WTADJUST Example #2

SUDAAN Statements and Results Illustrated

- REFLEVEL
- WTMAX
- SETENV
- UPPERBD
- LOWERBD

Input Data Set(s):

Example

Using data from the 2006 National Health Interview Survey (NHIS) Sample Adult Public Use File, assume records assigned to Weeks 9-13 within each quarter of data collection are nonrespondents and compute an appropriate nonresponse adjustment for those records associated with Weeks 1-8. Evaluate the potential relative bias implications of omitting data collected in Weeks 9-13 of each quarter on the following three outcome measures:

- o Told by a doctor that you have cancer,
- o Current heavier drinker and
- o Chances of Getting HIV/AIDs = High, Moderate; Already Have AIDS

Solution

Many ongoing surveys face the issue of whether to cut off data collection after a certain point in time or after a certain number of call-backs. If one were to allow for a longer period of data collection or a greater number of call-backs, variance and bias might be reduced due to the larger resulting respondent sample, though the data collection costs will also increase. Cost and variance implications of a smaller sample can generally be estimated fairly easily by looking at historical data. To measure bias implications, one method is to examine the potential relative bias, (i.e., use historical data and derive estimates computed using only those respondents that participated early in the data collection effort, or after a fewer number of call-backs) and compare these estimates against those estimates generated from the full sample. This example illustrates the process of estimating the relative bias.

Households are assigned to the NHIS interviewers on a weekly basis, so the weekly samples are independent of one another. Therefore, there is no reason to assume that there would be any bias implications by stopping data collection within each quarter at Week 8. This analysis is being conducted with the NHIS data for illustration purposes only. All output in this example was generated using the SAS-callable version of SUDAAN.

Exhibit 1 presents an initial DATA statement that was used to read in the NHIS public use file. In summary, the following variables are created/kept:

<u>Variable</u>	Definition
RECID	Observation number
STRAT_P	Pseudo-Strata indicator for variance estimation

PSU_P	Pseudo-Primary Sampling Unit (PSU) indicator for variance estimation
WTFA_SA	Final Weight
ASSIGNWK	Assignment week (1-13)
RESP	0/1 respondent indicator. In this example, those cases worked in ASSIGNWK=1,,8 are considered respondents and those records worked in ASSIGNWK=9,,13 are considered nonrespondents.
INTV_QRT	Interview quarter (1-4)
SEX	Gender
REGION	Census Region
AGE_P	Age category
HISP	Hispanic indicator
RACE	Race indicator
CANCER	0/1 indicator for whether the respondent was ever told by a doctor that they had cancer.
DRINKER	0/1 indicator for whether the person is considered a current, heavier drinker
HIV	0/1 indicator for whether a person's responses indicated their chances of getting HIV/AIDs was high, moderate or whether they already have AIDs.

```
Exhibit 1. SAS Code to Read In NHIS Data
```

```
proc format;
value hisp 1="1 Hispanic"
          2="2 Nonhispanic";
value race 1="1 White"
          2="2 Black/African American"
          3="3 Other";
run:
data one (keep=recid strat p psu p wtfa sa
           assignwk resp
             intv qrt sex region age p hisp race cancer drinker hiv);
set indsn.samadult;
recid= n ;
format hisp hisp.;
if 00 le hispan_i le 11 then hisp=1;
else
                           hisp=2;
format race race.;
if mracrpi2 in (1,2) then race=mracrpi2;
else
                      race=3;
if 1 le assignwk le 8 then resp=1;
else
                         resp=0;
/*Ever told by doctor you had cancer = Yes*/
   if canev=1
                                      then cancer=1;
else if canev=2
                                      then cancer=0;
/*Current, heavier drinker*/
then drinker=1;
dviabor=0;
else if alcstat in (1,2,3,4,5,6,7,8) then drinker=0;
/*Chances of Getting HIV/AIDs = High, Moderate, Already Have AIDS*/
   if chnsadsp in (1,2)
                              then hiv=1;
else if chnsadsp in (1, 2, 3, 4)
                                       then hiv=0;
run;
```

We assume that this is a with-replacement design, and therefore, the appropriate SUDAAN design statements are:

```
PROC ____ DESIGN=WR;
WEIGHT wtfa_sa;
NEST strat p psu p;
```

Given the above assumptions, it is more efficient for SUDAAN if the file was sorted by the NEST statement variables before running any SUDAAN procedures. In this example, we will use the NOTSORTED option on the PROC statement with the first SUDAAN procedure to indicate that the dataset is not sorted. We will also use the OUTDATA option on the PROC statement to save a copy of the sorted file for subsequent SUDAAN runs.

In this example, we will use the main effects of quarter, region, sex, race, Hispanic indicator and age as explanatory variables in the weight adjustment model. All variables will be considered categorical except for the age variable.

Following the recommended steps outlined in *Exhibit 1*, we first compute the weighted sums to which the final nonresponse adjusted, weighted sample should sum. Since we are using both categorical and continuous variables in the model, we use both SUDAAN's CROSSTAB and DESCRIPT to get these weighted sums. *Exhibit 2* shows the code used to derive these initial totals.

```
Exhibit 2.
                SAS Code Used to Compute Initial Control Totals
PROC CROSSTAB DATA=one DESIGN=WR USEVMEM=1 NOTSORTED OUTDATA=onesort;
WEIGHT wtfa sa;
NEST
        strat p psu p;
CLASS intv_qrt region sex race hisp resp;
TABLES (intv_qrt region sex race hisp)*resp;
RLABEL race="Race of Respondent"
        hisp="Hispanic Indicator"
         resp="0/1 Respondent Indicator";
SETENV COLWIDTH=15;
PRINT NSUM WSUM ROWPER /
         FILETYPE=RTF FILENAME="Example_12_2_OUT1.rtf" REPLACE
         FONTNAME="Arial" FONTSIZE=10
         TOPINCH=1 LEFTINCH=1 RIGHTINCH=2.5 BOTTOMINCH=2.5;
RTITLE "Example 15-2";
run;
PROC DESCRIPT DATA=onesort DESIGN=WR USEVMEM=1;
WEIGHT wtfa sa;
NEST
       strat p psu p;
CLASS resp;
TABLES resp;
VAR
        age p;
RLABEL resp="0/1 Respondent Indicator";
SETENV COLWIDTH=15;
PRINT
         NSUM TOTAL /
         FILETYPE=RTF FILENAME="Example 12_2_OUT2.rtf" REPLACE
         FONTNAME="Arial" FONTSIZE=10
         TOPINCH=1 LEFTINCH=1 RIGHTINCH=2.5 BOTTOMINCH=2.5;
RTITLE "Example 15-2";
run;
```

In this example, we also the USEVMEM=1 option on the PROC statement to tell SUDAAN to always used the external drive to store information during processing. This will minimize the amount of internal memory (i.e., RAM) needed by the SUDAAN job.

The output from these procedures is presented in *Exhibit 3* and *Exhibit 4*.

Exhibit 3. Example_12_2_OUT1.rtf

	Date: 05-29-2008 S Time: 09:50:45		Page: 1 Table:1		
Example 15-2	ation Method: Taylor uarter, 0/1 Responde				
		0/1 R	espondent Indi	cator	
Interview Qua	rter	Total	0	1	
Total	Sample Size	24275	10021	14254	
	Weighted Size	220266693.00	94730690.00	125536003.00	
	Row Percent	100.00	43.01	56.99	
1 Quarter 1	Sample Size	6155	2977	3178	
	Weighted Size	54831586.00	27009735.00	27821851.00	
	Row Percent	100.00	49.26	50.74	
2 Quarter 2	Sample Size	7180	2885	4295	
	Weighted Size	54980247.00	23352243.00	31628004.00	
	Row Percent	100.00	42.47	57.53	
3 Quarter 3	Sample Size	3705	1354	2351	
	Weighted Size	55148712.00	21426670.00	33722042.00	
	Row Percent	100.00	38.85	61.15	
4 Quarter 4	Sample Size	7235	2805	4430	
	Weighted Size	55306148.00	22942042.00	32364106.00	
	Row Percent	100.00	41.48	58.52	

Exhibit 3. Example_12_2_OUT1.rtf-cont.

Date: 05-29-20 Time: 09:50:4		SUDAAN		Page: 2 Table:2
Example 15-2	ation Method: Taylo Respondent Indica			
		0/1 R	espondent Indic	ator
Region		Total	0	1
Total	Sample Size	24275	10021	14254
	Weighted Size	220266693.00	94730690.00	125536003.00
	Row Percent	100.00	43.01	56.99
1 Northeast	Sample Size	4151	1588	2563
	Weighted Size	39033183.00	16664752.00	22368431.00
	Row Percent	100.00	42.69	57.31
2 Midwest	Sample Size	5303	2251	3052
	Weighted Size	51565416.00	22664919.00	28900497.00
	Row Percent	100.00	43.95	56.05
3 South	Sample Size	9254	3912	5342
	Weighted Size	83510919.00	35799776.00	47711143.00
	Row Percent	100.00	42.87	57.13
4 West	Sample Size	5567	2270	3297
	Weighted Size	46157175.00	19601243.00	26555932.00
	Row Percent	100.00	42.47	57.53

Exhibit 3. Example_12_2_OUT1.rtf-cont.

Date: 05-29-20 Time: 09:50:45		SUDAAN		Page: 3 Table:3	
Variance Estimation Method: Taylor Series (WR) Example 15-2 by: Sex, 0/1 Respondent Indicator.					
		0/1 R	espondent Indica	ator	
Sex		Total	0	1	
Total	Sample Size	24275	10021	14254	
	Weighted Size	220266693.00	94730690.00	125536003.00	
	Row Percent	100.00	43.01	56.99	
1 Male	Sample Size	10715	4453	6262	
	Weighted Size	106252219.00	45794627.00	60457592.00	
	Row Percent	100.00	43.10	56.90	
2 Female	Sample Size	13560	5568	7992	
	Weighted Size	114014474.00	48936063.00	65078411.00	
	Row Percent	100.00	42.92	57.08	

Exhibit 3. Example_12_2_OUT1.rtf-cont.

Date: 05-29-200 Time: 09:50:45)8	SUDAAN		Page: 4 Table:4	
Variance Estimation Method: Taylor Series (WR) Example 15-2 by: Race of Respondent, 0/1 Respondent Indicator.					
		0/1 R	espondent Indica	ator	
Race of Respo	ndent	Total	0	1	
Total	Sample Size	24275	10021	14254	
	Weighted Size	220266693.00	94730690.00	125536003.00	
	Row Percent	100.00	43.01	56.99	
1 White	Sample Size	18422	7868	10554	
	Weighted Size	180681666.00	79125115.00	101556551.00	
	Row Percent	100.00	43.79	56.21	
2 Black/African	Sample Size	4182	1430	2752	
American	Weighted Size	26696785.00	9791517.00	16905268.00	
	Row Percent	100.00	36.68	63.32	
3 Other	Sample Size	1671	723	948	
	Weighted Size	12888242.00	5814058.00	7074184.00	
	Row Percent	100.00	45.11	54.89	

Date: 05-29-200 Time: 09:50:45	08	SUDAAN		Page: 5 Table:5	
Variance Estimation Method: Taylor Series (WR) Example 15-2 by: Hispanic Indicator, 0/1 Respondent Indicator.					
		0/1 R	espondent Indic	ator	
Hispanic Indic	ator	Total	0	1	
Total	Sample Size	24275	10021	14254	
	Weighted Size	220266693.00	94730690.00	125536003.00	
	Row Percent	100.00	43.01	56.99	
1 Hispanic	Sample Size	4227	1497	2730	
	Weighted Size	28663833.00	10613779.00	18050054.00	
	Row Percent	100.00	37.03	62.97	
2 Nonhispanic	Sample Size	20048	8524	11524	
	Weighted Size	191602860.00	84116911.00	107485949.00	
	Row Percent	100.00	43.90	56.10	

Exhibit 3. Example_12_2_OUT1.rtf-cont.

The row percents, under the Respondent Indicator = 1 column in *Exhibit 3*, display the weighted response rates. Looking at the second page of *Exhibit 3* (for example), the table indicates that we have 2,563 respondents located in the Northeast Census region, and their weights sum to 22,368,431. Additionally, there are 4,151 records in the entire sample in the northeast, and their weights sum to 39,033,183. We seek to create a nonresponse adjustment that will force the weighted sum of the 2,563 respondent records to equal 39,033,183.

Exhibit 4. Example_12_2_OUT2.rtf

Date: 05-29-20 Time: 09:50:47	Date: 05-29-2008 SUDAAN Fime: 09:50:47			Page: 1 Table:1		
Example 15-2	Variance Estimation Method: Taylor Series (WR) Example 15-2 by: Variable, 0/1 Respondent Indicator.					
		0/1 F	Respondent Indica	ator		
Variable		Total	0	1		
Age	Sample Size	24275	10021	14254		
	Total	10061218601.00	4320097971.00	5741120630.00		

The "Total" row in *Exhibit 4* provides the desired weighted sum from the PROC DESCRIPT. This row indicates that the weighted sum of the age variable over all respondent records is 5,741,120,630. We seek to create a nonresponse adjustment that will force this weighted sum to equal 10,061,218,601.

Again, following the steps presented in *Exhibit 1*, we first run a PROC WTADJUST with no parameters set on the WTMIN, WTMAX, LOWERBD, CENTER or UPPERBD statements (Step 2 in *Exhibit 1*). This code is presented in *Exhibit 5*, and the resulting output is presented in *Exhibit 6*.

Exhibit 5. Initial WTADJUST Procedure

PROC WTADJUST DATA=onesort DESIGN=WR ADJUST=NONRESPONSE USEVMEM=1;
WEIGHT wtfa sa;
NEST strat_p psu_p;
REFLEVEL intv qrt=1 region=1;
CLASS intv qrt region sex race hisp;
MODEL resp=intv qrt region sex race hisp age p;
RLABEL race="Race of Respondent"
hisp="Hispanic Indicator"
resp="0/1 Respondent Indicator";
SETENV COLWIDTH=15;
PRINT BETA SEBETA P BETA / BETAFMT=F10.3 SEBETAFMT=F10.3
FILETYPE=RTF FILENAME="Example 12 2 OUT3.rtf" REPLACE
FONTNAME="Arial" FONTSIZE=10
TOPINCH=1 LEFTINCH=1 RIGHTINCH=2.5 BOTTOMINCH=2.5;
PRINT UNWTDRR WTDRR /
FILETYPE=RTF FILENAME="Example_12_2_OUT3.rtf" REPLACE
FONTNAME="Arial" FONTSIZE=10
TOPINCH=1 LEFTINCH=1 RIGHTINCH=2.5 BOTTOMINCH=2.5;
PRINT INITWTMN INITWTMX NTRIMMED /
FILETYPE=RTF FILENAME="Example_12_2_OUT3.rtf" REPLACE
FONTNAME="Arial" FONTSIZE=10
TOPINCH=1 LEFTINCH=1 RIGHTINCH=2.5 BOTTOMINCH=2.5;
PRINT MARGADJ ADJMIN ADJMAX /
FILETYPE=RTF FILENAME="Example_12_2_OUT3.rtf" REPLACE
FONTNAME="Arial" FONTSIZE=10
TOPINCH=1 LEFTINCH=1 RIGHTINCH=2.5 BOTTOMINCH=2.5;
PRINT UWEORIG UWETRIM UWEFINAL /
FILETYPE=RTF FILENAME="Example_12_2_OUT3.rtf" REPLACE
FONTNAME="Arial" FONTSIZE=10
TOPINCH=1 LEFTINCH=1 RIGHTINCH=2.5 BOTTOMINCH=2.5;
RTITLE "Example 15-2";
run;

Similar to the example presented in *Section 24.13.1*, notice that several PRINT statements are included in this run of WTADJUST. These print statements specify output to the same EXAMPLE_12_2_OUT3.rtf file. When multiple PRINT statements like this appear in the same SUDAAN procedure, SUDAAN appends these tables to one another. This is an effective way to control which columns appear together on the same page of output.

In the code above, we also specify an alternate label for the variables RACE, HISP and RESP. This is done with the RLABEL statement.

Finally, for illustration purposes, we use the REFLEVEL statement to change the reference level associated with the categorical variables INTV_QRT and REGION. Ordinarily, the last level is assumed to be the reference level (in this case, "4" for both variables). However, the REFLEVEL statement tells SUDAAN to make the first level the reference level.

Exhibit 6. Example_12_2_OUT3.rtf

Date: 05-29-20 Time: 09:50:47		SUDAAN		Page: 1 Table: 1
Response varia Nonresponse A Example 15-2	ation Method: Tayl ble RESP: 0/1 Res djustment it Variables and Eff	spondent Indicator		
Independent \ Effects	/ariables and	Beta Coeff.	SE Beta	P-value T-Test B=0
Intercept		0.319	0.122	0.0094
Interview	1 Quarter 1	0.000	0.000	
Quarter	2 Quarter 2	-0.219	0.083	0.0087
	3 Quarter 3	-0.326	0.097	0.0009
	4 Quarter 4	-0.248	0.090	0.0060
Region	1 Northeast	0.000	0.000	
	2 Midwest	0.017	0.103	0.8656
	3 South	0.020	0.095	0.8308
	4 West	0.009	0.097	0.9293
Sex	1 Male	0.006	0.023	0.8046
	2 Female	0.000	0.000	
Race of	1 White	-0.020	0.071	0.7755
Respondent	2 Black/African	0.005	0.000	0.0040
	American	-0.265	0.080	0.0010
Hispanic	3 Other	0.000	0.000	
Indicator	1 Hispanic	-0.229	0.053	0.0000
	2 Nonhispanic	0.000	0.000	
Age		-0.001	0.001	0.2054

Exhibit 6. Example_12_2_OUT3.rtf-cont.

	Date: 05-29-2008 SUDA Time: 09:50:47		Page: 2 Table: 1
Response varia Nonresponse A Example 15-2	ation Method: Taylor Se Ible RESP: 0/1 Respond Idjustment It Variables and Effects.		
Independent	/ariables and Effects	Unweighted Response Rate (Percent)	Weighted Response Rate (Percent)
Intercept		58.72	56.99
Interview	1 Quarter 1	51.63	50.74
Quarter	2 Quarter 2	59.82	57.53
	3 Quarter 3	63.45	61.15
	4 Quarter 4	61.23	58.52
Region	1 Northeast	61.74	57.31
	2 Midwest	57.55	56.05
	3 South	57.73	57.13
	4 West	59.22	57.53
Sex	1 Male	58.44	56.90
	2 Female	58.94	57.08
Race of	1 White	57.29	56.21
Respondent	2 Black/African		
	American	65.81	63.32
	3 Other	56.73	54.89
Hispanic	1 Hispanic	64.58	62.97
Indicator	2 Nonhispanic	57.48	56.10
Age			

Exhibit 6. Example_12_2_OUT3.rtf-cont.

Date: 05-29-2008 Time: 09:50:47		SUDAAN		Page: 3 Table: 1
Response varia Nonresponse A Example 15-2	ation Method: Taylo ble RESP: 0/1 Res djustment t Variables and Eff	pondent Indicator		
Independent \ Effects	/ariables and	Minimum Initial Weight Among Respondents	Maximum Initial Weight Among Respondents	Number of Trimmed Weights
Intercept		1294.00	98166.00	0
Interview	1 Quarter 1	1697.00	64708.00	0
Quarter	2 Quarter 2	1318.00	36179.00	0
	3 Quarter 3	2435.00	98166.00	0
	4 Quarter 4	1294.00	60560.00	0
Region	1 Northeast	1318.00	61357.00	0
	2 Midwest	1381.00	98166.00	0
	3 South	1374.00	69634.00	0
	4 West	1294.00	73837.00	0
Sex	1 Male	1425.00	98166.00	0
	2 Female	1294.00	69634.00	0
Race of	1 White	1400.00	98166.00	0
Respondent	2 Black/African			
	American	1318.00	60388.00	0
	3 Other	1294.00	50798.00	0
Hispanic	1 Hispanic	1400.00	56616.00	0
Indicator	2 Nonhispanic	1294.00	98166.00	0
Age				

Exhibit 6. Example_12_2_OUT3.rtf-cont.

Variance Estima			Page: 4 Table: 1	
Response varial Nonresponse Ac Example 15-2		espondent Indicator		
Independent V Effects	ariables and	Marginal Weight Adjustment	Minimum Adjustment Factor Among Respondents	Maximum Adjustment Factor Among Respondents
Intercept		1.7546	1.2672	2.1072
Interview	1 Quarter 1	1.9708	1.5109	2.1072
Quarter	2 Quarter 2	1.7383	1.3386	1.8588
	3 Quarter 3	1.6354	1.2672	1.7519
	4 Quarter 4	1.7089	1.3083	1.8329
Region	1 Northeast	1.7450	1.2672	2.0842
	2 Midwest	1.7842	1.3027	2.1064
	3 South	1.7503	1.2958	2.1072
	4 West	1.7381	1.2986	2.0932
Sex	1 Male	1.7575	1.2704	2.1072
	2 Female	1.7520	1.2672	2.1005
Race of	1 White	1.7791	1.4370	2.0871
Respondent	2 Black/African American	1.5792	1.2672	1.8152
	3 Other	1.8219	1.4681	2.1072
Hispanic	1 Hispanic	1.5880	1.2672	1.8452
Indicator	2 Nonhispanic	1.7826	1.4236	2.1072
Age		1.7525		2

Exhibit 6.	Example_	_12_2_	OUT3.rtf-cont.
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Date: 05-29-200 Time: 09:50:47			•	
Variance Estimation Method: Taylor Series (WR) Response variable RESP: 0/1 Respondent Indicator Nonresponse Adjustment Example 15-2 by: Independent Variables and Effects.				
Independent V Effects	ariables and	Original Unequal Weighting Effect	Trimmed Unequal Weighting Effect	Final Unequal Weighting Effect
Intercept		1.5093	1.5093	1.5251
Interview	1 Quarter 1	1.3984	1.3984	1.4308
Quarter	2 Quarter 2	1.3590	1.3590	1.3895
	3 Quarter 3	1.4120	1.4120	1.4513
	4 Quarter 4	1.3897	1.3897	1.4222
Region	1 Northeast	1.4417	1.4417	1.4622
	2 Midwest	1.4500	1.4500	1.4466
	3 South	1.5724	1.5724	1.6028
	4 West	1.4978	1.4978	1.4997
Sex	1 Male	1.4849	1.4849	1.4892
	2 Female	1.5134	1.5134	1.5408
Race of	1 White	1.4580	1.4580	1.4614
Respondent	2 Black/African	4 5004	4 5004	4 5000
	American	1.5384	1.5384	1.5236
Hispanic	3 Other	1.5928	1.5928	1.5749
Indicator	1 Hispanic	1.5319	1.5319	1.5264
Age	2 Nonhispanic	1.4821	1.4821	1.4853
Age				· ·

Page 3 of *Exhibit 6* indicates that the original weights range from 1,294 to 98,166, and page 4 indicates that the initial nonresponse adjustment ranges from 1.2672 to 2.1072.

In some applications, it may be desirable at this stage to conduct a backward elimination process and remove nonsignificant explanatory variables from the model. One may also want to check the significance of interaction terms. For this example, we will retain this set of main effects variables.

Moving next to Step 4 of *Exhibit 1*, we determine an appropriate weight truncation factor. In other words, we select appropriate values for WTMIN and WTMAX.

There are several methods one can use to establish appropriate weight truncation bounds. *Section 15.3.1* of the **SUDAAN 10 Language Manual** presents a discussion of how one might want to examine either the standard deviation or the interquartile range (IQR) of the sample weights. An initial value of WTMIN and WTMAX could set as follows:

 $WTMIN = WT_{Median} - 3 \cdot WT_{IOR}$

 $WTMAX = WT_{Median} + 3 \cdot WT_{IOR}$

If desired, the medians and IQR's can be computed within groups.

For illustration purposes in this example, we will set WTMAX at 50,000 for all records and not specify a value for WTMIN. The associated code for the next run of WTADJUST is presented in *Exhibit* 7, and the output is presented in *Exhibit* 8.

Exhibit 7.	WTADJUST Procedure
------------	--------------------

	ADJUST DATA=onesort DESIGN=WR ADJUST=NONRESPONSE USEVMEM=1;
	strat_p psu_p;
	L intv_qrt=1 region=1;
CLASS	
WTMAX	,
MODEL	resp=intv_qrt region sex race hisp age_p;
RLABEL	race="Race of Respondent"
	hisp="Hispanic Indicator"
	resp="0/1 Respondent Indicator";
SETENV	COLWIDTH=15;
PRINT	BETA SEBETA P_BETA / BETAFMT=F10.3 SEBETAFMT=F10.3
	FILETYPE=RTF FILENAME="Example_12_2_OUT4.rtf" REPLACE
	FONTNAME="Arial" FONTSIZE=10
	TOPINCH=1 LEFTINCH=1 RIGHTINCH=2.5 BOTTOMINCH=2.5;
PRINT	
	FILETYPE=RTF FILENAME="Example_12_2_OUT4.rtf" REPLACE
	FONTNAME="Arial" FONTSIZE=10
	TOPINCH=1 LEFTINCH=1 RIGHTINCH=2.5 BOTTOMINCH=2.5;
PRINT	
	FILETYPE=RTF FILENAME="Example_12_2_OUT4.rtf" REPLACE
	FONTNAME="Arial" FONTSIZE=10
	TOPINCH=1 LEFTINCH=1 RIGHTINCH=2.5 BOTTOMINCH=2.5;
PRINT	MARGADJ ADJMIN ADJMAX /
	FILETYPE=RTF FILENAME="Example_12_2_OUT4.rtf" REPLACE
	FONTNAME="Arial" FONTSIZE=10
	TOPINCH=1 LEFTINCH=1 RIGHTINCH=2.5 BOTTOMINCH=2.5;
PRINT	UWEORIG UWETRIM UWEFINAL /
	FILETYPE=RTF FILENAME="Example_12_2_OUT4.rtf" REPLACE
	FONTNAME="Arial" FONTSIZE=10
	TOPINCH=1 LEFTINCH=1 RIGHTINCH=2.5 BOTTOMINCH=2.5;
RTITLE	"Example 15-2";
run;	
l	

Exhibit 8. Example_12_2_OUT4.rtf

Date: 05-29-20 Time: 09:50:49				Page: 1 Table: 1
Response varia Nonresponse A Example 15-2	ation Method: Taylo able RESP: 0/1 Res adjustment at Variables and Eff	spondent Indicator		
Independent	ariables and			P-value T-Test
Effects		Beta Coeff.	SE Beta	B=0
Intercept		0.320	0.122	0.0091
Interview	1 Quarter 1	0.000	0.000	
Quarter	2 Quarter 2	-0.222	0.083	0.0078
	3 Quarter 3	-0.316	0.097	0.0012
	4 Quarter 4	-0.250	0.090	0.0055
Region	1 Northeast	0.000	0.000	
	2 Midwest	0.019	0.103	0.8520
	3 South	0.024	0.095	0.8014
	4 West	0.009	0.097	0.9225
Sex	1 Male	0.008	0.023	0.7295
	2 Female	0.000	0.000	
Race of	1 White	-0.015	0.071	0.8372
Respondent	2 Black/African American	-0.264	0.080	0.0011
	3 Other	0.000	0.000	
Hispanic	1 Hispanic	-0.235	0.053	0.0000
Indicator	2 Nonhispanic	0.000	0.000	
Age		-0.001	0.001	0.1315

Exhibit 8. Example_12_2_OUT4.rtf-cont.

Date: 05-29-20 Time: 09:50:49		DAAN	Page: 2 Table: 1
Response varia Nonresponse A Example 15-2	ation Method: Taylor Se able RESP: 0/1 Respond adjustment nt Variables and Effects.		
		Unweighted	Weighted
Independent	Variables and Effects	Response Rate (Percent)	Response Rate (Percent)
Intercept		58.72	56.99
Interview	1 Quarter 1	51.63	50.74
Quarter	2 Quarter 2	59.82	57.53
	3 Quarter 3	63.45	61.15
	4 Quarter 4	61.23	58.52
Region	1 Northeast	61.74	57.31
	2 Midwest	57.55	56.05
	3 South	57.73	57.13
	4 West	59.22	57.53
Sex	1 Male	58.44	56.90
	2 Female	58.94	57.08
Race of	1 White	57.29	56.21
Respondent	2 Black/African	65.04	62.22
	American 3 Other	65.81	63.32
Hispanic		56.73	54.89 62.97
Indicator	1 Hispanic 2 Nonhispanic	64.58 57.48	56.10
Age	∠ Nonnispanic	57.48	01.00
, ,90		•	•

Exhibit 8. Example_12_2_OUT4.rtf-cont.

Date: 05-29-200 Time: 09:50:49			•	
Variance Estimation Method: Taylor Series (WR) Response variable RESP: 0/1 Respondent Indicator Nonresponse Adjustment Example 15-2 by: Independent Variables and Effects.				
Independent V Effects	ariables and	Minimum Initial Weight Among Respondents	Maximum Initial Weight Among Respondents	Number of Trimmed Weights
Intercept		1294.00	98166.00	26
Interview	1 Quarter 1	1697.00	64708.00	5
Quarter	2 Quarter 2	1318.00	36179.00	0
	3 Quarter 3	2435.00	98166.00	20
	4 Quarter 4	1294.00	60560.00	1
Region	1 Northeast	1318.00	61357.00	2
	2 Midwest	1381.00	98166.00	4
	3 South	1374.00	69634.00	18
	4 West	1294.00	73837.00	2
Sex	1 Male	1425.00	98166.00	15
	2 Female	1294.00	69634.00	11
Race of	1 White	1400.00	98166.00	23
Respondent	2 Black/African American	1318.00	60388.00	2
	3 Other	1294.00	50798.00	1
Hispanic	1 Hispanic	1400.00	56616.00	1
Indicator	2 Nonhispanic	1294.00	98166.00	25
Age				

Exhibit 8. Example_12_2_OUT4.rtf-cont.

Date: 05-29-20 Time: 09:50:49			•	
Response varia Nonresponse A Example 15-2	ation Method: Taylo ble RESP: 0/1 Res djustment t Variables and Effe	pondent Indicato	r	
Independent \ Effects	/ariables and	Marginal Weight Adjustment	Minimum Adjustment Factor Among Respondents	Maximum Adjustment Factor Among Respondents
Intercept		1.7587	1.2655	2.1149
Interview	1 Quarter 1	1.9735	1.4978	2.1149
Quarter	2 Quarter 2	1.7383	1.3252	1.8628
	3 Quarter 3	1.6472	1.2655	1.7695
	4 Quarter 4	1.7094	1.2942	1.8384
Region	1 Northeast	1.7465	1.2655	2.0878
	2 Midwest	1.7891	1.3075	2.1124
	3 South	1.7560	1.2993	2.1149
	4 West	1.7407	1.3023	2.0975
Sex	1 Male	1.7630	1.2702	2.1149
	2 Female	1.7547	1.2655	2.1054
Race of	1 White	1.7839	1.4348	2.1022
Respondent	2 Black/African			
	American	1.5809	1.2655	1.8237
	3 Other	1.8221	1.4633	2.1149
Hispanic	1 Hispanic	1.5886	1.2655	1.8445
Indicator	2 Nonhispanic	1.7873	1.4230	2.1149
Age		1.7553		

Exhibit 8.	Example_12_2_	OUT4.rtf-cont.
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Date: 05-29-200 Time: 09:50:49	с С		•	
Variance Estimation Method: Taylor Series (WR) Response variable RESP: 0/1 Respondent Indicator Nonresponse Adjustment Example 15-2 by: Independent Variables and Effects.				
Independent Va Effects	ariables and	Original Unequal Weighting Effect	Trimmed Unequal Weighting Effect	Final Unequal Weighting Effect
Intercept		1.5093	1.4850	1.5051
Interview	1 Quarter 1	1.3984	1.3852	1.4180
Quarter	2 Quarter 2	1.3590	1.3590	1.3910
	3 Quarter 3	1.4120	1.3713	1.4089
	4 Quarter 4	1.3897	1.3857	1.4194
Region	1 Northeast	1.4417	1.4334	1.4575
	2 Midwest	1.4500	1.4190	1.4220
	3 South	1.5724	1.5422	1.5757
	4 West	1.4978	1.4802	1.4868
Sex	1 Male	1.4849	1.4544	1.4641
	2 Female	1.5134	1.4965	1.5269
Race of	1 White	1.4580	1.4325	1.4402
Respondent	2 Black/African American	1.5384	1.5225	1.5128
	3 Other	1.5928	1.5916	1.5778
Hispanic Indicator	1 Hispanic	1.5319	1.5271	1.5250
	2 Nonhispanic	1.4821	1.4561	1.4641
Age				

Page 3 of *Exhibit 8*, above, indicates that 26 weights were trimmed, and page 5 indicates that the unequal weighting effect was reduced from 1.5093 to 1.4850. Note that weight truncation is done to minimize the effect of unequal weights on the variance of estimates; the reduction in variance can be approximated by examining the reduction in the unequal weighting effect. However, truncating the weights also introduced bias into the estimates. Therefore, we recommend not truncating a large number of weights during this process.

The next step in the weight adjustment process is to determine appropriate bounds on the resulting weight adjustment (Step 6 of *Exhibit 1*). In this example, we assign LOWERBD to 1, UPPERBD to 2 and let CENTER retain its default value. The resulting code is displayed in *Exhibit 9*, and the associated output is presented in *Exhibit 10*.

Exhibit 9. WTADJUST Procedure

PROC WTADJUST DATA=onesort DESIGN=WR ADJUST=NONRESPONSE USEVMEM=1; WEIGHT wtfa sa;
NEST strat p psu p:
IDVAR recid resp intv qrt region sex race hisp age p cancer drinker hiv;
REFLEVEL intv grt=1 region=1;
CLASS intv qrt region sex race hisp;
WTMAX 50000;
UPPERBD 2.00;
LOWERBD 1.00;
MODEL resp=intv_qrt region sex race hisp age_p;
RLABEL race="Race of Respondent"
hisp="Hispanic Indicator"
<pre>resp="0/1 Respondent Indicator";</pre>
SETENV COLWIDTH=15;
PRINT BETA SEBETA P_BETA / BETAFMT=F10.3 SEBETAFMT=F10.3
FILETYPE=RTF FILENAME="Example_12_2_OUT5.rtf" REPLACE
FONTNAME="Arial" FONTSIZE=10 TOPINCH=1 LEFTINCH=1 RIGHTINCH=2.5 BOTTOMINCH=2.5;
PRINT UNWTDRR WTDRR /
FILETYPE=RTF FILENAME="Example 12 2 OUT5.rtf" REPLACE
FONTNAME="Arial" FONTSIZE=10
TOPINCH=1 LEFTINCH=1 RIGHTINCH=2.5 BOTTOMINCH=2.5;
PRINT INITWIMN INITWIMX NTRIMMED /
FILETYPE=RTF FILENAME="Example 12 2 OUT5.rtf" REPLACE
FONTNAME="Arial" FONTSIZE=10
TOPINCH=1 LEFTINCH=1 RIGHTINCH=2.5 BOTTOMINCH=2.5;
PRINT MARGADJ ADJMIN ADJMAX /
FILETYPE=RTF FILENAME="Example 12 2 OUT5.rtf" REPLACE
FONTNAME="Arial" FONTSIZE=10
TOPINCH=1 LEFTINCH=1 RIGHTINCH=2.5 BOTTOMINCH=2.5;
PRINT UWEORIG UWETRIM UWEFINAL /
FILETYPE=RTF FILENAME="Example_12_2_OUT5.rtf" REPLACE
FONTNAME="Arial" FONTSIZE=10
TOPINCH=1 LEFTINCH=1 RIGHTINCH=2.5 BOTTOMINCH=2.5;
OUTPUT / PREDICTED=ALL FILENAME=outsud FILETYPE=SAS REPLACE;
RTITLE "Example 15-2";
run;

Notice in this example that we added an IDVAR statement and an OUTPUT statement. This was done in order to merge the final weights onto the analysis file and to check the final adjusted weights.

Exhibit 10. Example_12_2_OUT5.rtf

Date: 05-29-20 Time: 09:50:51		SUDAAN		Page: 1 Table: 1
Response varia Nonresponse A Example 15-2	ation Method: Tayla able RESP: 0/1 Res adjustment nt Variables and Eff	spondent Indicator		
Independent	/ariables and			P-value T-Test
Effects		Beta Coeff.	SE Beta	B=0
Intercept		0.627	0.571	0.2735
Interview	1 Quarter 1	0.000	0.000	
Quarter	2 Quarter 2	-0.491	0.543	0.3660
	3 Quarter 3	-0.577	0.544	0.2902
	4 Quarter 4	-0.519	0.549	0.3453
Region	1 Northeast	0.000	0.000	<u> </u>
	2 Midwest	0.020	0.125	0.8728
	3 South	0.024	0.111	0.8306
	4 West	0.009	0.112	0.9343
Sex	1 Male	0.009	0.027	0.7348
	2 Female	0.000	0.000	
Race of	1 White	-0.021	0.099	0.8305
Respondent	2 Black/African American	-0.270	0.108	0.0131
	3 Other	0.000	0.000	
Hispanic	1 Hispanic	-0.234	0.065	0.0004
Indicator	2 Nonhispanic	0.000	0.000	
Age	· ·	-0.002	0.001	0.1450

Exhibit 10. Example_12_2_OUT5.rtf-cont.

Date: 05-29-20 Time: 09:50:51		DAAN	Page: 2 Table: 1
Response varia Nonresponse A Example 15-2	ation Method: Taylor Se able RESP: 0/1 Respond adjustment nt Variables and Effects.		
		Unweighted Response Rate	Weighted Response Rate
Independent	Variables and Effects	(Percent)	(Percent)
Intercept		58.72	56.99
Interview	1 Quarter 1	51.63	50.74
Quarter	2 Quarter 2	59.82	57.53
	3 Quarter 3	63.45	61.15
	4 Quarter 4	61.23	58.52
Region	1 Northeast	61.74	57.31
	2 Midwest	57.55	56.05
	3 South	57.73	57.13
	4 West	59.22	57.53
Sex	1 Male	58.44	56.90
	2 Female	58.94	57.08
Race of	1 White	57.29	56.21
Respondent	2 Black/African		00.00
	American	65.81	63.32
Hispanic	3 Other	56.73	54.89
Indicator	1 Hispanic	64.58	62.97
	2 Nonhispanic	57.48	56.10
Age		.	

Exhibit 10. Example_12_2_OUT5.rtf-cont.

Date: 05-29-20 Time: 09:50:51		SUDAAN		Page: 3 Table: 1
Response varia Nonresponse A Example 15-2		espondent Indicator		
Independent \ Effects	/ariables and	Minimum Initial Weight Among Respondents	Maximum Initial Weight Among Respondents	Number of Trimmed Weights
Intercept		1294.00	98166.00	26
Interview Quarter	1 Quarter 1	1697.00	64708.00	5
	2 Quarter 2	1318.00	36179.00	0
	3 Quarter 3	2435.00	98166.00	20
	4 Quarter 4	1294.00	60560.00	1
Region	1 Northeast	1318.00	61357.00	2
	2 Midwest	1381.00	98166.00	4
	3 South	1374.00	69634.00	18
	4 West	1294.00	73837.00	2
Sex	1 Male	1425.00	98166.00	15
	2 Female	1294.00	69634.00	11
Race of	1 White	1400.00	98166.00	23
Respondent	2 Black/African American	1318.00	60388.00	2
	3 Other	1294.00	50798.00	2
Hispanic	1 Hispanic	1400.00	56616.00	1
Indicator	2 Nonhispanic	1294.00	98166.00	25
Age				
		-		

Exhibit 10. Example_12_2_OUT5.rtf-cont.

Date: 05-29-20 Time: 09:50:51	08	SUDAAN		Page: 4 Table: 1
Response varia Nonresponse A Example 15-2	ation Method: Taylo ble RESP: 0/1 Res djustment t Variables and Effo	pondent Indicato	pr	
Independent V Effects	/ariables and	Marginal Weight Adjustment	Minimum Adjustment Factor Among Respondents	Maximum Adjustment Factor Among Respondents
Intercept		1.7587	1.1312	1.9897
Interview	1 Quarter 1	1.9735	1.7549	1.9897
Quarter	2 Quarter 2	1.7383	1.1807	1.8665
	3 Quarter 3	1.6472	1.1312	1.8070
	4 Quarter 4	1.7094	1.1480	1.8526
Region	1 Northeast	1.7465	1.1312	1.9884
	2 Midwest	1.7891	1.1782	1.9896
	3 South	1.7560	1.1665	1.9897
	4 West	1.7407	1.1727	1.9888
Sex	1 Male	1.7630	1.1359	1.9897
	2 Female	1.7547	1.1312	1.9892
Race of	1 White	1.7839	1.3268	1.9887
Respondent	2 Black/African American	1.5809	1.1312	1.9574
	3 Other	1.8221	1.3808	1.9897
Hispanic	1 Hispanic	1.5886	1.1312	1.9627
Indicator	2 Nonhispanic	1.7873	1.3083	1.9897
Age		1.7553		

Exhibit 10. Example_12_2_OUT5.rtf-cont.	
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Date: 05-29-200 Time: 09:50:51	08	SUDAAN		Page: 5 Table: 1
Response varial Nonresponse Ac Example 15-2		espondent Indicator		
Independent V Effects	ariables and	Original Unequal Weighting Effect	Trimmed Unequal Weighting Effect	Final Unequal Weighting Effect
Intercept		1.5093	1.4850	1.5069
Interview	1 Quarter 1	1.3984	1.3852	1.3896
Quarter	2 Quarter 2	1.3590	1.3590	1.3972
	3 Quarter 3	1.4120	1.3713	1.4258
	4 Quarter 4	1.3897	1.3857	1.4290
Region	1 Northeast	1.4417	1.4334	1.4602
	2 Midwest	1.4500	1.4190	1.4243
	3 South	1.5724	1.5422	1.5755
	4 West	1.4978	1.4802	1.4910
Sex	1 Male	1.4849	1.4544	1.4668
	2 Female	1.5134	1.4965	1.5277
Race of	1 White	1.4580	1.4325	1.4413
Respondent	2 Black/African American 3 Other	<u>1.5384</u> 1.5928	1.5225	1.5215 1.5805
Hispanic	1 Hispanic	1.5319	1.5271	1.5354
Indicator	2 Nonhispanic	1.4821	1.4561	1.4650
Age				
			•	

Page 4 of *Exhibit 10* indicates that the final nonresponse adjustment ranged from 1.1312 to 1.9897, and page 5 indicates that the unequal weighting effect changed from 1.4850 after weight trimming, to 1.5069 after the nonresponse adjustment was applied.

The final step in the weight adjustment process is to check the sum of the nonresponse adjusted sample weights. This is done by running the same CROSSTAB and DESCRIPT as was run in *Exhibit 2*. This code is presented below in *Exhibit 11*, and the associated output is presented in *Exhibit 12* and *Exhibit 13*.

Exhibit 11. Code to Check the Sum of the Nonresponse Adjusted Weights

```
PROC CROSSTAB DATA=outsud DESIGN=WR USEVMEM=1;
WEIGHT wtfinal;
      strat_p psu_p;
intv_qrt region sex race hisp resp;
NEST
CLASS
TABLES (intv qrt region sex race hisp)*resp;
RLABEL race="Race of Respondent"
        hisp="Hispanic Indicator"
        resp="0/1 Respondent Indicator";
SETENV COLWIDTH=15;
PRINT NSUM WSUM ROWPER /
        FILETYPE=RTF FILENAME="Example 12 2 OUT6.rtf" REPLACE
        FONTNAME="Arial" FONTSIZE=10
        TOPINCH=1 LEFTINCH=1 RIGHTINCH=2.5 BOTTOMINCH=2.5;
RTITLE "Example 15-2";
run;
PROC DESCRIPT DATA=outsud DESIGN=WR USEVMEM=1;
WEIGHT wtfinal;
NEST
        strat_p psu_p;
       resp;
CLASS
TABLES resp;
VAR
        age_p;
RLABEL resp="0/1 Respondent Indicator";
SETENV COLWIDTH=15;
PRINT
        NSUM TOTAL /
        FILETYPE=RTF FILENAME="Example 12_2_OUT7.rtf" REPLACE
        FONTNAME="Arial" FONTSIZE=10
        TOPINCH=1 LEFTINCH=1 RIGHTINCH=2.5 BOTTOMINCH=2.5;
RTITLE "Example 15-2";
run;
```

Exhibit 12. Example_12_2_OUT6.rtf

Date: 05-29-2 Time: 09:50:5		SUDAAN	Page: Table:
Example 15-2	nation Method: Taylor Quarter, 0/1 Responde		
		0/1 Responde	nt Indicator
Interview Qua	arter	Total	1
Total	Sample Size	14254	14254
	Weighted Size	220266693.00	220266693.00
	Row Percent	100.00	100.00
1 Quarter 1	Sample Size	3178	3178
	Weighted Size	54831586.00	54831586.00
	Row Percent	100.00	100.00
2 Quarter 2	Sample Size	4295	4295
	Weighted Size	54980247.00	54980247.00
	Row Percent	100.00	100.00
3 Quarter 3	Sample Size	2351	2351
	Weighted Size	55148712.00	55148712.00
	Row Percent	100.00	100.00
4 Quarter 4	Sample Size	4430	4430
	Weighted Size	55306148.00	55306148.00
	Row Percent	100.00	100.00

Exhibit 12. Example_12_2_OUT6.rtf-cont.

Date: 05-29-20 Time: 09:50:53	500	SUDAAN	Page Table	
Example 15-2	ation Method: Taylor	(),		
		0/1 Responder	nt Indicator	
Region		Total	1	
Total	Sample Size	14254	14254	
	Weighted Size	220266693.00	220266693.00	
	Row Percent	100.00	100.00	
1 Northeast	Sample Size	2563	2563	
	Weighted Size	39033183.00	39033183.00	
	Row Percent	100.00	100.00	
2 Midwest	Sample Size	3052	3052	
	Weighted Size	51565416.00	51565416.00	
	Row Percent	100.00	100.00	
3 South	Sample Size	5342	5342	
	Weighted Size	83510919.00	83510919.00	
	Row Percent	100.00	100.00	
4 West	Sample Size	3297	3297	
	Weighted Size	46157175.00	46157175.00	
	Row Percent	100.00	100.00	

Exhibit 12. Example_12_2_OUT6.rtf-cont.

Date: 05-29-2008 SUI Time: 09:50:53		SUDAAN	Page Tabl	
Example 15-2	ation Method: Taylor S	Series (WR)		
		0/1 Responde	nt Indicator	
Sex		Total	1	
Total	Sample Size	14254	14254	
	Weighted Size	220266693.00	220266693.00	
	Row Percent	100.00	100.00	
1 Male	Sample Size	6262	6262	
	Weighted Size	106252219.00	106252219.00	
	Row Percent	100.00	100.00	
2 Female	Sample Size	7992	7992	
	Weighted Size	114014474.00	114014474.00	
	Row Percent	100.00	100.00	

Exhibit 12. Example_12_2_OUT6.rtf-cont.

Date: 05-29-200 Time: 09:50:53	18 SL	JDAAN	Page Table	
Example 15-2	tion Method: Taylor Se pondent, 0/1 Responde			
		0/1 Responde	nt Indicator	
Race of Respon	ndent	Total	1	
Total	Sample Size	14254	14254	
	Weighted Size	220266693.00	220266693.00	
	Row Percent	100.00	100.00	
1 White	Sample Size	10554	10554	
	Weighted Size	180681666.00	180681666.00	
	Row Percent	100.00	100.00	
2 Black/African American	Sample Size	2752	2752	
	Weighted Size	26696785.00	26696785.00	
	Row Percent	100.00	100.00	
3 Other	Sample Size	948	948	
	Weighted Size	12888242.00	12888242.00	
	Row Percent	100.00	100.00	

Exhibit 12.	Example_	_12_2	_OUT6.rtf-cont.
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Date: 05-29-200 Time: 09:50:53)8 SL	JDAAN	Page Tabl	
Example 15-2	ation Method: Taylor Se licator, 0/1 Respondent	х <i>у</i>		
		0/1 Responde	ent Indicator	
Hispanic Indica	ator	Total	1	
Total	Sample Size	14254	14254	
	Weighted Size	220266693.00	220266693.00	
	Row Percent	100.00	100.00	
1 Hispanic	Sample Size	2730	2730	
	Weighted Size	28663833.00	28663833.00	
	Row Percent	100.00	100.00	
2 Nonhispanic	Sample Size	11524	11524	
	Weighted Size	191602860.00	191602860.00	
	Row Percent	100.00	100.00	

Exhibit 13. Example_12_2_OUT7.rtf

Date: 05-29-2008 SUI Time: 09:50:53		SUDAAN	•	Page: 1 Table:1	
Example 15-	timation Method: Taylo 2 0/1 Respondent Indic	cator.			
		0/1 Respon	0/1 Respondent Indicator		
Variable		Total	1		
Age	Sample Size	1425	4 14254		
	Total	10061218601.0	0 10061218601.00		

As desired, the newly weighted totals displayed in *Exhibit 12* and *Exhibit 13* match the "Total" column in *Exhibit -3* and *Exhibit 4*, respectively.

The final run in this example is designed to test whether estimates generated from the Week 1-8 records, using the new nonresponse adjusted weight, are statistically different from the estimates generated from the full sample, using the original weight. This difference, if significant, is a measure of the potential bias that will result in estimates if records from Week 9-13 in each quarter are omitted from the analysis.

The code used to set up this statistical test is provided in *Exhibit 14*. Note that this code illustrates two "tricks":

- If you are interested in estimating the statistical significance of the difference in two estimates that are generated from the same sample using different sets of variables, create a dummy analysis file where each record is output twice, as illustrated in the DATA statement in *Exhibit 14*. It is important to not change the NEST variables when doing this, so that SUDAAN properly accounts for the covariance in the significance test.
- If you are comparing two estimates and would like to see the two estimates, the difference in the estimates, and the statistical significance of the difference <u>all in the same table</u>, simply specify a set of CONTRAST statements as was done with the DESCRIPT procedure in *Exhibit 14*. Notice how the first CONTRAST will provide the estimates and the standard errors of the estimates computed using the original weight. The second CONTRAST will provide the same estimates computed using the reduced sample (Week 1-8) and the newly adjusted weights, and the third CONTRAST will provide an estimate of the difference and the p-value associated with the difference.

In this example, the relative bias is computed by groups defined by SEX for illustration purposes.

Exhibit 14. Code to Create Bias Estimates and Test Significance

```
Data compare;
set outsud;
weight=wtfa_sa; domain=1; output;
weight=wtfinal; domain=2; output;
run;
PROC DESCRIPT DATA=compare DESIGN=WR USEVMEM=1;
WEIGHT weight;
NEST
       strat p psu p;
CLASS domain sex;
VAR
        cancer drinker hiv;
TABLES sex;
CONTRAST domain=(1 0) / name="Estimate with Orig Weight";
CONTRAST domain=(0 1) / name="Estimate with Adjusted Weight";
CONTRAST domain=(1 -1) / name="Difference in Estimates";
SETENV COLWIDTH=15;
        MEAN SEMEAN P MEAN / MEANFMT=F10.6 SEMEANFMT=F10.6 P MEANFMT=F10.6
PRINT
         FILETYPE=RTF FILENAME="Example 12 2 OUT8.rtf" REPLACE
         FONTNAME="Arial" FONTSIZE=10
         TOPINCH=1 LEFTINCH=1 RIGHTINCH=2.5 BOTTOMINCH=2.5;
RTITLE "Example 15-2";
run;
```

The output from the above DESCRIPT is presented in *Exhibit 15*.

Exhibit 15. Example_12_2_OUT8.rtf

Date: 05-29-2 Time: 09:50:2	2000 00	IDAAN		Page: ² Table: ²
Example 15-2	mation Method: Taylor Se 2 Sex, CONTRAST.	ries (WR)		
for: Variable =	= CANCER.			
		CONTRAST		
Sex		Estimate with Orig Weight	Estimate with Adjusted Weight	Difference in Estimates
Total	Cntrst Mean	0.071909	0.072253	-0.000344
	SE Cntrst Mean P-value T-Test Cont. Mean=0	0.002126	0.002727	0.001911
1 Male	Cntrst Mean	0.061473	0.061516	-0.000043
	SE Cntrst Mean P-value T-Test Cont. Mean=0	0.002756	0.003542	0.002331
2 Female	Cntrst Mean	0.081641	0.082265	-0.000624
	SE Cntrst Mean P-value T-Test Cont. Mean=0	0.002950	0.003687	0.002750 0.820674
	P-value T-Test Cont.			

Exhibit 15. Example_12_2_OUT8.rtf-cont.

Date: 05-29-2 Time: 09:50:5		JDAAN		Page: 2 Table:1	
Example 15-2	nation Method: Taylor Se Sex, CONTRAST.	eries (WR)			
for: Variable =	DRINKER.				
			CONTRAST		
Sex		Estimate with Orig Weight	Estimate with Adjusted Weight	Difference in Estimates	
Total	Cntrst Mean	0.050309	0.048524	0.001785	
	SE Cntrst Mean	0.001842	0.002293	0.001767	
	P-value T-Test Cont. Mean=0	0.000000	0.000000	0.313217	
1 Male	Cntrst Mean	0.055424	0.054253	0.001171	
	SE Cntrst Mean	0.002899	0.003732	0.002640	
	P-value T-Test Cont. Mean=0	0.000000	0.000000	0.657637	
2 Female	Cntrst Mean	0.045593	0.043244	0.002349	
	SE Cntrst Mean	0.002282	0.002678	0.002123	
	P-value T-Test Cont. Mean=0	0.000000	0.000000	0.269473	

Exhibit 15. Example_12_2_OUT8.rtf-cont.

Date: 05-29-20 Time: 09:50:54		JDAAN		Page: 3 Table:1	
Example 15-2	ation Method: Taylor Se ex, CONTRAST.	eries (WR)			
for: Variable =	HIV.	1			
			CONTRAST		
		Estimate	Estimate with	Difference	
		with Orig	Adjusted	in	
Sex		Weight	Weight	Estimates	
Total	Cntrst Mean	0.022058	0.024380	-0.002322	
	SE Cntrst Mean	0.001463	0.002040	0.001069	
	P-value T-Test Cont. Mean=0	0.000000	0.000000	0.030540	
1 Male	Cntrst Mean	0.024400	0.027277	-0.002877	
	SE Cntrst Mean	0.002110	0.002729	0.001450	
	P-value T-Test Cont. Mean=0	0.000000	0.000000	0.048141	
2 Female	Cntrst Mean	0.019888	0.021686	-0.001798	
	SE Cntrst Mean	0.001640	0.002352	0.001385	
	P-value T-Test Cont. Mean=0	0.000000	0.000000	0.195364	

Page 1 of *Exhibit 15*, above, indicates that the cancer estimate is 7.1909% using the original full sample with the original weight, and 7.2253% using the Week 1-8 sample and the new, nonresponse-adjusted weight. The corresponding standard errors are .2126% and .2727%, respectively, so the standard error is greater for estimates generated using the Week 1-8 subsample. This is not surprising since the sample size is smaller. The output also indicates that the p-value associated with the difference is 0.857422 (i.e., the difference is not significant).

The output indicates that the only differences that are significantly different at the .05 level are the HIV estimates for total sample (p=.030540) and for males (p=.048141). As mentioned earlier in this example, we really did not expect to see any differences. In the NHIS, the sample is randomly assigned to weeks, so there is no reason to believe the sample in Weeks 9-13 is really any different than the sample in Weeks 1-8. This dataset was chosen for this example for illustration purposes only.