

# Online Panels for Data Collection

*Ron D. Hays and Honghu Liu (UCLA)*

*Arie Kapteyn (USC)*

RCMAR/EXPORT

Methodological Seminar Series

<https://uclahs.webex.com> (meeting # 806 592 178)

December 15, 2014 (3-4pm)

# CTSI Competencies

- 1) Assess the strengths and weaknesses of possible study designs for a given clinical or translational research question.
- 2) Design a research data analysis plan.
- 3) Assess threats to internal validity in any planned or completed clinical or translational study, including selection bias, misclassification, and confounding.



Ron Hays <dr.ronhays@gmail.com>

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**Exciting new survey opportunity!**

1 message

**Opinion Miles Club** <info@opinionmilesclub.com>

To: Ron Hays <drhays@ucla.edu>

Tue, Nov 18, 2014 at 6:32 PM



**New Opportunity to earn  
MileagePlus® award miles**

**Reward: 60 Award Miles**

**Survey Length: 30 Minutes**

Participate now by **clicking here »**

## **You're Invited!**

Dear Ron,

Share your opinions today!

Thanks for participating!

-The Opinion Miles Club Team

<http://www.surveypolice.com/opinion-miles-club>

[https://  
www.opinionmilesclub.com/](https://www.opinionmilesclub.com/)

Bait and switch repeatedly. Plus, they collect information for 20 or more minutes, then say "not a match" or conveniently develop a technical glitch so that you can't complete the survey.

The help desk is beyond frustrating, work off of a script and seem incapable of addressing any problem. The only thing they "help" with is to issue the same stock response and refuse to put one in touch with a supervisor.

This is, by far, one of the absolute worst survey sites ever!

# Non-Probability (Convenience) Internet Panels

- NIH Toolbox
  - Multidimensional set of brief measures assessing cognitive, emotional, motor and sensory function from ages 3 to 85.
- Delve, Inc databases assembled using online self-enrollment, enrollment through events hosted by the company, and telephone calls from market research representatives



# Convenience Internet Panels

- PROs
  - Relatively inexpensive and faster
  - Able to get to low incidence subgroups
- CONs
  - Data integrity
    - False answers
    - Answering too fast
    - Same answer repeatedly
    - Duplicate surveys from same person
  - Respondents may differ from intended target on measured (more educated) and on unmeasured characteristics

# Convenience Internet Panels differ from Underlying Population

- 2002 Health and Retirement Study (HRS) sample of 11,279 of 55 and older population
- 30% reported internet access
- Predicted internet access from
  - Race/ethnicity, gender, education, age, marital status, income, owns house, and self-rated health

Schonlau, M. A. et al. (2009). Selection bias in web surveys and the use of propensity scores. Sociological Methods and Research, 37, 291-318.

# Internet Sample vs. Full Sample

Variable	Internet sample	Weighted internet sample	Full sample
High blood pressure	44%	52%	55%
Depressed	11%	15%	19%
Difficulty dressing	4%	7%	9%
Difficulty walking several blocks	15%	27%	31%



# Probability Panels

- Selection probabilities known.
  - Need sampling frame (denominator)
- Get internet access for those without it.



# ***Telepanel (1980's)***

- Started by Willem Saris, Professor of sociology at the University of Amsterdam
  - Recruited a sample of 1000 Dutch and gave them computers and modems.
  - Panel asked to download a survey every weekend, answer and upload it to the central modem pool.
- Sold panel to a market research agency.

# ***CentERpanel* (1990s)**

- Saris started another (larger) panel
  - Panel size = 3k
- Sold to Tilburg Univ. Center for Economic Research
- *CentERpanel* still exists and is the oldest internet probability panel in the world.

# Subsequent probability panels

- 1999: Knowledge Networks (now GFK), U.S.
  - Address-based sampling
  - Approximate recruiting response rate = 15%
  - Panel size = 55k
- 2006: Longitudinal Internet Studies for the Social Sciences, Netherlands
  - Population registry-based sampling
  - Recruited face-to-face and telephone
  - Approximate recruiting response rate = 45%
  - Panel size = 7.5k

# Subsequent probability panels (2)



- 2006: American Life Panel, U.S.
  - Recruited by RDD, face-to-face, and address-based
  - Approximate recruiting response rate = 15%
  - Panel size = 6k
- 2014: Understanding America Study, U.S.
  - Address-based sampling
  - Approximate recruiting response rate = 20%
  - Panel size = 2k



# Patient-Reported Outcomes Measurement Information System (PROMIS®)

- *Polimetrix* (now *YouGov*)
- Non-probability based recruitment of panel
- > 1 million members who regularly participate in online surveys

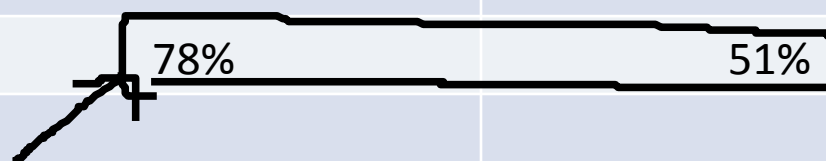
Liu et al. (2010). Representativeness of the Patient-Reported Outcomes Measurement Information System internet panel. J Clinical Epidemiology, 63, 1169-1178.

# Sample-Matching Methodology

- Target subset with selected characteristics
  - $n = 11,796$  overall
  - Subgroups with lower response rates oversampled
- PROMIS targets (“Quota sampling”)
  - 50% female
  - 20% 18-29, 30-44, 45-59, 60-74 and 75+
  - 12.5% black, 12.5% Hispanic
  - 10% < high school graduate

# PROMIS Internet Sample versus Census

	PROMIS Sample	2000 Census
% Female	55%	52%
% Hispanic	13%	11%
% Black	10%	11%
% < High school	3%	20%
% High school/GED	19%	29%
% > High school	78%	51%
Mean age	50	45



A hand-drawn black bracket is drawn across the row for '% > High school', connecting the '78%' value in the 'PROMIS Sample' column to the '51%' value in the '2000 Census' column. A vertical line with a horizontal tick at the bottom extends from the bracket down to the 'PROMIS Sample' column. A diagonal arrow points from the bottom-left corner of the table area towards the vertical line.



# **Analytic Weights**

## **(Post-Stratification Adjustment)**

- Compensate for nonresponse and non-coverage
- Weight sample to have same distribution on demographic variables
  - Gender, age, race/ethnicity, education, marital status, and income
- Iterative proportional fitting or raking

# Raking

- Matches cell counts to the marginal distributions of the variables
- Performs cell-by-cell adjustments
- Repeated iteratively until convergence between the weighted sample and U.S. Census distributions

# Raking Algorithm

- Calculate  $n \downarrow ij \uparrow(1) = N \downarrow i \times n \downarrow ij \uparrow(0) / \sum_j n \downarrow ij \uparrow(0)$   $\rightarrow$  raking over rows
- Calculate  $n \downarrow ij \uparrow(2) = N \downarrow j \times n \downarrow ij \uparrow(1) / \sum_i n \downarrow ij \uparrow(1)$   $\rightarrow$  raking over columns
- Repeat these 2 steps until  $\sum_j n \downarrow ij \uparrow = N \downarrow i$  and  $\sum_i n \downarrow ij \uparrow = N \downarrow j$  for each  $i$  and  $j$ , i.e. "convergence" is achieved

# Raking Example

- Grouping by Gender & Race

Sample	Black	White	Asian	Native American	Other	Sum of Weights	Pop. Sum
Female	300	1200	60	25	30	1615	6500
Male	150	1080	93	30	32	1385	5725
Sum of Weights	450	2280	150	60	60	3000	
Pop. Sum	2000	9000	700	250	275		12225

# Raking Example (-con't)

- Adjust rows first. Multiply each row by *true row pop/estimated row pop* =  $6500/1615$  for female row,  $5725/1385$  for male row

	Black	White	Asian	Native American	Other	Sample Sum	Pop. Sum
Female	1207	4830	241	101	121	6500	6500
Male	620	4464	384	124	132	5725	5725
Sample Sum	1827	9294	626	225	253	12225	
Pop. Sum	2000	9000	700	250	275		12225

- Now row margins are right, but column margins aren't. So, we rake over columns
- Repeat, until convergence

# Raking--Summary

- Response probabilities depend only on the row and column and not on the specific cell
- Allow to include more variables
- Converge to Cell weighting if the auxiliary variables are independent
- Convergence can be slow, and occasionally impossible

# PROMIS Weighted Sample

- A raking benchmarking to variables (gender, age, race/ethnicity, education, marital status and income) common to both the PROMIS and the 2000 Census.
- The weights assigned to individual respondents
- Marginal distributions on auxiliary variables were equivalent between the PROMIS and 2000 Census.

# PROMIS Internet Sample (Weighted) versus Census

	PROMIS Sample	2000 Census
% Female	52%	52%
% Hispanic	11%	11%
% Black	11%	11%
% < High school	20%	20%
% High school/GED	29%	29%
% > High school	51%	51%
Mean age	45	45



# PROMIS General Population Sub-sample

- A subset of the PROMIS internet sample
- Sub-sample approximated the joint distributions of key demographic variables in the 2000 U.S. Census:
  - Age
  - Gender
  - Race/ethnicity

# Algorithm to Obtain PROMIS General Sub-sample

1. Obtain the marginal distribution of gender, age, and race/ethnicity of the PROMIS Internet general population
2. Create grids of cells: 2 (gender: Male, Female)  $\times$  5 (age: 18 to 29, 30 to 44, 45 to 59, 60 to 74, 75+)  $\times$  4 (race/ethnicity: African American, White, Hispanic, Other race) = 40 cells
3. Calculate the frequency of responses for each cell for the PROMIS sample:  $n_{ijk}$  with  $i = 1, 2$ ;  $j = 1, 2, 3, 4, 5$ ;  $k = 1, 2, 3, 4$ .
4. Calculate the corresponding percentage for each cell based on census data (SF4):  $c_{ijk}$  with  $i = 1, 2$ ;  $j = 1, 2, 3, 4, 5$ ;  $k = 1, 2, 3, 4$  with general U.S. population.
5. Compute the sample size for each cell for the sub-sample:
6. Within each cell, draw a random sample from general population.
 
$$n_{ijk} = c_{ijk} \left\{ \min \left( \frac{n_{ijk}}{c_{ijk}} \right) \right\}$$

## GENERAL HEALTH

In general, how would you rate your health? (5 = excellent; 4 = very good; 3 = good; 2 = fair; 1 = poor)

Sample	Mean (1-5 possible score)
PROMIS general population sub-sample	3.53
PROMIS (Weighted)	3.42
2004 Medical Expenditure Panel Survey (MEPS)	3.56
2001-2002 National Health and Nutrition Examination Survey (NHANES)	3.50
2005 Behavioral Risk Factor Surveillance System (BRFSS)	3.52

# Tests of Equivalence

- The non-significance of the traditional differences testing between groups does not allow us to conclude equivalence
  - The observed p-value can only be used as a measure of evidence against  $H_0$ , not for proving  $H_0$
  - Having a small sample would allow us to retain the null hypothesis
  - Need **Equivalence Test**

# Two One-Sided Tests (TOST)

- To test the joint null hypothesis
  - $H_{0a}: \mu_1 - \mu_2 > \delta$  OR
  - $H_{0b}^1: \mu_1 - \mu_2 < -\delta$
- By rejecting *both* of these hypotheses, we can conclude that  $|\mu_1 - \mu_2| < \delta$ , or that our difference falls within the range specified
- The null hypothesis is usually tested by performing two tests at the  $\alpha$  level:

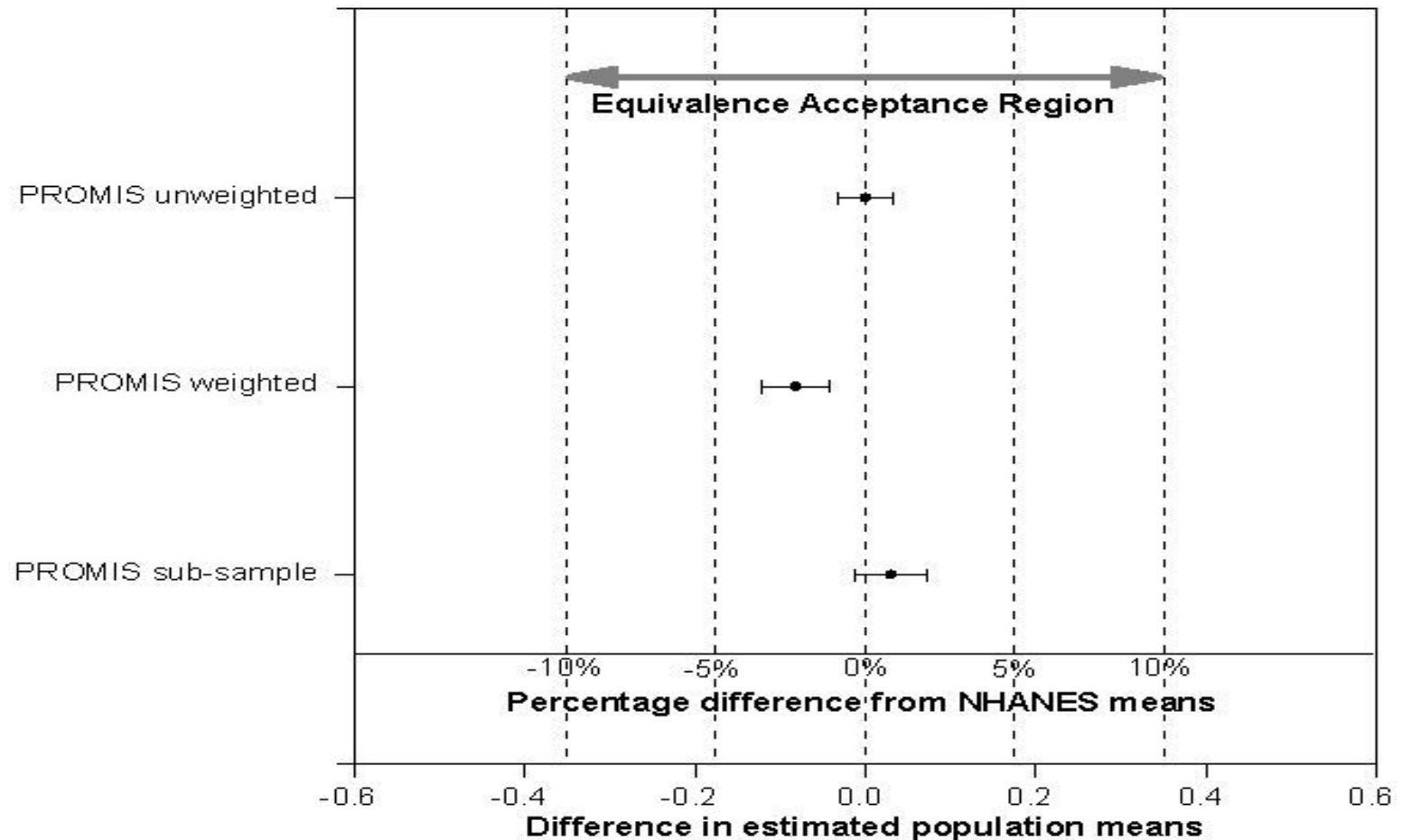
$$\frac{\bar{y}_1 - \bar{y}_2 + \delta}{\sigma \sqrt{\frac{1}{n_1} + \frac{1}{n_2}}} > z_{1-\alpha} \quad \frac{\bar{y}_1 - \bar{y}_2 - \delta}{\sigma \sqrt{\frac{1}{n_1} + \frac{1}{n_2}}} \leq -z_{1-\alpha}$$

# Confidence Interval Approach (CI)

- Specify a range of values that would constitute equivalence among groups
  - $-\delta$  to  $\delta$
- Determine the appropriate confidence interval for the mean difference between the groups
- See if the CI for the difference between means falls entirely within the range of equivalence
  - If lower/upper end falls out of  $[-\delta$  to  $\delta]$  range, do not claim equivalent
- This is equivalent to the TOST

# General Health Comparisons

- PROMIS vs NHANES



# Indeterminacy

- Judgment must be suspended as there is no evidence for or against the hypothesis
- One may not be able to come to a solid conclusion
- May help to avoid the trend of interpretation of 'marginally significant' findings



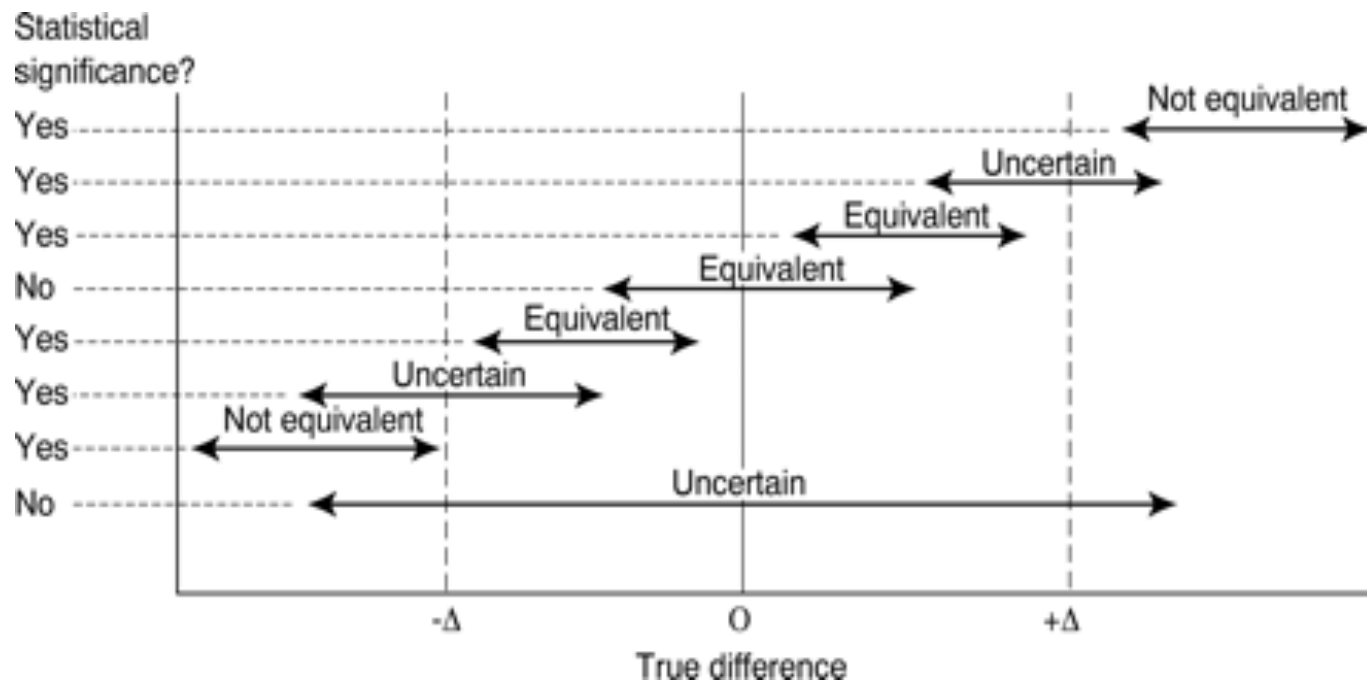


Figure from Jones et al (BMJ 1996) showing relationship between equivalence and confidence intervals.

Thank you and



# Appendix: Are probability internet panels with low response rates superior to convenience panels?

- Coverage of non-internet population
- Selectivity of respondents who sign up for convenience panels.
  - 30% of online surveys completed by 0.25% of the U.S. population (Miller, 2006)
  - 15-25% of vendor samples from a common pool of respondents (Craig et al., 2013)
  - Panel participants belong to 7 online panels (Tourangeau, Conrad, and Couper, 2013)

# Appendix: Comparing probability and convenience panels

- Same questionnaire (on politics) administered to a probability-based telephone (OSU center for survey research), probability-based internet sample (Knowledge Networks) and to a convenience internet sample (Harris Interactive).
- “The probability samples were more representative of the nation than the nonprobability sample in terms of demographics ... even after weighting.”

Chang, L. and J.A. Krosnick (2009), National surveys via RDD telephone interviewing versus the Internet: Comparing sample representativeness and response quality, Public Opinion Quarterly, 73, 641-678.

# Appendix: Average errors for Harris Interactive and Knowledge Networks Versus 2000 Current Population Survey

	Harris Interactive	Knowledge Networks
Education	5%	4%
Income	2%	6%
Age	2%	2%
Race	2%	2%
Gender	2%	3%

Comparison is for weighted panel estimates.