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## 1. Introduction

Sample households in each yearly panel of the Survey of Income and Program Participation (SIPP) are interviewed once every four months for $21 / 2$ years. To facilitate field operations, each panel is divided into four approximately equal subsamples called rotation groups; one rotation group is interviewed in a given month. Thus, one cycle or "wave" of interviewing generally takes four consecutive months. The reference period for the survey is the four months preceeding the interview month. It has been reported by many different survey organizations [1] that the number of times respondents have been exposed to a survey seems to affect the data reported. For many household characteristics, different subsamples with different times-in-sample provide estimates for the same period that differ significantly. In the Current Population Survey (CPS), the sample in each month has eight rotation groups representing subsamples that are in the sample for the first, second ... and eighth time. The existence of bias due to rotation groups has been well-documented for the CPS by Bailar [1].

Time-in-sample biases are non-sampling errors and such biases occur because with time, sample composition changes and/or survey conditions that influence responses change in some significant ways. The ways in which the survey conditions in the CPS tend to change with number of times in sample have been identified by Hanson [3].

For the SIPP, it has been documented by Nelson, Bowie and Walker [6] that noninterview rate increases with waves. An analysis of sample attrition and response patterns of SIPP original sample persons 15 years old and over who survived the sample cut of the fifth/sixth wave is given by McArthur [4] for all 9 interviews of the 1984 Panel. Reasons for noninterviews and characteristics of persons who leave the sample are discussed by Short and McArthur [8] and McArthur [4]. Burkhead [2] shows that month-to-month changes in work status and income recipiency status increase substantially between waves. Such changes in sample composition and/or noninterview rates are likely to contribute to time-in-sample biases. Various kinds of learning effects are another possible source of the time-in-sample bias in a panel survey like SIPP. For example, a respondent may begin participating in a government program which he or she learned about because of the survey. This would give an upward bias to program participation estimates. Also, a respondent may, after several interviews, avoid mentioning the receipt of an income source to avoid having to answer additional questions about that source of income. This would give a downward bias to recipiency estimates.

In this paper, we evaluate the effects of repeated interviews on SIPP characteristics using the 1984 Panel data.
2. SIPP Data Structure and Time-in-Sample

The sample for each yearly panel is divided into 4 subsamples called rotation groups and households in each rotation group are interviewed once every 4 months for the life of the panel which is about $21 / 2$ years. A new panel is introduced every year. This data collection system does not provide the same time-in-sample pattern for each month as in the CPS. Time-insample pattern varies from month to month and quarter to quarter as can be seen from the analysis of data structure for the 1984 Panel that follows.

Table 1 shows the number of rotation groups that provides estimates by reference month and time-in-sample for the 1984 Panel. Unlike CPS, rotation groups in the SIPP cannot be directly equated to time-in-sample effects. Waves of interviews generally indicate the time-in-sample for rotation groups. For the 1984 Panel, $T_{i}$, ith time-in-sample, and $W_{i}$, ith wave, are related as follows:

For rotation groups $1 \& 2 \quad T_{\mathbf{j}}=\mathbf{W}_{\mathbf{i}} \quad \mathbf{i}=1,2, \ldots 9$
For rotation group $3 \quad\left\{\begin{array}{l}T_{i}=W_{i}, i=1,2, \ldots 7 \\ T_{8}=W_{9}\end{array}\right.$

For rotation group 4

$$
\left\{\begin{array}{l}
T_{1}=W_{1} \\
T_{i}=W_{i+1}, \quad i=2, \ldots 8
\end{array}\right.
$$

It can be seen from Table 1 that begining with the 4th quarter of 1983, two estimates of a characteristic reflecting two time-in-sample effects can be obtained for most reference months. For example, for October 1983 three rotation groups that are first time-in-sample provide an estimate and one rotation group that is second time-in-sample provides another estimate. The two estimates from households that are first time-in-sample and the households that are second time-in-sample would have the same expected value (i.e., true value) if the time-in-sample has no effect on estimates. However, if the two estimates differ significantly, then we can infer that time-insample introduces a bias in an estimate.

It can be seen from Table 1 that although households in each rotation group are repeatedly interviewed ( 9 times for the 1984 Panel), monthly and quarterly estimates provide direct comparison of only two consecutive time-in-
 example, 0ctober 1983 has households interviewed only first and second times and February 1984 has households interviewed second and third times. Similarly, the first quarter of 1984 has
households interviewed second and third times. Only the fourth quarter of each year, 1983, 1984 and 1985, provides two estimates reflecting two time-in-sample effects for all three months in the quarter. Thus, unlike CPS, SIPP data does not provide direct comparisons of effects of all nine repeated interviews. The 1984 Panel data provide an annual estimate for 1984 from households interviewed 2nd, 3rd, 4th and 5th times, and an annual estimate for 1985 from housheolds interviewed 5th to 8th times. Two or more annual estimates reflecting different time-in-sample effects cannot be obtained from the 1984 panel for the year 1984 or 1985.

In the SIPP each monthly interview collects data for four previous months and thus the recall period for any reference month ranges from 1 to 4 months. Table 2 presents a reconstruction of time-in-sample and length of recall patterns for six reference months (Oct., Nov. and Dec. 1983 and Feb., March, April 1984). It will be seen that the two times-insample have different recall lengths. For example, the average lenght of recall is 2 and 4 months respectively for 1 st and 2 nd time-insample estimates for October 1983. For November 1983, estimates have average recall periods 1.5 and 3.5 months respectively. The recall pattern is the same for each time-in-sample comparison ( i and $\mathrm{i}+1$, $\mathrm{i}=1,2 \ldots 8$ ). Thus, time-insample comparisons are confounded with recall biases such as telescoping and memory loss if such biases are present. However, note that in the SIPP, information for previous 4 months are obtained at the same interview and consequently, tend to be very similar. An analysis of September 1983 data by Singh [9] did not reveal any statistically significant recall biases. We assume, therefore, that the time-in-sample comparisons for SIPP monthly estimates are not likely to be affected by recall biases.

## 3. Estimates of Time-in-Sample Bias

The 1984 SIPP 9-wave data file was used for this research. Two estimates for each reference month reflecting two time-in-sample effects (as shown in Table 1) were computed for selected characteristics. An overview of weighting procedures for SIPP is given in Nelson, McMillen and Kasprzyk [5]. Variances of these monthly estimates were computed by the replicate weighting method developed by Fay and documented in Roebuck [7]. The difference between two estimates for a given month was tested for statistical significance at the $5 \%$ level. A statistically significant difference would indicate the existence of bias due to time-insample effects.

As mentioned earlier, direct comparison of only two consecutive interviews ( $i$ and $i+1$, $i$ $=1,2, \ldots 8$ ) could be made. The results are given in the next section.

## 4. Results

Two estimates of totals of selected person characteristics for October 1983 are given in Table 3. One estimate is based on 3 rotation groups that are first time-in-sample and the second estimate is based on one rotation group
that is second time-in-sample (see Table 1). The difference between two estimates and the standard error (S.E.) of the difference for each characteristic are also given in Table 3. It will be seen that two estimates by two times-insample are significantly different at the 5\% level for only 3 labor force activity items. These three items are number of persons 16 years and over who were (1) absent 1 or more weeks without pay, (2) with job part of the month, and (3) spent time looking for work or on layoff. The three items are not independent. It must be noted that time-in-sample has no statistically significant effect on estimates for 12 earnings and benefit recipiency items considered in this study. It should be mentioned that questionnaire designs and interviewing techniques are different for labor force activity items and income items. Labor force questions are asked independently at each interview (without reference to past responses), whereas, all sources of income are updated through an income update roster which relies on responses from previous interviews. This difference in interviewing methods may explain why some labor force activity items (but no earnings and benefit recipiency items) show a significant difference.

Overali, only 3 out of 26 person characteristics considered in this study were significant at the $5 \%$ level. And all 26 items are not independent; some labor force items are correlated in the sense that a person could have more than one labor force characteristics during a month. Three tests out of 26 such tests at the $5 \%$ level could be significant by chance, when there is no time-in-sample bias. Thus, we conclude that SIPP monthly estimates for person characteristics were not significantly affected by time-in-sample biases.

Monthly estimates of eight selected household characteristics for October 1983 are given in Table 4 for all households. Only one estimate, number of households receiving public or subsidized rental housing, shows a significant effect of time-in-sample bias.

We have compared estimates from all consecutive interviews (i\& i $+1, i=1$, $2, \ldots 8)$. Results regarding the effects of time-in-sample for 2nd \& 3rd, 3rd \& 4th, ... 8th \& 9th interviews are similar to results for 1 st and 2nd interviews provided in Tables 3 \& 4. Therefore, a summary of results from all consecutive times-in-sample (time i \& i +1 , $\mathbf{i}=$ $1,2, \ldots 8$ ) is given in Table 5 . Note that a comparison of effects of two consecutive times-in-sample on a characteristic can be obtained from three months. For example, October, November and December of 1983 provide estimates of time 1 and time 2 (see Table 1). Monthly estimates and differences were computed for 26 person characteristics and 8 household characteristics (see tables 3 and 4). The average number of significant differences per month, and \% significant differences are given in Table 5. It can be seen from Table 5 that for person characteristics for both sexes, 7.7\% differences are significant between times 1 and $2,12.7 \%$ between times $2 \& 3$ and between times 3 \& $4,2.5 \%$ between times $7 \& 8$ and $10.3 \%$ between times 8 \& 9 . For all eight time-in-sample
comparisons, $9.5 \%$ of the differences are significant for both sexes and $7.1 \%$ for males and $7.4 \%$ for females. Note that differences are significant mostly for labor force activity items which are not independent. For persons with earnings or receiving noncash benefits only about $2 \%$ of the differences are significant. For household characteristics, 6.2\% of the differences are significant. Overall $9.5 \%$ of the 624 t-tests on time-in-sample differences for person characteristics were found to be significant. Given that the labor force characteristics are not independent and also, the eight successive time-in-sample differences are not independent, these results could occur. by chance when no time-in-sample differences exist. We, therefore, conclude that SIPP monthly estimates for the 1984 Panel were not affected significantly by time-in-sample biases.

## 5. Summary

(1) Our analysis of the 1984 Panel data show that SIPP monthly estimates were not generally affected by time-in-sample biases. Only a few correlated labor force activity items were affected significantly.
(2) These preliminary results are encouraging but should be treated as tentative being based on only one panel data. Analysis of data from $1985+$ panels would be necessary to evaluate the effects of time-in-sample bias on SIPP estimates.
(3) No direct comparison of effects of all nine interviews could be made from the 1984 Panel. Such comparisons can be made in the future using other administrative records e.g., IRS data and/or data from two or three SIPP panels.
(4) As SIPP data accumulate, studies of various ways in which survey conditions change with time and the impact of these changes on sample estimates would help in understanding and hopefully, controlling time-in-sample biases.

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TABLE 1. Number of Rotation Groups that Provides Estimates by Month and Time-in-Sample: 1984 Pane 1

Number of Rotation Groups

| Reference |  |  |  | -S |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Month | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 |
| 1983 |  |  |  |  |  |  |  |  |  |
| June | 1 | 0 |  |  |  |  |  |  |  |
| July | 2 | 0 |  |  |  |  |  |  |  |
| August | 3 | 0 |  |  |  |  |  |  |  |
| Sept. | 4 | 0 |  |  |  |  |  |  |  |
| Oct. | 3 | 1 |  |  |  |  |  |  |  |
| Nov. | 2 | 2 |  |  |  |  |  |  |  |
| Dec. | 1 | 3 |  |  |  |  |  |  |  |
| 1984 |  |  |  |  |  |  |  |  |  |
| Jan. |  | 4 | 0 |  |  |  |  |  |  |
| Feb. |  | 3 | 1 |  |  |  |  |  |  |
| March |  | 2 | 2 |  |  |  |  |  |  |
| April |  | 1 |  |  |  |  |  |  |  |
| May |  |  | 4 | 0 |  |  |  |  |  |
| June |  |  | 3 | 1 |  |  |  |  |  |
| July |  |  | 2 | 2 |  |  |  |  |  |
| August |  |  | 1 | 3 |  |  |  |  |  |
| Sept. |  |  |  | 4 | 0 |  |  |  |  |
| Oct. |  |  |  | 3 | 1 |  |  |  |  |
| Nov. |  |  |  | 2 | 2 |  |  |  |  |
| Dec. |  |  |  | 1 | 3 |  |  |  |  |
| 1985 |  |  |  |  |  |  |  |  |  |
| Jan. |  |  |  |  | 4 | 0 |  |  |  |
| Feb. |  |  |  |  | 3 | 1 |  |  |  |
| March |  |  |  |  | 2 | 2 |  |  |  |
|  |  |  |  |  | 1 | 3 |  |  |  |
| May |  |  |  |  |  | 4 | 0 |  |  |
| June |  |  |  |  |  | 3 | 1 |  |  |
|  |  |  |  |  |  | 2 | 2 |  |  |
| August |  |  |  |  |  | 1 | 3 |  |  |
| Sept. |  |  |  |  |  |  | 4 | 0 |  |
| 0ct. |  |  |  |  |  |  | 3 | 1 |  |
| Nov. |  |  |  |  |  |  | 2 | 2 |  |
| Dec. |  |  |  |  |  |  | 1 | 3 |  |
| 1986 |  |  |  |  |  |  |  |  |  |
| Jan. |  |  |  |  |  |  |  | 4 | 0 |
| Feb. |  |  |  |  |  |  |  | 3 | 1 |
| March |  |  |  |  |  |  |  | 2 | 2 |
| Apri1 |  |  |  |  |  |  |  |  | 2 |
| May |  |  |  |  |  |  |  | 0 | 3 |
| June |  |  |  |  |  |  |  | 0 | 2 |
| July |  |  |  |  |  |  |  | 0 | 1 |

Table 2. Time-in-Sample and Length of Recall for Reference Months

| Reference <br> Month | Rotation <br> Group <br> Number | Length of <br> Recall in <br> Months | Rotation <br> Group <br> Number | Length of |
| :--- | :--- | :--- | :--- | :--- |
|  |  |  |  |  |

First Time-in-Sample Second Time-in-Sample

| 0ct. '83 | $\begin{aligned} & 2 \\ & 3 \\ & 4 \end{aligned}$ | $\begin{aligned} & 1 \\ & 2 \\ & 3 \end{aligned}$ | 1 | 4 |
| :---: | :---: | :---: | :---: | :---: |
| Nov. '83 | $\begin{aligned} & 3 \\ & 4 \end{aligned}$ | $\begin{aligned} & 1 \\ & 2 \end{aligned}$ | $\begin{aligned} & 1 \\ & 2 \end{aligned}$ | $\begin{aligned} & 3 \\ & 4 \end{aligned}$ |
| Dec. '83 | 4 | 1 | $\begin{aligned} & 1 \\ & 2 \\ & 3 \end{aligned}$ | $\begin{aligned} & 2 \\ & 3 \\ & 4 \end{aligned}$ |
|  | Second | Time-in-Sample | Third | Time-in-Sample |
| Feb. '84 | $\begin{aligned} & 2 \\ & 3 \\ & 4 \end{aligned}$ | $\begin{aligned} & 1 \\ & 2 \\ & 3 \end{aligned}$ | 1 | 4 |
| March '84 | $\begin{aligned} & 3 \\ & 4 \end{aligned}$ | $\begin{aligned} & 1 \\ & 2 \end{aligned}$ | $\begin{aligned} & 1 \\ & 2 \end{aligned}$ | $\begin{aligned} & 3 \\ & 4 \end{aligned}$ |
| April '84 | 4 | 1 | 1 2 3 | $\begin{aligned} & 2 \\ & 3 \\ & 4 \end{aligned}$ |

Table 3. Monthly Estimates of Selected Person Characteristics by Time-in-Sample for October 1983

| Ferson Characteristics | Time-in-Sample <br> BOTH SEXES |
| :--- | :--- |
| (Numbers in Thousands) |  |


| Labor Force Activity Status: |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: |
| Total 16 years and over | 175880 | 176290 | -410 | 3640 |
| With some Labor Force Act. | 115060 | 112710 | 2350 | 2427 |
| With Job Entire Month | 101370 | 100750 | 620 | 2221 |
| Worked Each Week | 98844 | 99128 | -284 | 2258 |
| Full-Time Worker | 79278 | 78285 | 993 | 1928 |
| Part-Time Worker | 19566 | 20844 | -1 278 | 741 |
| Absent 1 or more weeks w/o pay | 2530 | 1625 | 905 | 238 |
| Spent time on layoff | 390 | 258 | 132 | 81 |
| With Job Part of Month | 4013 | 2277 | 1736 | 246 |
| Time looking for work or on layoff | 2251 | 1130 | 1121 | 205 |
| No Job During Month | 9677 | 9677 | -0- | 564 |
| Looking for work/on layoff all mo. Looking for work or on layoff part | 8659 | 8599 | 60 | 487 |
| of month | 1018 | 1087 | -69 | 184 |
| With no Labor force Activity | 60813 | 63580 | -2 767 | 2190 |
| Persons With Earnings: |  |  |  |  |
| 16 years and over | 101110 | 98081 | 3029 | 2253 |
| 16 to 19 years | 6077 | 5612 | 465 | 432 |
| 20 to 24 years | 14207 | 13408 | 799 | 747 |
| 25 to 34 years | 29605 | 29326 | 279 | 1098 |
| 35 to 44 years | 21913 | 22258 | -345 | 791 |
| 45 to 54 years | 15360 | 14708 | 652 | 696 |
| 55 to 64 years | 11260 | 10546 | 714 | 516 |
| 65 years and over | 2692 | 2222 | 470 | 254 |
| Received Selected Sources of Noncash benefits: |  |  |  |  |
| Medicaid: |  |  |  |  |
| Total 16 years and over | 10421 | 11187 | -766 | 776 |
| 65 years and over | 2368 | 2000 | 368 | 236 |
| Medicare: |  |  |  |  |
| Total 16 years or over | 27635 | 27833 | -198 | 1049 |
| 65 years and over | 25297 | 25630 | -333 | 1018 |

Table 4. Monthly Estimates of Selected Household Characteristics by Time-in-Sample for October 1983


* Significant at 5\% level

Table 5. Significant Differences in monthly estimates due to Time-in-Sample Effects

| CHARACTERISTICS |  |  |  |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Time-in-Sample |  |  |  |  |  |  |  |  |
| 1 \& 2 | $2 \& 3$ | 3 \& 4 | \& 5 | $5 \& 6$ | $6 \& 7$ | 788 | $8 \& 9$ | Al1 |
| PERSON CHARACTERISTICS BOTH SEXES |  |  |  |  |  |  |  |  |
|  |  |  |  |  |  |  |  |  |
| Av. number of significant differences 2.0 | 3.3 | 3.3 | 2.0 | 2.3 | 3.0 | 0.7 | 2.7 | 2.5 |
| \% Significant differences 7.7 | 12.7 | 12.7 | 7.7 | 8.8 | 11.5 | 2.5 | 10.3 | 9.5 |
| MALE |  |  |  |  |  |  |  |  |
| Av. number of significant differences 3.3 | 2.7 | 2.0 | 0.3 | 1.0 | 2.3 | 1.0 | 2.0 | 1.8 |
| \% Significant Differences 12.7 | 10.3 | 7.7 | 1.2 | 3.8 | 8.8 | 3.8 | 7.7 | 7.1 |
| FEMALES |  |  |  |  |  |  |  |  |
| Av. number of significant differences 2.0 | 1.3 | 2.7 | 2.0 | 0.7 | 2.3 | 1.0 | 2.3 | 1.9 |
| \% Significant Differences 7.7 | 5.0 | 10.3 | 7.7 | 2.6 | 8.8 | 3.8 | 8.8 | 7.4 |

HOUSEHOLD CHARACTERISTICS
All HOUSEHOLDS

| Av. number of significant differences | 0.3 | 0.3 | 0.7 | 1.0 | 1.0 | 0.3 | 0.3 | 0.0 | 0.5 |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |
| $\%$ Significant differences | 4.2 | 4.2 | 8.3 | 12.5 | 12.5 | 4.2 | 4.2 | 0.0 | 6.2 |

