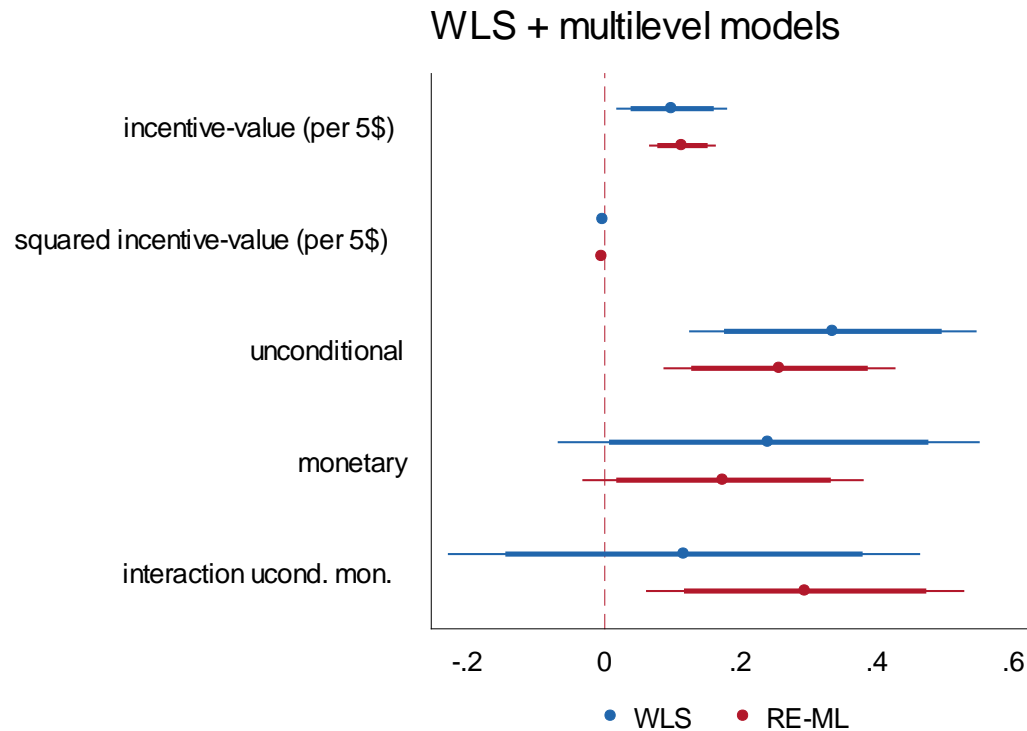
WLS-MRA model + PB correction



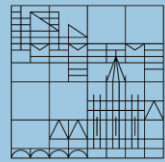
WLS with clustered SEs; controls not displayed



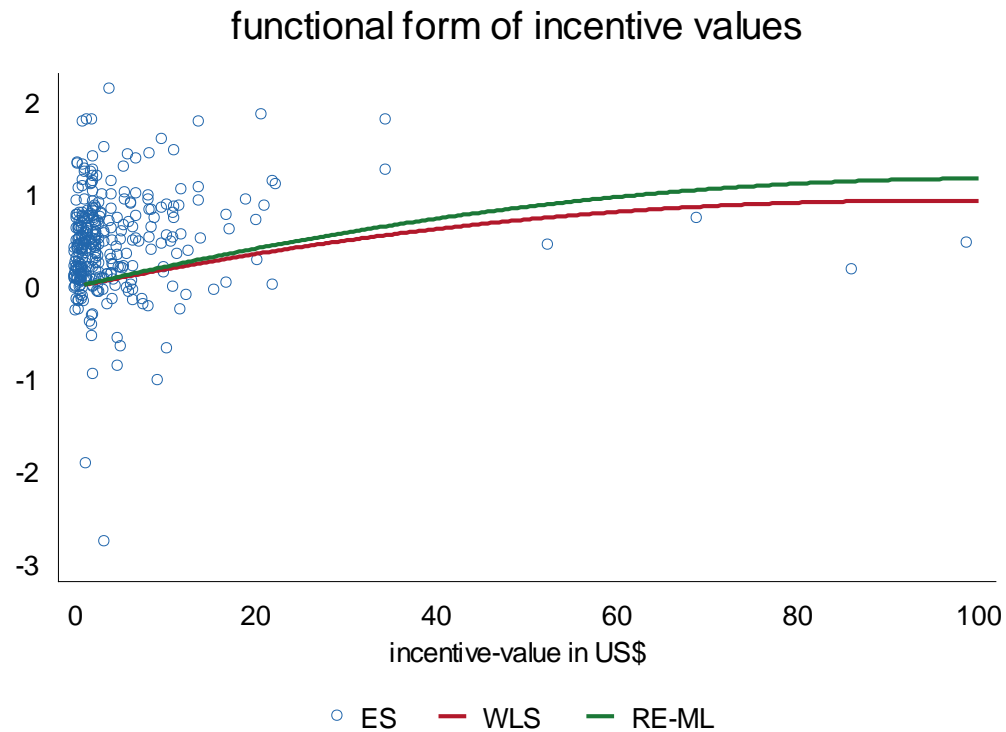
Multilevel implementation



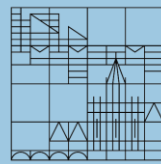
WLS with clustered SEs; Controls not displayed; Multilevel necessary $F(174, 138) = 2.94$, random effects unbiased $\text{Chi}^2(6) = 6.92$, thus FE-ML not displayed



The effect of the incentive-value

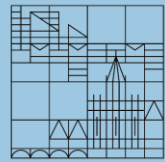


controls not displayed



Hypotheses revisited

- H_1 (+) the more US\$ the better (effect with declining marginal rate: higher effect per US\$ if low incentive)
- $H_{2.1}$ (+) unconditional incentives better
- $H_{2.2}$ (-) conditional incentives better
- H_3 (+) monetary incentives slightly better
- H_4 (+) combination of both strategies best (except WLS)

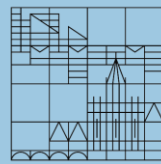


Main limitation

- **Nonresponse bias** is threatening the validity of survey results
(c.f. Groves 2009: 59)

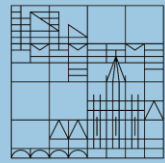
$$\bar{y}_r - \bar{y}_s = \frac{m_s}{n_s} (\bar{y}_r - \bar{y}_m)$$

- Differences between respondents (r) and nonrespondents (m) matter
 - High nonresponse rates increase those potential differences
- Response rates are only half of the story

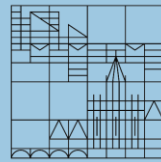


Discussion and outlook

- Strict RC not confirmed, but applicable if extended by the model of bounded rationality and the leverage salience theory
- Norms of reciprocity one possible mechanism besides ext. RC
- Exchange theory does not fit to one-shot situations
- Future work:
 - Disentangle ext. RC and norms of reciprocity (e.g. potential survey participation in a factorial survey experiment)
 - Include better nonresponse bias and data quality indicators
 - Tackle also issues of efficiency beside effectivity
 - Exchange theory better testable in panel incentive experiments (Fumagalli et al. 2013)

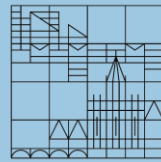


Thanks a lot for your attention!



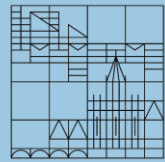
Literature

- Armstrong, J. Scott. 1975. "Monetary incentives in mail surveys." *The Public Opinion Quarterly* 39(1):111-16.
- Aust, Folkert, and Helmut Schröder. 2009. "Sinkende Stichprobenausschöpfung in der Umfrageforschung – ein Bericht aus der Praxis." Pp. 195-212, edited by Martin Weichbold, Johann Bacher, and Christof Wolf: VS Verlag für Sozialwissenschaften.
- Blau, Peter Michael. 1967. *Exchange and power in social life*. New York u.a.: Wiley.
- Boskin, M.J., E.R. Dulberger, R.J. Gordon, Z. Griliches, and D.W. Jorgenson. 1998. "Consumer prices, the consumer price index, and the cost of living." *The Journal of Economic Perspectives* 12(1):3-26.
- Brüderl, J. 2004. "Meta-Analyse in der Soziologie: Bilanz der deutschen Scheidungsforschung oder" statistischer Fruchtsalat"?" *Zeitschrift für Soziologie* 33(1):84-86.
- De Leeuw, Edith D, and Wim De Heer. 2002. "Trends in household survey nonresponse: A longitudinal and international comparison." Pp. 41-54 in *Survey Nonresponse*, edited by Robert M. Groves, Don A. Dillman, John L. Eltinge, and Little Roderick J. A. Ney York: Wiley.
- Dillman, Don A. 1978. *Mail and telephone surveys the total design method*. New York u.a.: Wiley.
- —. 2007. *Mail and internet surveys the tailored design method*. Hoboken, NJ: Wiley.
- Edwards, Phil, Ian Roberts, Mike Clarke, Carolyn DiGuseppi, Sarah Pratap, Reinhard Wentz, and Irene Kwan. 2002. "Increasing response rates to postal questionnaires: systematic review." *Bmj* 324(7347):1183.
- Edwards, Philip James, Ian Roberts, Mike J. Clarke, Carolyn DiGuseppi, Reinhard Wentz, Irene Kwan, Rachel Cooper, Lambert M. Felix, and Sarah Pratap. 2009. "Methods to increase response to postal and electronic questionnaires." *Cochrane Database of Systematic Reviews* (3).
- Fumagalli, Laura, Heather Laurie, and Peter Lynn. 2013. "Experiments with methods to reduce attrition in longitudinal surveys." *Journal of the Royal Statistical Society: Series A (Statistics in Society)* 176(2):499-519.
- Gouldner, Alvin W. 1960. "The norm of reciprocity: A preliminary statement." *American Sociological Review* 25(2):161-78.
- Greene, William H. 2012. *Econometric analysis*. Boston: Prentice Hall.
- Groves, Robert M. 2011. "Three Eras of Survey Research." *Public Opinion Quarterly* 75(5):861-71.



Literature

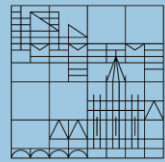
- Groves, Robert M., Eleanor Singer, and Amy Corning. 2000. "Leverage-saliency theory of survey participation: description and an illustration." *The Public Opinion Quarterly* 64(3):299-308.
- MAER-Net. "Guidelines for the Meta-Analysis of Economics Research." in http://www.hendrix.edu/uploadedFiles/Departments_and_Programs/Business_and_Economics/AMAES/Be%20Rigorous%283%29.pdf (last access: 08.11.2013), edited by Hendrix College.
- Mauss, Marcel. 1967. *The gift forms and functions of exchange in archaic societies*. New York: Norton.
- Schnell, R. 1997. *Nonresponse in Bevölkerungsumfragen - Ausmaß, Entwicklung und Ursache*. Opladen: Leske + Budrich.
- Shih, Tse-Hua, and Xitao Fan. 2008. "Comparing Response Rates from Web and Mail Surveys: A Meta-Analysis." *Field Methods* 20(3):249-71.
- Simon, Herbert A. 1983. *Reason in human affairs*. Stanford, Calif.: Stanford University Press.
- Singer, E., J. Van Hoewyk, and M. P. Maher. 2000. "Experiments with incentives in telephone surveys." *Public Opinion Quarterly* 64(2):171-88.
- Stanley, T. D. 2008. "Meta-Regression Methods for Detecting and Estimating Empirical Effects in the Presence of Publication Selection*." *Oxford Bulletin of Economics and Statistics* 70(1):103-27.
- Stanley, T.D., and Hristos Doucouliagos. 2013a. "Better than Random: Weighted Least Squares Meta-Regression Analysis." in *Economics Series*: Deakin University, Faculty of Business and Law, School of Accounting, Economics and Finance.
- Stanley, TD, and Hristos Doucouliagos. 2013b. "Neither Fixed nor Random: Weighted Least Squares Meta-Analysis." Deakin University, Faculty of Business and Law, School of Accounting, Economics and Finance.



Appendix I

Data problems

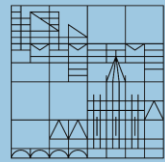
- **solved**
 - Inflation adjusted incentive amount/ value (by CPI)
 - Continuity correction (+0.5) to make OR computation feasible
 - Multi-level structure due to dependent effects sizes (on control group)
- **unsolved**
 - Missing study information (e.g. study sponsor)
 - Overestimation of the real inflation using the CPI by approximately 1.1% per year (Boskin et al. 1998:11)



Appendix II

Incentive modes

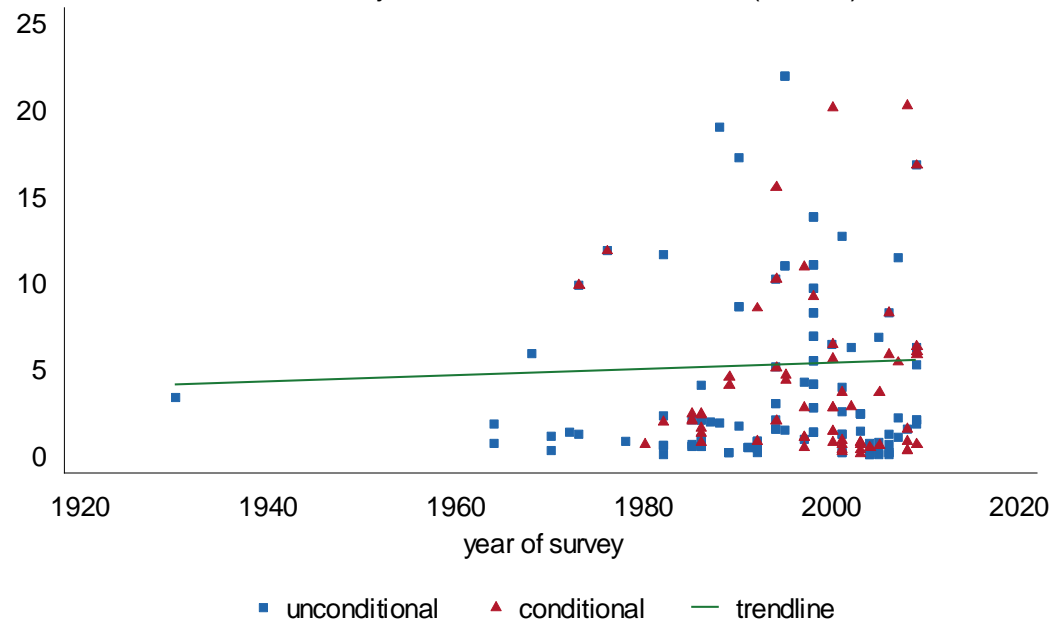
monetary	Time of payment	
	conditional	unconditional
Nonmonetary	76	40
monetary	24	179

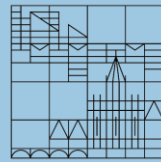


Appendix III

incentive value over time

inflation-adjusted incentive value 2011 (N=200)

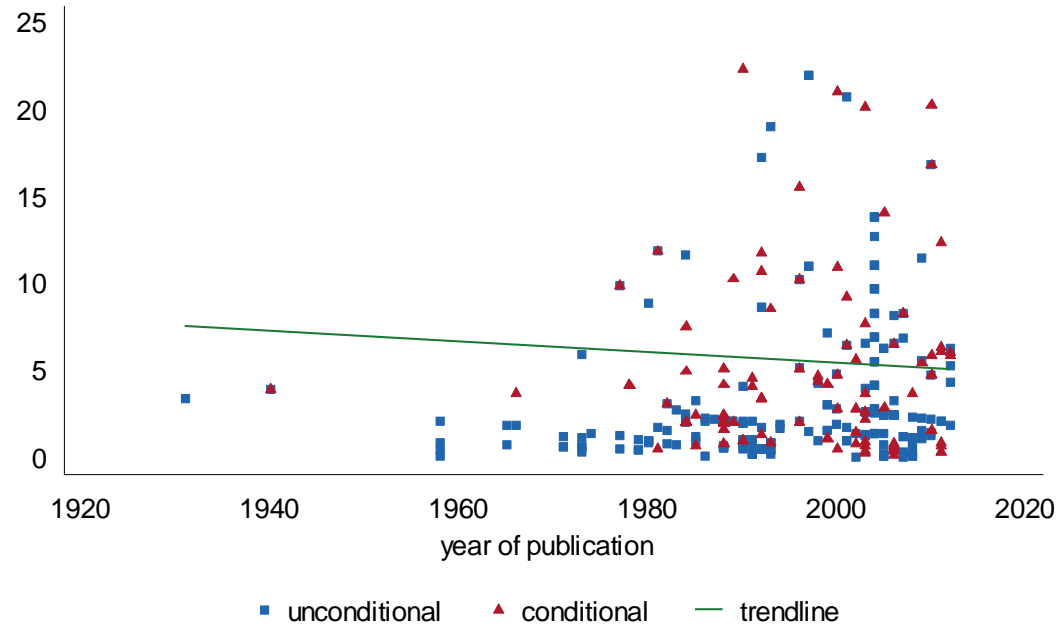


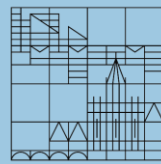


Appendix IV

incentive value over time

inflation-adjusted incentive value 2011 (N=320)

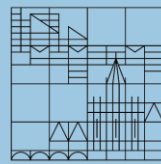




Appendix V

Robustness checks VARIABLES	WLS-FAT-PET		FE-ML		RE-ML	
	logOR	se	logOR	se	logOR	se
incentive-value (per 5\$)	0.0996***	(0.0312)	0.122***	(0.0247)	0.115***	(0.0188)
squared incentive-value (per 5\$)	-0.00266***	(0.000847)	-0.00285***	(0.000845)	-0.00280***	(0.000647)
unconditional	0.335***	(0.0807)	0.153	(0.0953)	0.257***	(0.0661)
monetary	0.241**	(0.119)	0.159	(0.106)	0.175**	(0.0803)
interaction uncond. mon.	0.117	(0.133)	0.442***	(0.124)	0.295***	(0.0907)
country: Europe (reference: Northern America)	0.00251	(0.0641)			-0.00479	(0.0801)
country: Australia/ Oceania	-0.0707	(0.0785)			-0.0515	(0.115)
country: Asia	0.190**	(0.0963)			0.234	(0.298)
highest lottery incentive	0.000410**	(0.000185)	0.000557**	(0.000277)	0.000384**	(0.000188)
adjusted sample	0.0186	(0.0517)			-0.0425	(0.0674)
pop: health (reference: general)	-0.137	(0.0928)			-0.109	(0.112)
pop: customers	-0.139	(0.123)			-0.170	(0.137)
pop: education	0.0157	(0.0702)			0.0686	(0.123)
pop: others	0.0111	(0.0723)			0.0884	(0.0945)
top: social (reference: market research)	-0.0312	(0.0616)			0.0193	(0.0876)
top: health	0.0344	(0.0772)			0.0702	(0.0971)
top: others	-0.160*	(0.0962)			-0.225*	(0.128)
qual: unclear (reference: nonrandom)	-0.243*	(0.125)			-0.264*	(0.136)
qual: random	-0.166	(0.121)			-0.190	(0.129)
internet	0.255***	(0.0928)			0.215*	(0.120)
year of study	-0.00747**	(0.00341)			-0.00675**	(0.00289)
reminder	-0.0214	(0.0200)			-0.0157	(0.0272)
SE (FAT)	-0.730*	(0.370)	0.824	(1.076)	-0.677*	(0.380)
constant (PET)	0.736***	(0.236)	-0.0456	(0.151)	0.681***	(0.167)
Observations	296		296		296	
R-squared	0.552		0.865			
Number of q_StudyID			157		157	
Robust standard errors in parentheses						

*** p<0.01, ** p<0.05, * p<0.1



Appendix VI

Robustness checks	WLS-FAT-PET		+ page length		outlier robust	
VARIABLES	logOR	se	logOR	se	logOR	se
incentive-value (per 5\$)	0.0996***	(0.0312)	0.0786**	(0.0303)	0.0968***	(0.0305)
squared incentive-value (per 5\$)	-0.00266***	(0.000847)	-0.00193**	(0.000783)	-0.00261***	(0.000830)
unconditional	0.335***	(0.0807)	0.393***	(0.106)	0.317***	(0.0780)
monetary	0.241**	(0.119)	0.369***	(0.127)	0.218*	(0.119)
interaction ucond. mon.	0.117	(0.133)	-0.109	(0.154)	0.130	(0.134)
country: Europe (reference: Northern America)	0.00251	(0.0641)	-0.0317	(0.0881)	-0.00736	(0.0651)
country: Australia/ Oceania	-0.0707	(0.0785)	0.106	(0.140)	-0.0872	(0.0780)
country: Asia	0.190**	(0.0963)	0.120	(0.113)	0.190**	(0.0936)
highest lottery incentive	0.000410**	(0.000185)	0.000428	(0.000272)	0.000341*	(0.000174)
adjusted sample	0.0186	(0.0517)	0.0251	(0.0548)	0.0225	(0.0517)
pop: health (reference: general)	-0.137	(0.0928)	-0.198**	(0.0956)	-0.158*	(0.0884)
pop: customers	-0.139	(0.123)	-0.00134	(0.101)	-0.150	(0.122)
pop: education	0.0157	(0.0702)	0.189	(0.116)	0.00890	(0.0694)
pop: others	0.0111	(0.0723)	0.0323	(0.0766)	-0.00341	(0.0711)
top: social (reference: market research)	-0.0312	(0.0616)	0.196*	(0.101)	-0.0257	(0.0625)
top: health	0.0344	(0.0772)	0.162*	(0.0851)	0.0542	(0.0750)
top: others	-0.160*	(0.0962)	-0.0455	(0.0996)	-0.146	(0.0945)
qual: unclear (reference: nonrandom)	-0.243*	(0.125)	-0.319*	(0.174)	-0.242*	(0.124)
qual: random	-0.166	(0.121)	-0.238	(0.162)	-0.156	(0.119)
internet	0.255***	(0.0928)	0.110	(0.0903)	0.253***	(0.0926)
year of study	-0.00747**	(0.00341)	-8.64e-05	(0.00257)	-0.00788**	(0.00338)
reminder	-0.0214	(0.0200)	-0.0403**	(0.0195)	-0.0175	(0.0196)
SE (FAT)	-0.730*	(0.370)	-0.392	(0.311)	-0.616*	(0.366)
page length (questionnaire)			-0.0109***	(0.00387)		
constant (PET)	0.736***	(0.236)	0.294	(0.217)	0.762***	(0.233)
Observations	296		179		294	
R-squared	0.552		0.537		0.562	
Robust standard errors in parentheses						
*** p<0.01, ** p<0.05, * p<0.1						