

### Survey data analysis made easy with SAS

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#### Outline

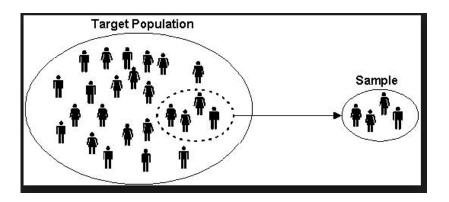
Why use survey procedures Key survey design features Examples:

- PROC SURVEYFREQ
- PROC SURVEYMEANS
- PROC SURVEYLOGISTIC
- PROC SURVEYREG



# What is a survey?

A sample of individuals to represent a population:



Examples: National Health and Nutrition Examination Survey, National Health Interview Survey

# Why do we need to use survey procedures?

To take into account the design of the survey

- Sampling
- Weighting

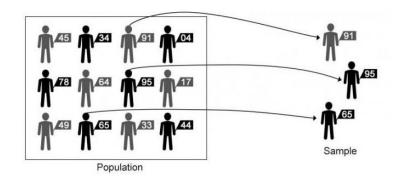
# Why do we need to use survey procedures?

# Sampling

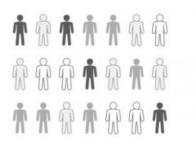


# Sampling

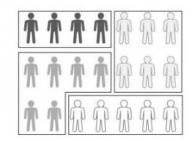
# Simple random



Stratified

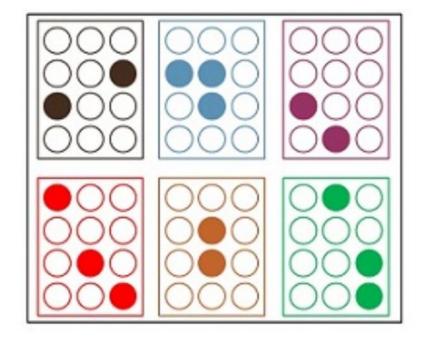


Random Population



Stratified Population

# Sampling





Stratified

Cluster

# Sampling

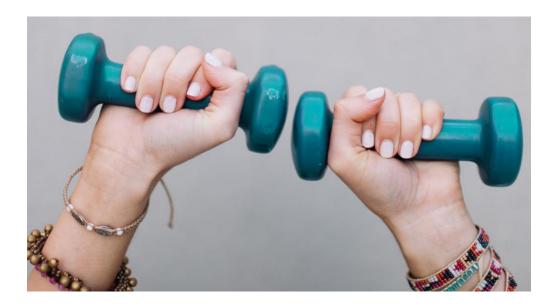
### Individuals within clusters are similar

• Overestimate variance – significance



# Weighting

Weight: a value indicating the number of people the respondent represents

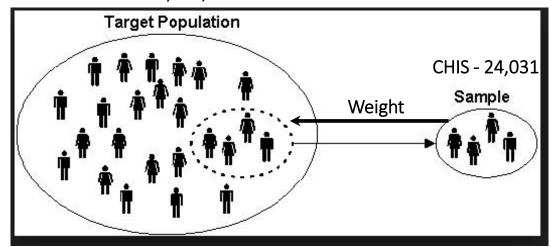




# Weighting

Weight: a value indicating the number of people the respondent represents







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# Weighting

#### Corrects for:

- differing probability of sampling in different clusters or strata
- nonresponse

# Key SAS Survey Design Features

Stratification: STRATA statement

• Clustering: **CLUSTER** statement

• Weighting: **WEIGHT** statement

# Key SAS Survey Design Features

Subpopulation analyses:

DOMAIN statement or "flag" variables

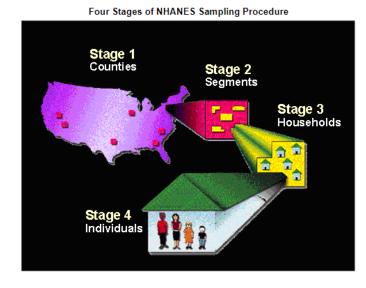
Do not use "where", "by", or "if" to subset data

# **Examples- NHANES and CHIS**

National Health and Nutrition Examination Survey (NHANES)

Four Stages of NHANES Sampling Procedure

- stratified, cluster design
- in person survey
- one weight per person



# Examples – NHANES and CHIS

# California Health Interview Survey (CHIS)

- stratified random sample
- telephone survey
- replicate weights
  - 80 weights per person





### SAS code!





# PROC SURVEYFREQ -syntax

```
Taylor is the default
```

```
proc surveyfreq data=dataset varmethod=taylor;
strata stratum;
cluster PSU;
weight weightvar;
tables agegrp;
tables agegrp;
run;
proc freq data=dataset;
tables agegrp;
run;
```

# PROC SURVEYFREQ – NHANES example

```
proc surveyfreq data=NHANES;
strata sdmvstra;
                             Confidence limits
cluster sdmvpsu;
weight WTINT2YR;
tables ridreth3/ cl;
run;
proc freq data=NHANES;
table ridreth3/binomial (level=1) cl;
run;
```



# Results with and without adjusting for survey factors

Race/ethnicity	Without survey procedures			With survey procedures			
	n	Percent	95% CI	n	Percent	95% CI	
Mexican American	1730	17.0	16.3, 17.7	1730	11.1	6.8, 15.3	
Other Hispanic	960	9.4	8.9, 10.0	960	6.0	3.8, 8.3	
NH White	3674	36.1	35.2, 37.0	3674	62.2	54.5, 70.0	
NH Black	2267	22.3	21.5, 23.1	2267	12.1	8.4, 15.8	
NH Asian	1074	10.6	10.0, 11.2	1074	5.2	3.9, 6.5	
other	470	4.6	4.2, 5.0	470	3.4	2.4, 4.4	

# PROC SURVEYFREQ- CHIS example

Does hypertension differ by gender?

```
proc surveyfreq data=CHIS varmethod=jackknife;
weight rakedw0;
repweight rakedw1-rakedw80 / JKCOEFS=1;
tables srsex * ab29 / row cl nototal chisq;
run;

Gender Hypertension Row percent Chi-square
```

Data Summary					
Number of Observations	21055				
Sum of Weights	29390199.7				

Variance Estimation					
Method Jackknife					
Replicate Weights	ADULT				
Number of Replicates	80				

	Table of SRSEX by AB29											
SRSEX	AB29	Frequency	Weighted Frequency	Std Dev of Wgt Freq	Percent	Std Err of Percent	95% Confide for Pe		Row Percent		95% Confide for Row	
Male	Yes	3747	4457319	174688	15.1660	0.5944	13.9832	16.3483	31.0260	1.2159	28.6061	33.4458
	No	5420	9759533	169867	33.2068	0.5780	32.0566	34.3570	67.9329	1.1824	65.5799	70.2860
	Borderline HTN	140	149569	33823	0.5089	0.1151	0.2799	0.7379	1 0411	0.2354	0.5726	1.5096
Female	Yes	4395	3878467	127700	13.1965	0.4345	12.3318	14.061	25.8155	0.8500	24.1240	27.5071
	No	7245	11053943	127459	37.6110	0.4337	36.7479	38.4740	73.5763	0.8484	71.8880	75.2647
	Borderline HTN	108	91368	21963	0.3109	0.0747	0.1622	0.4596	0.6082	0.1462	0.3172	0.8991

Rao-Scott Chi-Square Test					
Pearson Chi-Square	86.0484				
Design Correction	5.8150				
Rao-Scott Chi-Square	14.7978				
DF	2				
Pr > ChiSq	0.0006				
F Value	7.3989				
Num DF	2				
Den DF	160				
	0 0008				
Pr > F	0.0006				

Reminder: Don't subset the data



### PROC SURVEYMEANS- CHIS example

Does the frequency of walking for leisure differ by age?

### Results

#### The SAS System

#### The SURVEYMEANS Procedure

	Statistics for SRAGE_P1 Domains									
SRAGE_P1	Variable	Label	N	Mean	Std Error of Mean	95% CL 1	for Mean			
18-29	AD41W	# TIMES WALKED AT LEAST 10 MIN FOR LEISURE PAST 7 DAYS	2802	3.016137	0.213305	2.59164564	3.44062809			
30-49	AD41W	# TIMES WALKED AT LEAST 10 MIN FOR LEISURE PAST 7 DAYS	4587	2.687602	0.152270	2.38457612	2.99062815			
50-69	AD41W	# TIMES WALKED AT LEAST 10 MIN FOR LEISURE PAST 7 DAYS	8337	2.900668	0.149342	2.60346776	3.19786896			
70+	AD41W	# TIMES WALKED AT LEAST 10 MIN FOR LEISURE PAST 7 DAYS	5329	2.534561	0.205938	2.12473082	2.94439086			

### PROC SURVEYLOGISTIC – CHIS example

Are you more likely to not have a usual source of care if you are uninsured?

```
proc surveylogistic data=CHIS varmethod=JACKKNIFE;
weight rakedw0;
repweight rakedw1-rakedw80/JKCOEFS=1;
class uninsured (ref='Insured')/ param=ref;
model nousual (descending) = uninsured;
format uninsured unins.;
run;
```



Class Level Information						
Class	Class Value Design Variables					
uninsured	Insured	-1				
	Uninsured	1				

Variance Estimation					
Method	Jackknife				
Replicate Weights	ADULT				
Number of Replicates	80				

#### Model Convergence Status

Convergence criterion (GCONV=1E-8) satisfied.

Model Fit Statistics						
Criterion Intercept Only Intercept an Covariate						
AIC	22890096	21137570				
SC	22890104	21137585				
-2 Log L	22890094	21137566				

Testing Global Null Hypothesis: BETA=0							
Test F Value Num DF Den DF Pr > F							
Likelihood Ratio	1752529	1	Infty	<.0001			
Score	57.68	1	80	<.0001			
Wald	89.21	1	80	<.0001			

Type 3 Analysis of Effects						
Effect DF Chi-Square Pr > ChiSq						
uninsured	<.0001					

Analysis of Maximum Likelihood Estimates						
Parameter Estimate Standard Error t Value Pr >  t						
Intercept		-1.0612	0.0759	-13.98	<.0001	
uninsured	Uninsured	0.8232	0.0872	9.45	<.0001	
NOTE: The degrees of freedom for the t tests is 80.						

Odds Ratio Estimates				
Effect	Point Estimate	95% Confidence Limits		
uninsured Uninsured vs Insured	5.188	3.668	7.340	
NOTE: The degrees of freedom in computing the confidence limits is 80.				

Association of Predicted Probabilities and Observed Responses				
Percent Concordant	33.7	Somers' D	0.275	
Percent Discordant	6.3	Gamma	0.686	
Percent Tied	60.0	Tau-a	0.071	
Pairs	22790240	С	0.637	

### PROC SURVEYREG – NHANES example

Does cotinine differ by health insurance status?

```
PROC SURVEYREG DATA = NHANES;
STRATUM sdmvstra;
CLUSTER sdmvpsu;
WEIGHT mec10yr;
DOMAIN set;
CLASS hi; ← hi = health insurance
MODEL lbxcot=hi / solution clparm;
run;
                   Requests
                                    Confidence limits
                   parameter estimates
```

**#SASGF** 

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#### The SAS System

#### The SURVEYREG Procedure

set=1

#### **Domain Regression Analysis for Variable LBXCOT**

Domain Summary			
Number of Observations	19984		
Number of Observations in Domain	19984		
Number of Observations Not in Domain	0		
Sum of Weights in Domain	173040335		
Weighted Mean of LBXCOT	65.85795		
Weighted Sum of LBXCOT	1.13961E10		

Fit Statistics			
R-Square	0.02606		
Root MSE	131.37		
Denominator DF	79		

Tests of Model Effects				
Effect	Num DF	F Value	Pr > F	
Model	3	68.17	<.0001	
Intercept	1	715.99	<.0001	
hi	3	68.17	<.0001	

Estimated Regression Coefficients						
Parameter	Estimate	Standard Error	t Value	Pr >  t	95% Confidence Interval	
Intercept	88.954231	4.13942163	21.49	<.0001	80.714918	97.193544
hi medicaid	28.249178	5.49630214	5.14	<.0001	17.309062	39.189294
hi other	-2.501724	5.72169621	-0.44	0.6631	-13.890476	8.887027
hi private	-38.584854	3.85904640	-10.00	<.0001	-46.266094	-30.903615
hi uninsured	0.000000	0.00000000			0.000000	0.000000

#### Conclusion

Survey is a sample of the population

Adjust for the survey design features in SAS

Examples using CHIS and NHANES data

# Thank you!

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