

# Evaluating Perceived Burden of Household Survey Respondents

Daniel K. Yang  
Office of Survey Methods Research  
U.S. Bureau of Labor Statistics  
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*The views expressed in this paper are those of the author and do not necessarily reflect the policies of the Bureau of Labor Statistics*



# Overview

- I. Consumer Expenditure Surveys (CE)  
Redesign and burden measurement.
- II. Data and other questions indicate burden.
- III. Burden proxy indicators.
- IV. Explore recursive partitioning models.

# I. Respondents' Burden Perception

- ❑ CE interview is almost an hour long, non-trivial questions
- ❑ Gemini: redesign the CE to improve data quality, through a verifiable reduction in measurement error.
- ❑ Important: able to measure respondent burden (could contribute to data quality).
- ❑ How to best evaluate respondents' perceived level of burden is still an open question.

## II. Burden Questions

- ❑ Between October 2012 and September 2013, a series of questions were asked in the interview survey at the end of the final wave, including ten questions assessing respondents' perceived burden, e.g.
- ❑ How burdensome was this survey to you?
  - Not at all burdensome
  - A little burdensome
  - Somewhat burdensome
  - Very burdensome

# Burden Questions (cont.)

- ❑ Would you say that this was too many interviews?
  - A reasonable number
  - Too many interviews
- ❑ Thinking about the amount of effort that you put forth into answering today's survey, would you say that you put forth:
  - A little effort
  - A moderate amount of effort
  - A lot effort

# Burden Measures

- ❑ We have three burden measures:
  - Single Burden Question (or item),
  - Likert Scales Summation Scores (or Likert scales sum): a simplified alternative computes a summation of burden questions (in Likert scales), and
  - Composite Burden Index Scores: weighted, involves a correlation matrix of burden questions (Yang 2015 & 2017).

# PCA Loadings Output of Polychoric Correlation Matrix of Burden Questions

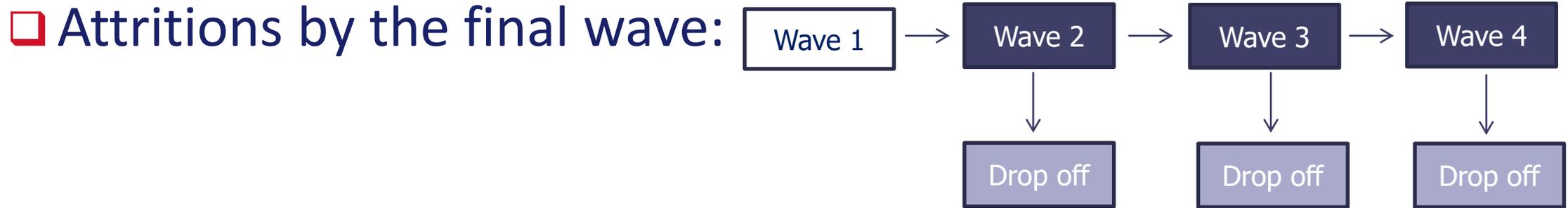
|       | Comp.1 | Comp.2 | Comp.3 | Comp.4 | Comp.5 | Comp.6 | Comp.7 | Comp.8 | Comp.9 | Comp.10 |
|-------|--------|--------|--------|--------|--------|--------|--------|--------|--------|---------|
| blen  | -0.356 | 0.104  | 0.138  | -0.239 |        | 0.469  | 0.599  | 0.124  | -0.146 | 0.407   |
| bint  | -0.325 | -0.281 | 0.144  |        | -0.458 | -0.502 | 0.171  | 0.544  |        |         |
| bdiff | -0.257 | 0.180  | -0.610 | -0.567 | -0.341 |        | -0.218 |        | -0.117 | -0.123  |
| bnwv  | -0.380 |        | 0.270  |        |        |        | 0.273  | -0.454 |        | -0.707  |
| bbur  | -0.382 | 0.151  |        |        | 0.129  | -0.180 |        |        | 0.859  | 0.185   |
| bsen  | -0.305 | 0.239  | -0.349 | 0.176  | 0.653  | -0.342 |        | 0.215  | -0.311 |         |
| bano  | -0.372 |        | 0.210  |        |        | -0.247 | -0.325 | -0.513 | -0.343 | 0.496   |
| bext  | -0.345 |        | 0.320  |        | 0.156  | 0.440  | -0.613 | 0.391  |        | -0.166  |
| beff  |        | 0.848  | 0.180  | 0.317  | -0.367 |        |        |        |        |         |
| btrs  | -0.247 | -0.255 | -0.462 | 0.691  | -0.241 | 0.34   |        |        |        |         |

❑ PCA: Principal Component Analysis



# Data Sample

- ❑ CE has 4 waves, burden questions were only collected from participants in their final wave.



- ❑ Excluded households with missing values in any of the burden questions (items), final sample total had 6,369 households.

## What we found in previous studies ...

- ❑ There is no conclusive evidence of differences in correlations in data quality measures with burden measurements.
- ❑ For both the single burden question and burden scores, excluding most-burdened respondents does not appear to have much of an effect on selected expenditure variable mean estimates.

# Other Questions Indicate Burden

- ❑ CE collects respondent's answer of burden, but there are other objective indicators, e.g. other sets of items people used to indicate burden or burden proxy indicators.
- ❑ So, can burden measures be extrapolated from a set of variables that would indicate burden, e.g. by conditioning on subpopulations?

# III. Burden Proxy Indicators

- ❑ Income: household income before tax
- ❑ Total Time: interview length in minutes
- ❑ Num. Expn.: number of expenditures (unedited)
- ❑ Mortgage: mortgage indicator
- ❑ Conv. Ref.: whether it is a converted refusal
- ❑ Mode: interview mode (personal visit or telephone)

# Burden Proxy Indicators (cont.)

- ❑ Info. Booklet: information booklet usage
  - 5=Almost always (90% of the time or more)
  - 4=Most of the time (50% to 89% of the time)
  - 3=Occasionally (10% to 49% of the time)
  - 2=Never or almost never (less than 10% of the time)
  - 1=The respondent did not have access to the information booklet (ref.)
- ❑ Record: records usage
  - 4=Almost always (90% of the time or more)
  - 3=Most of the time (50% to 89% of the time)
  - 2=Occasionally (10% to 49% of the time)
  - 1=Never or almost never (less than 10% of the time) (ref.)
- ❑ Door Step Concerns (CHI Contact History Instrument)
  - 0=No concerns
  - 1=Privacy/govt. concerns
  - 2=Busy/logistics
  - 3=Other



# IV. Recursive Partitioning

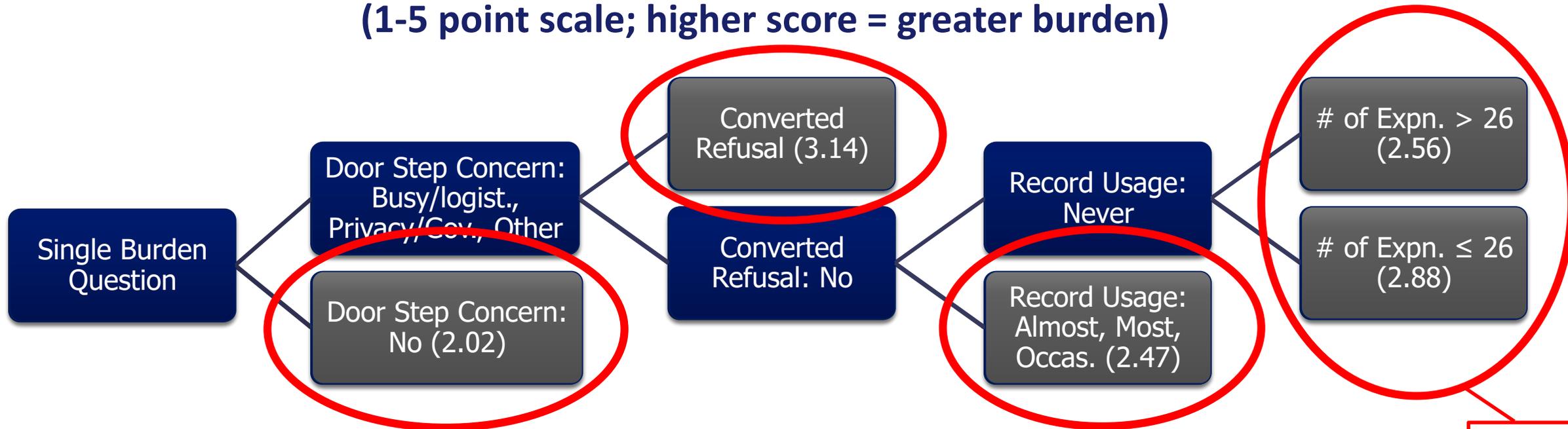
- ❑ Partitions the data space into subpopulations among independent variables to generate a decision tree until a predetermined criterion is met.
- ❑ A decision tree is a “forecasting model” to use input variables (“branch”) to predict a target variable (“leaf”). Classification trees for discrete target variables. Regression trees for continuous target variables.
- ❑ Respondent’s perception of burden could be very different for different subpopulations.
- ❑ Recursive Partitioning for Modeling Survey Data {rpms} R package

{rpms}: node sample size 200, permutation test p-value = 0.05



# Decision Tree: Single Burden Question

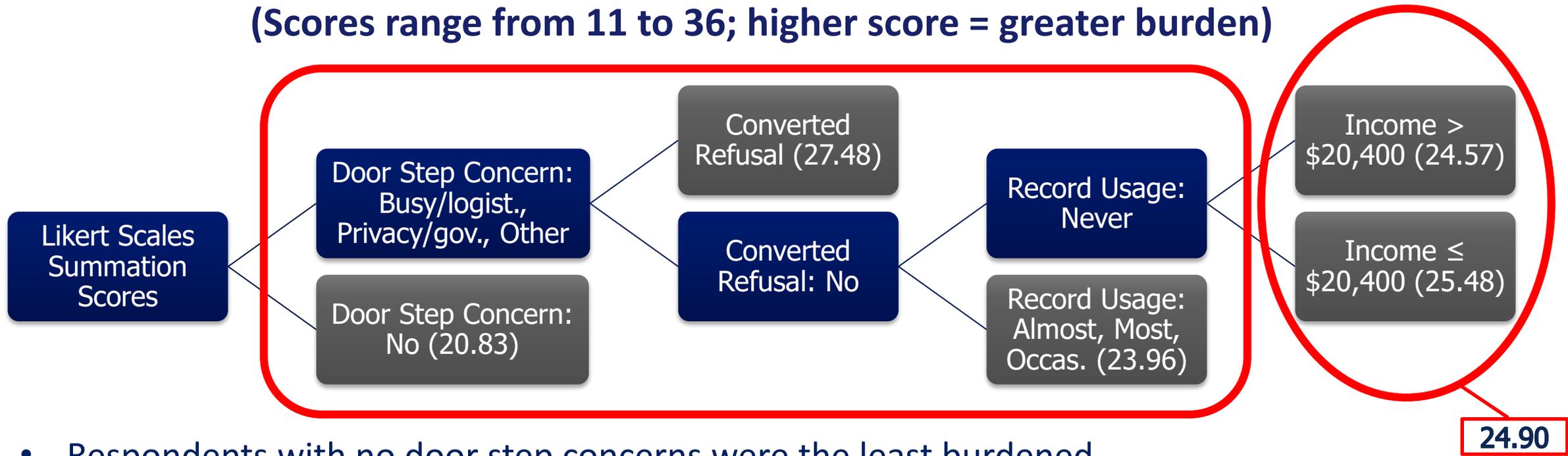
(1-5 point scale; higher score = greater burden)



- Respondents with no door step concerns were the least burdened
- Respondents who expressed concerns and had to be convinced to participate reported the greatest burden
- For respondents with door step concerns, burden index scores were different among subgroups of converted refusal, record usage and number of expenditures.

# Decision Tree: Likert Scales Summation Scores

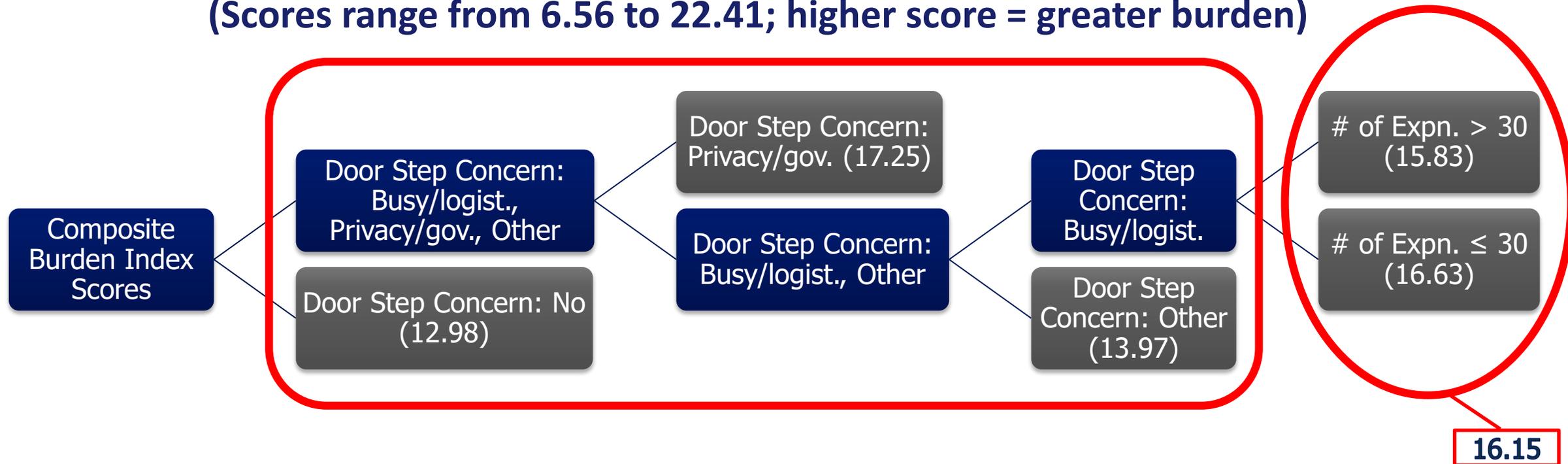
(Scores range from 11 to 36; higher score = greater burden)



- Respondents with no door step concerns were the least burdened
- Respondents who expressed concerns and had to be convinced to participate reported the greatest burden
- For respondents with door step concerns, burden index scores were different among subgroups of converted refusal, record usage, and household income.

# Decision Tree: Composite Burden Index Scores

(Scores range from 6.56 to 22.41; higher score = greater burden)



- Once again, the “No door stop concern” group expressed the lowest level of burden.
- In this model, the specific type of door step concerns expressed by respondents were shown to be related to the composite burden index score.

|              | <b>Single Burden Question</b>     | <b>Likert Scales Summation Scores</b> | <b>Composite Burden Index Scores</b>                  |
|--------------|-----------------------------------|---------------------------------------|---|
| First Split  | Door Step Concerns vs. Not        | Door Step Concerns vs. Not            | Door Step Concerns vs. Not                            |
| Second Split | Converted Refusal vs. Not         | Converted Refusal vs. Not             | Door Step: Privacy, or Gov. vs. Busy, Logistic, Other |
| Third Split  | Record Usage vs. Not              | Record Usage vs. Not                  | Door Step: Busy or Logistic vs. other                 |
| Fourth Split | # of Expn > 26 vs. # of Expn ≤ 26 | Income > \$2.04k vs. Income ≤ \$2.04k | # of Expn > 30 vs. # of Expn ≤ 30                     |



# Burden Proxy Indicators Main Take Away

- For all the three measures of burden, a few proxy measures were repeatedly identified to be associated with burden.
- These measures should be explored in future studies as they may be useful in understanding respondent behaviors that could be caused by burden (e.g., attrition, data quality).

# Possible Next Steps

- ❑ Could new burden proxy indicators be included in the recursive partitioning model? What about the prediction error?
- ❑ Additional exploration of burden index scores regression tree models? (e.g. extrapolate into a new data set?)

# THANK YOU!

A promotional banner for the AAPOR 73rd Annual Conference. The background features a blue-tinted image of snow-capped mountains and a stylized city skyline. In the center, the AAPOR logo is displayed within a blue diamond shape, with the text 'AAPOR' in a large serif font and 'AMERICAN ASSOCIATION FOR PUBLIC OPINION RESEARCH' in a smaller sans-serif font below it. Below the logo, the conference title 'Taking Survey and Public Opinion Research to New Heights!' is written in a bold, italicized sans-serif font, followed by '73rd Annual Conference' and 'May 16-19, 2018'. At the bottom left, the website 'www.aapor.org' is listed, and at the bottom right, the hashtag '#aapor' is followed by social media icons for Facebook, Twitter, LinkedIn, and Instagram.

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# Contact Information

Daniel K. Yang

Research Mathematical Statistician

Office of Survey Methods Research (OSMR)

[www.bls.gov/osmr/home.htm](http://www.bls.gov/osmr/home.htm)

yang.daniel@bls.gov

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