Steps in Quantitative Research

## Example research questions

Research question 1: what are the racial/ethnic disparities in health-related quality of life (HRQOL) among the general population and among people with low SES (education and/or income) particularly?

Research question 2: What are the racial/ethnic disparities in health care access among the general population and among people with low SES (education and/or income) particularly?

## 1. Obtain data

- Can the data be used to address the research questions and hypotheses?
- How were the data collected?
- If random sampling, what was the sampling technique?
- If intervention study, what was the study design?
- What was the sampling unit of the data? What was the sample size?
- Do we have enough statistical power to test the research hypotheses if required?


## BRFSS 2021 data

- Can BRFSS 2021 data be used to address the research questions?
- For health-related quality of life, BRFSS 2021 has
- the days of physical health not good (PHYSHLTH)
- the days of mental health not good (MENTHLTH)
- the days poor physical or mental health keep you from doing your usual activities (POORHLTH).
- For health care access, BRFSS 2021 has
- visited a doctor within the past year (CHECKUP1)
- could not see a doctor when needed in the past year (MEDCOST1).
- Independent variables: racial/ethnic groups, education, income, health insurance coverage, and other basic demographic variables.
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## BRFSS 2021 data

- BRFSS 2021 is a national complex samples telephone survey of noninstitutionalized U.S. residents aged 18 years and older (the population).
- The total sample size is 438,693 in 2,140 strata with a median response rate of $44 \%$ (ranged from $23.5 \%$ to $60.5 \%$ ).
- Florida was unable to collect enough BRFSS data in 2021 to meet the minimum requirements for inclusion in the 2021 BRFSS public-use data set (undercoverage).


## Research hypotheses

Research question 1: what are the racial/ethnic disparities in health-related quality of life (HRQOL) among the general population and among people with low SES (education and/or income) particularly?

- Hypothesis 1.1: The average \# of days of physical health not good differs among racial/ethnic groups.
- Hypothesis 1.2: This racial/ethnic disparity deepens in people with low SES.

Research question 2: What are the racial/ethnic disparities in health care access among the general population and among people with low SES (education and/or low income) particularly?

- Hypothesis 2.1: The odds of visited a doctor within the past year differs among racial/ethnic groups.

Hypothesis 2.2: This racial/ethnic disparity deepens in people with low SES.

## Power and sample size analysis

- Formal power and sample size analysis is not necessary for exploratory data analysis. Describe the data generation process such as inclusion/exclusion criteria.
- For each research hypothesis, hypothesized values of parameters are needed. For example:
- Hypothesis 1.1: The average \# of days of physical health not good differs among racial/ethnic groups.
- For quantitative data, we need mean and standard deviation of PHYSHLTH for each racial/ethnic group.
- Hypothesis 2.1: The odds of visited a doctor within the past year differs among racial/ethnic groups.
- For categorical data, we need \% people visited a doctor within the past year for each racial/ethnic group.
- For subgroup analyses, the sample size requirement is higher.

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## 2. Data cleaning

- Know how the data were originally collected?
- Go through the data and obtain summary statistics to verify the data. Do some data cleaning if necessary.
- Recode the data if necessary to fit the research questions and hypotheses.
- Pay attention to missing data. How do we handle missing data? Is imputation needed.


## BRFSS 2021 data

| Label: Number of Days Physical Health Not Good <br> Section Name: Healthy Days <br> Core Section Number: 2 <br> Question Number: 1 <br> Column: 102-103 <br> Use it as quantitative data or categorize it? <br> Type of Variable: Num <br> SAS Variable Name: PHYSHLTH <br> Question Prologue: <br> Question: Now thinking about your physical health, which jicludes physical illness and injury, for how many days during the past 30 days was your physical health not good? |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: |
| Value | Value Label |  | Frequency | Percentage | Weighted Percentage |
| $1-30$ | Number of days |  | 141,403 | 32.23 | 31.47 |
| 88 | None $\longrightarrow$ | 0 | 287,796 | 65.60 | 66.53 |
| 77 | Don't know/Not sure $\longrightarrow$ | Missing | 7,898 | 1.80 | 1.66 |
| 99 | Refused $\longrightarrow$ | data | 1,593 | 0.36 | 0.34 |
| BLANK | Not asked or Missing $\longrightarrow$ |  | 3 |  |  |

## BRFSS 2021 data

## Label: Length of time since last routine checkup

Section Name: Health Care Access
Core Section Number: 3
Question Number: 4
Column: 112
Type of Variable: Num
SAS Variable Name: CHECKUP1
Question Prologue:
Use it as ordinal data or dichotomize it?

Question: About how long has it been since you last visited a doctor for a routine checkup? [A routine checkup is a general physical exam, not an exam for a specific injury, i/ness, or condition.]

| Value | Value Label | Frequency | Percentage | Weighted Percentage |
| :---: | :---: | :---: | :---: | :---: |
| 1 | Within past year (anytime $<12$ months ago) | 337,289 | 76.89 | 72.51 |
| 2 | Within past 2 years (1 year but $<2$ years ago) | 51,271 | 11.69 | 13.78 |
| 3 | Within past 5 years (2 years but < 5 years ago) | 23,427 | 5.34 | 6.68 |
| 4 | 5 or more years ago | 18,490 | 4.21 | 4.83 |
| 7 | Don't know/Not sure $\longrightarrow$ Missing data | 5,233 | 1.19 | 1.32 |
| 8 | Never $\longrightarrow$ Combine with 4 | 2,311 | 0.53 | 0.72 |
| 9 | Refused $\longrightarrow$ Missing data | 670 | 0.15 | 0.17 |
| BLANK | Not asked or Missing $\rightarrow$ Missing data | 2 | - | - |

## BRFSS 2021 data

Label: Imputed race/ethnicity value
Section Name: Weighting Variables
Module Number: 1
Question Number: 12
Column: 1471-1472
Type of Variable: Num
SAS Variable Name: _IMPRACE
Question Prologue:
Question: Imputed race/ethnicity value (This value is the reported race/ethnicity or an imputed race/ethnicity, if the respondent refused to give a race/ethnicity. The value of the imputed race/ethnicity will be the most common race/ethnicity response for that region of the state)

| Value | Weighted <br> Percentage |  |  |  |
| :---: | :--- | :---: | :---: | :---: |
| 1 | White, Non-Hispanic | Frequency | Percentage | 332,222 |
| 2 | Black, Non-Hispanic | 33,132 | 75.73 | 62.08 |
| 3 | Asian, Non-Hispanic | 11,557 | 2.63 | 11.64 |
| 4 | American Indian/Alaskan Native, Non-Hispanic | 7,410 | 1.69 | 0.96 |
| 5 | Hispanic | 38,688 | 8.82 | 17.19 |
| 6 | Other race, Non-Hispanic | 15,684 | 3.58 | 2.26 |

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For a sample size consideration, are some minority groups too small for data analysis?

## Missing data

- With about 2\% missing data, it should not be a concern here. Analyzing complete cases (cases with no missing data) should not prohibit us from generalize our results to the population.
- If less than $10 \%$ data are missing on each variable, we can impute the missing data by methods such as hot deck, mean imputation, or regression.
- Often, multiple imputations are preferred to account for the extra variations from the missing data.

But few good methods can help effectively deal with excessive missing data.

## BRFSS 2021 data



## Imputation

- Hot-deck/cold-deck: impute data from similar record(s) either from the same dataset or from a different dataset. May involve sorting the dataset by some variable(s) based on the observed data.
- Mean imputation: impute data with the mean of the variable based on all observed cases. This underestimates the variance and attenuates any correlations between the imputed variable and other variables.
- Regression imputation: impute data with predicted values from a regression model. This still underestimates the variance but may overestimate correlations with other variables.
- Multiple imputation: impute data with multiple randomly generated values (from a model). Multiple copies of imputed data will be generated and analyzed, and results will be pooled together.


## Missing data mechanisms

- Missing completely at random: the reason the data are missing is completely random.
- Example: simply forgot to provide responses to some survey questions.
- Missing at random: the cause of the missingness depends on some observed variable(s) for which data have been collected.
- Example: failure to provide responses to some survey questions may be related to one's age and health conditions which are available.
- Missing not at Random: the cause of the missingness may depend on the value of the missing data itself so cannot be controlled for.
- Example: not willing to provide income because it is very high (for a tax concern). A survey of an acute illness missed some respondents because they were ill at home. Or the variable(s) related to the missingness is simply not measured.


## 3. Data summary

- Obtain data summary plots and statistics for all data involved.
- Pay attention to the distributions of the data.
- If any outliers, are they to be removed?
- If strong skewness in the data, are remediation measures necessary?
- Is sensitivity analysis necessary?
- Data summary will also help you choose appropriate statistical methods to analyze the data.


## Assumptions in analysis

- Two-sample t-test
- The two groups of data are independent and not too far from a normal distribution.
- A larger sample size is required to deal with more skewed data.
- Analysis of variance
- Each group of data are independent and not too far from a normal distribution.
- Group variances are often assumed the same.
- Linear regression
- The relationship between the response and predictor(s) are linear.
- The errors are independent and not too far from a normal distribution.
- The error variance is constant.
- Logistic regression
- The data are independent, and the logit (log odds) is linearly related to the predictor(s).


## BRFSS 2021 data



| Analysis Variable : PHYSHLTH NUMBER OF DAYS PHYSICAL HEALTH NOT GOOD |  |  |  |  |  |  |  |
| ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: |
| N | Mean | Std Dev | Minimum | Lower Quartile | Median | Upper Quartile | Maximum |
| 429199 | 3.80 | 8.35 | 0.00 | 0.00 | 0.00 | 2.00 | 30.00 |

## BRFSS 2021 data



| LENGTH OF TIME SINCE LAST ROUTINE CHECKU |  |  |  |  |
| ---: | ---: | ---: | ---: | ---: |
| CHECKUP1 | Frequency | Percent | Cumulative <br> Frequency | Cumulative <br> Percent |
| Within past year (anytime less than 12 months ago) | 337289 | 77.93 | 337289 | 77.93 |
| Within past 2 years (1 year but less than 2 years ago) | 51271 | 11.85 | 388560 | 89.78 |
| Within past 5 years (2 years but less than 5 years ago) | 23427 | 5.41 | 411987 | 95.19 |
| 5 or more years ago | 20801 | 4.81 | 432788 | 100.00 |
| Frequency Missing = 5905 |  |  |  |  |

## BRFSS 2021 data



| IMPUTED RACE/ETHNICITY VALUE |  |  |  |  |  |  |
| ---: | ---: | ---: | ---: | ---: | :---: | :---: |
| _IMPRACE | Frequency | Percent | Cumulative <br> Frequency | Cumulative <br> Percent |  |  |
| White, Non-Hispanic | 332222 | 75.73 | 332222 | 75.73 |  |  |
| Black, Non-Hispanic | 33132 | 7.55 | 365354 | 83.28 |  |  |
| Asian, Non-Hispanic | 11557 | 2.63 | 376911 | 85.92 |  |  |
| American Indian/Alaskan Native, Non-Hispanic | 7410 | 1.69 | 384321 | 87.61 |  |  |
| Hispanic | 38688 | 8.82 | 423009 | 96.42 |  |  |
| Other race, Non-Hispanic | 15684 | 3.58 | 438693 | 100.00 |  |  |

## 4. Data analysis

- Choose appropriate statistical methods to address the research questions and hypotheses using available data.
- Conduct the analyses and investigate the results.
- All statistical models have assumptions. Verify those assumptions using diagnostic plots and statistics. If assumptions were violated, take necessary remediation measures.
- Is the chosen statistical model appropriate? Are the chosen variables necessary and enough to address the research questions and hypotheses. If not, revise the model and refine the variable selection.
- Run the revised analyses, investigate the results, and check model diagnostics



## PHYSHLTH vs. race/ethnicity

- The days of physical health not good (PHYSHLTH) is strongly skewed with excessive number of zeros.
- It is of practical sense to compare the mean \# of days physical health not good (as an exploratory analysis) among the racial/ethnic populations.
- But testing the hypothesis of any difference among the racial/ethnic populations using ANOVA might be problematic. The complex samples procedures (especially with bootstrap variance estimation) may help.


## PHYSHLTH vs. race/ethnicity

## Proc surveymeans

| Statistics for _IMPRACE Domains |  |  |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| IMPUTED RACE/ETHNICITY Value | Variable | Label | N | Mean |  | 95\% CL for Mean |  |
| White, Non-Hispanic | PHYSHLTH | NUMBER OF DAYS PHYSICAL HEALTH NOT GOOD | 325385 | 3.637754 | 0.028419 | 3.58205387 | 3.69345315 |
| Black, Non-Hispanic | PHYSHLTH | NUMBER OF DAYS PHYSICAL HEALTH NOT GOOD | 32217 | 3.771516 | 0.081631 | 3.61152202 | 3.93151069 |
| Asian, Non-Hispanic | PHYSHLTH | NUMBER OF DAYS PHYSICAL HEALTH NOT GOOD | 11351 | 1.919175 | 0.147421 | 1.63023353 | 2.20811552 |
| American Indian/Alaskan Native, Non-Hispanic | PHYSHLTH | NUMBER OF DAYS PHYSICAL HEALTH NOT GOOD | 7188 | 5.309918 | 0.250908 | 4.81814602 | 5.80168946 |
| Hispanic | PHYSHLTH | NUMBER OF DAYS PHYSICAL HEALTH NOT GOOD | 37785 | 3.411069 | 0.075875 | 3.26235502 | 3.55978215 |
| Other race, Non-Hispanic | PHYSHLTH | NUMBER OF DAYS PHYSICAL HEALTH NOT GOOD | 15273 | 4.047943 | 0.154126 | 3.74586085 | 4.35002486 |

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## PHYSHLTH vs. race/ethnicity

## Proc surveyreg

| Data Summary |  |
| :--- | ---: |
| Number of Observations | 429199 |
| Sum of Weights | 241109851 |
| Weighted Mean of PHYSHLTH | 3.53807 |
| Weighted Sum of PHYSHLTH | 853064005 |


| Tests of Model Effects |  |  |  |
| :--- | ---: | ---: | ---: |
| Effect | Num DF | F Value | $\operatorname{Pr}>F$ |
| Model | 5 | 52.81 | $<.0001$ |
| Intercept | 1 | 6110.30 | $<.0001$ |
| IMPRACE | 5 | 52.81 | $<.0001$ |

Note: The denominator degrees of freedom for the $F$ tests is 427126

| Estimated Regression Coefficients |  |  |  |  |
| :--- | ---: | ---: | ---: | ---: |
| Parameter | Estimate | Standard <br> Error | $\mathbf{t}$ Value | $\operatorname{Pr}>\|\mathbf{t \|}\|$ |
| Intercept | 3.6377535 | 0.01938710 | 187.64 | $<.0001$ |
| _IMPRACE American Indian/Alaskan Native, Non-Hispanic | 1.6721642 | 0.19882037 | 8.41 | $<.0001$ |
| IMPRACE Asian, Non-Hispanic | -1.7185790 | 0.13690935 | -12.55 | $<.0001$ |
| _IMPRACE Black, Non-Hispanic | 0.1337628 | 0.05927404 | 2.26 | 0.0240 |
| _IMPRACE Hispanic | -0.2266849 | 0.06031160 | -3.76 | 0.0002 |
| _IMPRACE Other race, Non-Hispanic | 0.4101893 | 0.12607538 | 3.25 | 0.0011 |
| _IMPRACE White, Non-Hispanic | 0.0000000 | 0.00000000 |  |  |


| Design Summary |  |
| :--- | ---: |
| Number of Strata | 2138 |
| Number of Strata Collapsed | 66 |
| Number of Clusters | 429199 |


| Fit Statistics |  |
| :--- | ---: |
| R-Square | 0.003215 |
| Root MSE | 7.9831 |
| Denominator DF | 427126 |

## PHYSHLTH vs. race/ethnicity by income

Proc surveyreg with income level as a domain

|  |  | Income |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: |
| Race/ethnicity | All | <\$15K | \$15K-\$50K | $\begin{aligned} & \text { \$50K- } \\ & \$ 100 \mathrm{~K} \end{aligned}$ | >\$100K |
| American Indian/Alaskan Native, Non-Hispanic | 1.67 | -0.55 | 0.59 | 0.17 | 0.95 |
| Asian, Non-Hispanic | -1.72 | -6.05 | -2.86 | -0.90 | -0.62 |
| Black, Non-Hispanic | 0.13 | -2.07 | -1.10 | -0.51 | 0.19 |
| Hispanic | -0.23 | -3.77 | -1.92 | -0.28 | 0.07 |
| Other race, Non-Hispanic | 0.41 | -0.11 | -0.26 | 0.48 | -0.20 |
| White, Non-Hispanic | 0.00 | 0.00 | 0.00 | 0.00 | 0.00 |

* SAS complained no sufficient memory for testing the interaction between race/ethnicity and income!


## PHYSHLTH vs. race/ethnicity by income

Proc surveyreg with income level as a domain

|  |  | Income |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: |
| Race/ethnicity | All | <\$15K | \$15K-\$50K | $\begin{aligned} & \text { \$50K- } \\ & \$ 100 \mathrm{~K} \end{aligned}$ | >\$100K |
| American Indian/Alaskan Native, Non-Hispanic | 1.98 | -0.73 | 0.90 | 0.20 | 0.94 |
| Asian, Non-Hispanic | -1.18 | -4.89 | -2.24 | -0.58 | -0.53 |
| Black, Non-Hispanic | 0.34 | -2.22 | -0.74 | -0.39 | 0.18 |
| Hispanic | 0.29 | -2.96 | -1.13 | 0.08 | 0.19 |
| Other race, Non-Hispanic | 0.81 | -0.03 | 0.23 | 0.75 | -0.16 |
| White, Non-Hispanic | 0.00 | 0.00 | 0.00 | 0.00 | 0.00 |

* Analyses adjusted by age, sex, and health insurance coverage.


## Dichotomized PHYSHLTH

Proc surveyfreq

| Data Summary |  |
| :--- | ---: |
| Number of Strata | 2140 |
| Number of Clusters | 438693 |
| Number of Observations | 438693 |
| Sum of Weights | 246041640 |


| Table of PHYSHLTH_2g |  |  |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| PHYSHLTH_2g | Frequency | Weighted <br> Frequency | Std Err of Wgt Freq | Percent | Std Err of Percent | 95\% Confidence Limits for Percent |  |
| 0 | 287796 | 163683774 | 520969 | 67.8876 | 0.1578 | 67.5784 | 68.1969 |
| 1 | 141403 | 77426077 | 406052 | 32.1124 | 0.1578 | 31.8031 | 32.4216 |
| Total | 429199 | 241109851 | 499400 | 100.0000 |  |  |  |

## PHYSHLTH > 0 vs. race/ethnicity

## Proc surveyfreq

| RACE/ETHNICITY | PHYSHLTH>0 | Weighted | Row percent | Std Err |
| :---: | ---: | ---: | ---: | ---: |
| White, Non-Hispanic | 107848 | 49974343 | 33.34 | 0.17 |
| Black, Non-Hispanic | 11089 | 9253632 | 33.15 | 0.48 |
| Asian, Non-Hispanic | 2553 | 3380316 | 23.76 | 0.98 |
| American Indian/Alaskan Native, Non- | 2756 | 891353 | 38.97 | 1.20 |
| Hispanic | 11750 | 12059279 | 29.17 | 0.47 |
| Hispanic | 5407 | 1867154 | 34.32 | 0.83 |
| Other race, Non-Hispanic |  |  |  |  |


| Rao-Scott Chi-Square Test |  |
| :--- | ---: |
| Pearson Chi-Square | 1421.3381 |
| Design Correction | 6.0896 |
|  |  |
| Rao-Scott Chi-Square | 233.4024 |
| DF | 5 |
| Pr $>$ ChiSq | $<.0001$ |
|  | 46.6805 |
| F Value | 5 |
| Num DF | 2135305 |
| Den DF | $<.0001$ |
| Pr $>$ F |  |
| Sample Size $=429199$ |  |

## PHYSHLTH > 0 vs. race/ethnicity

Proc surveylogistic

| Type 3 Analysis of Effects |  |  |  |  |  |
| :--- | ---: | ---: | ---: | ---: | :---: |
| Effect | F Value | Num DF | Den DF | $\operatorname{Pr}>$ F |  |
| IMPRACE | 33.30 | 5 | 427057 | $<.0001$ |  |


| Odds Ratio Estimates |  |  |  |
| :---: | :---: | :---: | :---: |
| Effect | Point Estimate | 95\% Confid | Limits |
| _IMPRACE American Indian/Alaskan Native, Non-Hispanic vs White, Non-Hispanic | 1.277 | 1.155 | 1.411 |
| _IMPRACE Asian, Non-Hispanic vs White, Non-Hispanic | 0.623 | 0.560 | 0.693 |
| _IMPRACE Black, Non-Hispanic vs White, Non-Hispanic | 0.992 | 0.948 | 1.037 |
| _IMPRACE Hispanic vs White, Non-Hispanic | 0.823 | 0.786 | 0.863 |
| _IMPRACE Other race, Non-Hispanic vs White, Non-Hispanic | 1.045 | 0.971 | 1.125 |
| NOTE: The degrees of freedom in computing the confidence limits is 427061. |  |  |  |

## PHYSHLTH > 0 vs. race/ethnicity

Proc surveylogistic

| Odds ratio | All | <\$15K | $\begin{aligned} & \$ 15 K- \\ & \$ 50 K \end{aligned}$ | $\begin{aligned} & \$ 50 \mathrm{~K}- \\ & \$ 100 \mathrm{~K} \end{aligned}$ | >\$100K |
| :---: | :---: | :---: | :---: | :---: | :---: |
| American Indian/Alaskan Native, Non-Hispanic vs White, Non-Hispanic | 1.28 | 0.97 | 1.04 | 0.95 | 1.09 |
| Asian, Non-Hispanic vs White, Non-Hispanic | 0.63 | 0.34 | 0.49 | 0.78 | 0.80 |
| Black, Non-Hispanic vs White, Non-Hispanic | 0.99 | 0.84 | 0.79 | 0.84 | 0.93 |
| Hispanic vs White, Non-Hispanic | 0.82 | 0.46 | 0.56 | 0.89 | 1.01 |
| Other race, Non-Hispanic vs White, Non-Hispanic | 1.04 | 0.78 | 0.95 | 1.01 | 0.93 |


| Joint Tests |  |  |  |  |
| :--- | ---: | ---: | ---: | ---: |
| Effect | F Value | Num DF | Den DF | Pr > F |
| _IMPRACE | 37.44 | 5 | 336318 | $<.0001$ |
| income_4g | 80.26 | 3 | 336320 | $<.0001$ |
| _IMPRACE*_income_4g | 8.15 | 15 | 336308 | $<.0001$ |

## PHYSHLTH > 0 vs. race/ethnicity

Proc surveylogistic

| Odds ratio | All | <\$15K | $\begin{aligned} & \$ 15 K- \\ & \$ 50 \mathrm{~K} \end{aligned}$ | $\begin{aligned} & \text { \$50K- } \\ & \$ 100 \mathrm{~K} \end{aligned}$ | >\$100K |
| :---: | :---: | :---: | :---: | :---: | :---: |
| American Indian/Alaskan Native, Non-Hispanic vs White, Non-Hispanic | 1.34 | 0.96 | 1.07 | 0.93 | 1.09 |
| Asian, Non-Hispanic vs White, Non-Hispanic | 0.66 | 0.36 | 0.52 | 0.78 | 0.82 |
| Black, Non-Hispanic vs White, Non-Hispanic | 1.00 | 0.82 | 0.80 | 0.84 | 0.92 |
| Hispanic vs White, Non-Hispanic | 0.87 | 0.47 | 0.59 | 0.93 | 1.04 |
| Other race, Non-Hispanic vs White, Non-Hispanic | 1.08 | 0.77 | 0.95 | 1.02 | 0.93 |


| Type 3 Analysis of Effects |  |  |  |  |
| :--- | ---: | ---: | ---: | ---: |
| Effect | F Value | Num DF | Den DF | Pr > F |
| _age_4g | 24.41 | 3 | 328317 | $<.0001$ |
| _SEX | 188.63 | 1 | 328319 | $<.0001$ |
| _HLTHPLN | 28.28 | 1 | 328319 | $<.0001$ |
| _IMPRACE | 29.34 | 5 | 328315 | $<.0001$ |
| _income_4g | 83.06 | 3 | 328317 | $<.0001$ |
| _IMPRACE | income_4g | 7.51 | 15 | 328305 |$\ll .0001$

## 5. Result reporting

- Write the method section to summarize the method used in data analysis.
- Prepare necessary tables and figures to illustrate the results. We often need a summary data, maybe a bivariate analysis table, and a table for the final model. Sometimes figures are better to illustrate the findings.
- Write the result section to summarize the key findings.
- Write the conclusion and limitations.


## Statistical analysis

Data were summarized in mean (standard deviation) or frequency (percent). Complex samples procedures, proc surveymeans and proc surveyreg, in SAS 9.4 (SAS Institute Inc., Cary, NC) were used to compare the mean number of days physical health not good among the racial/ethnic populations with a Taylor series variance estimation method. When the number of days physical health not good was dichotomized into 0 or 1 or more days, SAS proc surveylogistic was used to compare the odds of having 1 or more days physical health not good among the racial/ethnic populations. In all analyses, the non-Hispanic White population was used as a reference group. Age, sex, and health insurance coverage were considered covariates, while income level was considered an effect modifier for race/ethnicity. A significance level of 0.05 was used.

## Table 1 - Summary

| Variable | Category | Weighted n | Mean or \% | Std Err |
| :---: | :---: | :---: | :---: | :---: |
| \# of days physical health not good |  | 241,109,851 | 3.54 | 0.03 |
| 1 or more days physical health of good |  | 77,426,077 | 32.11 | 0.16 |
| Age | 18-34 | 72,481,409 | 29.46 | 0.16 |
|  | 35-54 | 79,156,834 | 32.17 | 0.16 |
|  | 55-64 | 40,088,457 | 16.29 | 0.12 |
|  | 65+ | 54,314,940 | 22.08 | 0.12 |
| Sex | Male | 119,902,241 | 48.73 | 0.17 |
|  | Female | 126,139,399 | 51.27 | 0.17 |
| Health insurance coverage | Have some form of insurance | 214,432,112 | 91.41 | 0.11 |
|  | Do not have some form of health insurance | 20,162,490 | 8.59 | 0.11 |
| Race/ethnicity | White, Non-Hispanic | 152,731,715 | 62.08 | 0.17 |
|  | Black, Non-Hispanic | 28,639,654 | 11.64 | 0.11 |
|  | Asian, Non-Hispanic | 14,461,978 | 5.88 | 0.12 |
|  | American Indian/Alaskan Native, Non-Hispanic | 2,350,504 | 0.96 | 0.02 |
|  | Hispanic | 42,298,969 | 17.19 | 0.15 |
|  | Other race, Non-Hispanic | 5,558,820 | 2.26 | 0.04 |
| Income level | \$100,000 or more | 51,575,592 | 26.96 | 0.17 |
|  | \$50,000-\$100,000 | 55,555,176 | 29.04 | 0.17 |
|  | \$15,000-\$50,000 | 69,358,743 | 36.26 | 0.18 |
|  | Less than \$15,000 | 14,802,143 | 7.74 | 0.11 |

## Table 2 - bivariate

| Race/ethnicity | \# of days physical health 1 or more days physical not good health of good |  |  |  |
| :---: | :---: | :---: | :---: | :---: |
|  | Mean | Std Err | \% | Std Err |
| White, Non-Hispanic | 3.64 | 0.03 | 33.34 | 0.17 |
| Black, Non-Hispanic | 3.77 | 0.08 | 33.15 | 0.48 |
| Asian, Non-Hispanic | 1.92 | 0.15 | 23.76 | 0.98 |
| American Indian/Alaskan Native, Non-Hispanic | 5.31 | 0.25 | 38.97 | 1.20 |
| Hispanic | 3.41 | 0.08 | 29.17 | 0.47 |
| Other race, Non-Hispanic | 4.05 | 0.15 | 34.32 | 0.83 |

## Table 3 - Models

| Outcome | Race/ethnicity ${ }^{3}$ | Income level |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  |  | All | <\$15K | $\begin{aligned} & \$ 15 \mathrm{~K}- \\ & \$ 50 \mathrm{~K} \end{aligned}$ | $\begin{aligned} & \$ 50 \mathrm{~K}- \\ & \$ 100 \mathrm{~K} \end{aligned}$ | >\$100K |
| \# of days physical health not good (mean difference) ${ }^{1}$ | American Indian/Alaskan Native, Non-Hispanic | 1.98 | -0.73 | 0.90 | 0.20 | 0.94 |
|  | Asian, Non-Hispanic | -1.18 | -4.89 | -2.24 | -0.58 | -0.53 |
|  | Black, Non-Hispanic | 0.34 | -2.22 | -0.74 | -0.39 | 0.18 |
|  | Hispanic | 0.29 | -2.96 | -1.13 | 0.08 | 0.19 |
|  | Other race, Non-Hispanic | 0.81 | -0.03 | 0.23 | 0.75 | -0.16 |
| 1 or more days physical health of good (odds ratio) ${ }^{2}$ | American Indian/Alaskan Native, Non-Hispanic | 1.34 | 0.96 | 1.07 | 0.93 | 1.09 |
|  | Asian, Non-Hispanic | 0.66 | 0.36 | 0.52 | 0.78 | 0.82 |
|  | Black, Non-Hispanic | 1.00 | 0.82 | 0.80 | 0.84 | 0.92 |
|  | Hispanic | 0.87 | 0.47 | 0.59 | 0.93 | 1.04 |
|  | Other race, Non-Hispanic | 1.08 | 0.77 | 0.95 | 1.02 | 0.93 |

1: linear regressions; 2: logistic regressions; 1,2: Models were adjusted for age, sex, and health insurance coverage; 3: White, NonHispanic was the reference group.

## Results

- There were disparities among racial/ethnic populations in the number of days physical health not good. Compared to the non-Hispanic White population, the non-Hispanic Asian population had better physical health, the American Indian/Alaskan Native population had worse physical health, and the non-Hispanic Black and Hispanic populations had similar physical health overall.
- Specifically for people with the lowest income level, all populations had better physical health than the non-Hispanic White population with the non-Hispanic Asian the best, Hispanic the second, and Black the third. However, this disparity gradually diminished as people's income increased.


## Conclusion and limitations

- This study finds racial/ethnic disparities in the number of days physical health not good using BRFSS 2021 data. This disparity was the worst for people with the lowest income level and gradually diminished as people's income increased.
- The BRFSS 2021 is a large national sample survey, but Florida was excluded from the survey because it failed to generate enough sample data. This impairs the generalizability of the results of this study.
- The BRFSS 2021 survey had about $2 \%$ missing data on the outcome, $4 \%$ missing data on health insurance coverage, and $21.5 \%$ on income level. This study used pair-wise deletion in the analyses, which may cause


[^0]:    * SAS complained no sufficient memory for domain comparison!

