## Item Sum: A New Technique for Asking Quantitative Sensitive Questions

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Questions on Sensitive Topics and Social Desirability Bias

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1. Develop a privacy preserving survey-based technique to measure continuous sensitive characteristics
2. Derive estimators to compare with standard (direct) questioning ('more-is-better assumption') and to estimate individual expectations
3. Application in the context of a CATI study on undeclared work

## Problems associated with sensitive topics

"A question is sensitive when it asks for a socially undesirable answer, when it asks in effect, that the respondent admits he or she has violated a social norm."
(Tourangeau and Yan 2007:860)

- Biased estimates of undeclared work via direct questioning as a consequence of non-random (Tourangeau and Smith 1996: 276)
- partial nonresponse (break-offs),
- (item-)nonresponse (refusal),
- misreporting (here: underreporting)


## Measurement of undeclared work, a brief review

- Wording
- forgiving wording (Mummert and Schneider 2001),
- loading of questions (Mummert and Schneider 2001),
- asking about long periods/distant past (Lamnek et al. 2000),
- paraphrasing (Wolff 1991; Eurobarometer 2007), examples: the "Casual Approach", "Everybody Approach" or the "Other People Approach" etc. (Barton 1958)
- Mode change
- self-administration methods
$\rightarrow$ Variation of estimates from surveys:
12.5 hours (Eurobarometer 2007) to 7.3 hours (Feld and Larsen 2008)
$\rightarrow$ Recommendation to "consider alternatives to standard questioning [...]"
(Bradburn et al. 2004: 81; cf. also Boockmann et al. 2010: 100)


## The idea: Increase perceived privacy protection $=I A B$

- indirect survey-based estimation techniques that minimize respondent's feeling of jeopardy
- by 'scrambling' the individual response in such a way, that it is impossible for the interviewer or the researcher to know the true answer, i.e. introducing random 'noise'
- examples for binary items comprise the randomized response technique, the item count technique, etc.


## Implementation of the item sum technique (IST)

Group LL (Long List)

C1: How many hours did you watch TV last week?
S1: How many hours per week do you usually engage in undeclared work?

## Group SL (Short List)

C1: How many hours did you watch TV last week?

Please sum up the answer to both questions, please, do not report individual answers.

| Group LL (Long List) | Group SL (Short List) |
| :--- | :--- |
| C2: How high are your monthly costs for your | C2: How high are your monthly costs for your |
| apartment respectively your house? |  |$\quad$| S2: How high are your usual earnings per month respectively your house? |
| :--- |
| engaging in undeclared work? |

Please sum up the answer to both questions, please, do not report individual answers.

Preceded by brief definitions of undeclared work and instructions regarding the technique if in treatment group. Embedded in items on employment, predictors of undeclared work and sociodemographics.

Mode

Randomization

Structure
(Hours \& Earnings)

## CATI Study

split-ballot experiment
Sample
( $\mathrm{n}=3,211$ )

Direct Questioning
CATI Study

Two random samples from federal employment agency registers (RR1: 17.5 \%):

- register sample of employees (18-70) and
- register sample of basic income support recipients (18-64)


## Estimators: Aggregate estimates

- Let $S$ be the sensitive item of interest and $C$ be the non-sensitive control item. Observed is:

$$
Y_{i}=\left\{\begin{array}{cl}
S_{i}+C_{i} & \text { if } i \in L L \text { (Long List) } \\
C_{i} & \text { if } i \in S L \text { (Short List) }
\end{array}\right.
$$

- The mean difference of $Y$ between the two groups is an unbiased estimate of the population mean of $S$ :

$$
\hat{E}(S)=\hat{E}_{L L}(Y)-\hat{E}_{S L}(Y)
$$

- The sampling variance of the mean estimate of $S$ is given as:

$$
\hat{v}[\hat{E}(S)]=\hat{v}\left[\hat{E}_{u L}(Y)\right]+\hat{v}\left[\hat{E}_{s L}(Y)\right]
$$

Aggregate estimates: Hours per week
DQ: Direct



- Point Estimate

95\%-Confidence-Interval

## Estimators: Least squares IST

- Let $T_{i}=\left\{\begin{array}{ll}1 & \text { if } i \in L L \\ 0 & \text { if } i \in S L\end{array} \quad\right.$ so that $\quad Y_{i}=T_{i} S_{i}+C_{i}$
- Suppose that $S$ and $C$ both depend linearly on a vector of covariates $X$ and $Z$ (including a constant):

$$
\begin{align*}
& S_{i}=X_{i}^{\prime} \beta+v_{i}, E\left(v_{i}\right)=0  \tag{2a}\\
& C_{i}=Z_{i}^{\prime} \gamma+v_{i}, E\left(v_{i}\right)=0 \tag{2b}
\end{align*}
$$

## Estimators: Least squares IST

- then we can model Y as:

$$
\begin{align*}
Y_{i} & =T_{i}\left(X_{i}^{\prime} \beta+v_{i}\right)+\left(Z_{i}^{\prime} \gamma+v_{i}\right) \\
& =T_{i} \cdot X^{\prime} \beta+Z_{i}^{\prime} \gamma+\varepsilon_{i} \tag{3}
\end{align*}
$$

$$
\begin{aligned}
\text { with } \varepsilon_{i} & =T_{i} \cdot v_{i}+v_{i} \\
\text { hence } E\left(\varepsilon_{i}\right) & =0 \text { and } \sigma_{\varepsilon}=\sigma_{v}^{2}+\sigma_{v}^{2}+2 \rho \sigma_{v} \sigma_{v}
\end{aligned}
$$

- Being a simple mean difference, we can recast the item-sum estimator using linear regression:

$$
Y_{i}=\gamma_{0}+\beta_{0} T_{i}+\varepsilon_{i}, E\left(\varepsilon_{i}\right)=0
$$

## Estimators: Least squares IST

- Extension to include a third sample of respondents for which the sensitive item $S$ was measured via direct questioning $\left(\mathrm{DQ}_{\mathrm{i}}\right)$ yields

$$
Y_{i}=\left(L L_{i}+D Q_{i}\right) \cdot X_{i}^{\prime} \beta+S L_{i} \cdot Z_{i}^{\prime} \gamma+\varepsilon_{i}
$$

- Test of the item sum technique by including indicator LL (or DQ) in $X$.
- Inclusion of interactions between LL and other variables can be used to evaluate, whether effects of regressors differ between techniques.

| Isreg (Jann 2011) | Hours <br> model 1a |  | Earnings <br> model 2a |  |
| :--- | :---: | :--- | :---: | :--- |
| Methods effect: Item sum | .48 |  | $88.41^{* *}$ <br> $(28.55)$ |  |
| (Ref. DQ) |  |  |  |  |
|  |  |  |  |  |
|  |  |  |  |  |
| Constant |  |  |  |  |
| N | .09* |  | $2.36^{* *}$ |  |

Standard errors in parentheses; * p<0.05, ** p<0.01, *** p<0.001; design weights applied; coefficients for the C item are not reported.


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| :--- | :---: | :---: | :---: | :---: |
| Methods effect: Item sum <br> (Ref. DQ) | .48 <br> $(.49)$ | .67 <br> $(.57)$ | $88.41^{* *}$ <br> $(28.55)$ | $92.15^{* *}$ <br> $(33.52)$ |
| Sample effect: Benefit recipient |  | .11 |  | 2.43 |
| (Ref. employees) |  | $(1.73)$ |  |  |
| Interaction: Item sum * benefit |  | -.97 |  | -39.12 |
| Constant | $.09 *$ | $(.93)$ |  | $(3.56)$ |
| $\mathbf{N}$ | $(.04)$ | $(.04)$ | $(.73)$ | $(.82)$ |

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| :---: | :---: | :---: | :---: | :---: |
| Methods effect: Item sum (Ref. DQ) | $\begin{gathered} .48 \\ (.49) \end{gathered}$ | $\mid$ | $\begin{aligned} & \text { 88.41** } \\ & (28.55) \end{aligned}$ | $\begin{aligned} & 92.15^{* *} \\ & (33.52) \end{aligned}$ |
| Sample effect: Benefit recipient (Ref. employees) |  | $\begin{gathered} .11 \\ (.09) \end{gathered}$ |  | $\begin{gathered} 2.43 \\ (1.73) \end{gathered}$ |
| Interaction: Item sum * benefit |  | $\left\lvert\, \begin{aligned} & ----97 \\ & 1 \\ & (.93)\end{aligned}\right.$ |  | $\begin{aligned} & -39.12 \\ & (38.56) \\ & \hline \end{aligned}$ |
| Constant | $\begin{aligned} & .09 * \\ & (.04) \\ & \hline \end{aligned}$ | $\begin{gathered} .07 \\ (.04) \\ \hline \end{gathered}$ | $\begin{gathered} 2.36 * * \\ (.73) \\ \hline \end{gathered}$ | $\begin{aligned} & \text { 1.99* } \\ & \text { (.82) } \end{aligned}$ |
| N | 3,072 | 3,072 | 3,003 | 3,003 |

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- generalizing the item count technique we have presented a new privacy preserving technique for metric sensitive items and applied it in a study on undeclared work
- we have derived point estimators and regression estimators for IST variables
- results indicate that the item sum technique (IST) can be fruitful in yielding higher estimates of the socially undesirable behaviour than direct questioning


## Limitations

- differential item nonresponse between treatment conditions contaminates randomization
- low statistical power, i.e. large standard errors of point estimates and regression coefficients: Trade-off with privacy preservation
- modelling issues:
- natural lower bound of 0 for individual values of S not accounted for (hurdle and zero inflated models)
- transformation of dependent variable


## Implications and future work

However, due to the following reasons we suggest further inquiries to fully understand the mechanisms at work before implementing this new technique in labor market surveys:

- choice of the innocuous item
- test of assumptions required
- efficiency concerns
- comparison to other methods


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