**Getting Started** 

Exploratory data analysis

Inference

More Practice

# OIS4 Chap 7, Inference for numerical data

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## **Getting Started**

## Load packages

In this lab, we will explore and visualize the data

- · using the tidyverse suite of packages,
- and perform statistical inference using infer.

The data can be found in the companion package

• for OpenIntro resources, **openintro**.

Let's load the packages.

library(tidyverse)
library(openintro)
library(infer)

#### The data

Every two years, the Centers for Disease Control and Prevention

- · conduct the Youth Risk Behavior Surveillance System (YRBSS) survey,
- where it takes data from high schoolers (9th through 12th grade),
- · to analyze health patterns.

You will work with a selected group of variables

- from a random sample of observations
- · during one of the years the YRBSS was conducted.

Load the yrbss data set into your workspace.

```
data(yrbss)
```

There are observations on 13 different variables,

some categorical and some numerical.

The meaning of each variable can be found

• by bringing up the help file:

```
?yrbss
```

#### Exercise 1 What are the cases in this data set?

· How many cases are there in our sample?

Remember that you can answer this question

- · by viewing the data in the data viewer
- · or by using the following command:

```
glimpse(yrbss)
```

```
## Rows: 13,583
## Columns: 13
## $ age
                             <int> 14, 14, 15, 15, 15, 15, 15, 14, 15, 15, 15, 1...
                             <chr> "female", "female", "female", "female", "fema...
## $ gender
                             ## $ grade
                             <chr> "not", "not", "hispanic", "not", "not", "not"...
## $ hispanic
## $ race
                             <chr> "Black or African American", "Black or Africa...
                             <dbl> NA, NA, 1.73, 1.60, 1.50, 1.57, 1.65, 1.88, 1...
## $ height
                             <dbl> NA, NA, 84.37, 55.79, 46.72, 67.13, 131.54, 7...
## $ weight
                             <chr> "never", "never", "never", "never", "did not ...
## $ helmet 12m
                             <chr> "0", NA, "30", "0", "did not drive", "did not...
## $ text while driving 30d
                             <int> 4, 2, 7, 0, 2, 1, 4, 4, 5, 0, 0, 0, 4, 7, 7, ...
## $ physically_active_7d
                             <chr> "5+", "5+", "5+", "2", "3", "5+", "5+", "5+",...
## $ hours_tv_per_school_day
                             <int> 0, 0, 0, 0, 1, 0, 2, 0, 3, 0, 3, 0, 7, 7, ...
## $ strength_training_7d
## $ school night hours sleep <chr> "8", "6", "<5", "6", "9", "8", "9", "6", "<5"...
```

## **Exploratory data analysis**

You will first start with analyzing

• the weight of the participants in kilograms: weight .

Using visualization and summary statistics,

describe the distribution of weights.

The summary function can be useful.

summary(yrbss\$weight)

```
## Min. 1st Qu. Median Mean 3rd Qu. Max. NA's
## 29.94 56.25 64.41 67.91 76.20 180.99 1004
```

#### Exercise 2 How many observations are we missing weights from?

Next, consider the possible relationship between

- a high schooler's weight
  - and their physical activity.

Plotting the data is a useful first step

- · because it helps us
  - quickly visualize trends,
  - · identify strong associations, and
  - · develop research questions.

First, let's create a new variable physical\_3plus,

- · which will be coded as either "yes"
  - if they are physically active for at least 3 days a week,
- and "no" if not.

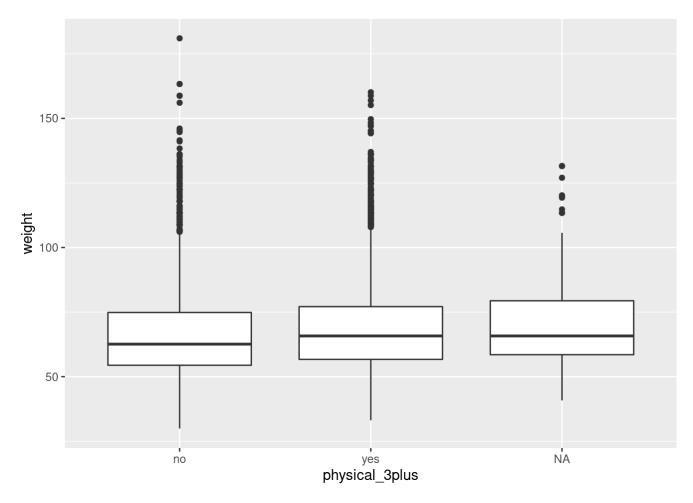
```
yrbss <- yrbss %>%
  mutate(physical_3plus = ifelse(yrbss$physically_active_7d > 2, "yes", "no"))
```

#### Exercise 3 Make a side-by-side boxplot

- of physical\_3plus
- and weight.

```
ggplot(yrbss, aes(x = physical_3plus, y = weight)) + geom_boxplot()
```

## Warning: Removed 1004 rows containing non-finite values (stat boxplot).



Is there a relationship between these two variables?

What did you expect and why?

The box plots show

· how the medians of the two distributions compare,

But we can also compare

- · the means of the distributions using the following
  - to first group the data by the physical\_3plus variable,
  - and then calculate the mean weight in these groups
    - using the mean function
  - while ignoring missing values
    - by setting the na.rm argument to TRUE.

```
yrbss %>%
  group_by(physical_3plus) %>%
  summarise(mean_weight = mean(weight, na.rm = TRUE))
```

There is an observed difference,

· but is this difference statistically significant?

In order to answer this question

· we will conduct a hypothesis test.

## Inference

**Exercise 4** Are all conditions necessary for inference satisfied?

Comment on each.

- · You can compute the group sizes
  - with the summarize command above
  - by defining a new variable with the definition n().

### Exercise 5 Write the hypotheses

- for testing if the average weights are different
  - for those who exercise at least times a week
- · and those who don't.

Next, we will introduce a new function, hypothesize,

• that falls into the infer workflow.

You will use this method

· for conducting hypothesis tests.

But first, we need to initialize the test,

which we will save as obs\_diff.

```
obs_diff <- yrbss %>%
  specify(weight ~ physical_3plus) %>%
  calculate(stat = "diff in means", order = c("yes", "no"))
obs_diff
```

```
## Response: weight (numeric)
## Explanatory: physical_3plus (factor)
## # A tibble: 1 × 1
## stat
## <dbl>
## 1 1.77
```

Notice how you can use the functions

- specify and calculate again
  - like you did for calculating confidence intervals.

Here, though, the statistic you are searching for

- · is the difference in means,
  - with the order being yes no != 0.

After you have initialized the test,

- you need to simulate the test on the null distribution,
- · which we will save as null.

```
null_dist <- yrbss %>%
  specify(weight ~ physical_3plus) %>%
  hypothesize(null = "independence") %>%
  generate(reps = 1000, type = "permute") %>%
  calculate(stat = "diff in means", order = c("yes", "no"))
```

Here, hypothesize is used

to set the null hypothesis as a test for independence.

In one sample cases,

- the null argument can be set to "point"
  - to test a hypothesis relative to a point estimate.

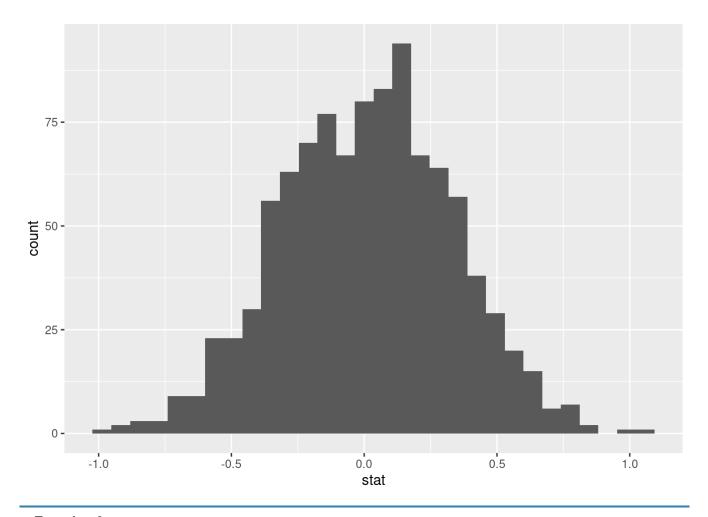
Also, note that the type argument within generate

- · is set to permute, which is the argument
- · when generating a null distribution for a hypothesis test.

We can visualize this null distribution with the following code:

```
ggplot(data = null_dist, aes(x = stat)) +
  geom_histogram()
```

```
## `stat_bin()` using `bins = 30`. Pick better value with `binwidth`.
```



Exercise 6 How many of these null permutations

have a difference of at least obs\_stat?

#### Now that the test

- · is initialized
  - and the null distribution formed,
- you can calculate the p-value for your hypothesis test
  - using the function get\_p\_value .

```
null_dist %>%
  get_p_value(obs_stat = obs_diff, direction = "two_sided")
```

```
## Warning: Please be cautious in reporting a p-value of 0. This result is an
## approximation based on the number of `reps` chosen in the `generate()` step. Se
e
## `?get_p_value()` for more information.
```

```
## # A tibble: 1 × 1
## p_value
## <dbl>
## 1 0
```

This the standard workflow for performing hypothesis tests.

#### Exercise 7 Construct and record a confidence interval

- · for the difference between the weights of
  - · those who exercise at least three times a week
  - o and those who don't,
- · and interpret this interval in context of the data.

## **More Practice**

#### Exercise 8 Calculate a 95% confidence interval

- for the average height in meters ( height )
- · and interpret it in context.

#### Exercise 9 Calculate a new confidence interval

- for the same parameter at the 90% confidence level.
- · Comment on the width of this interval
  - versus the one obtained in the previous exercise.

#### Exercise 10 Conduct a hypothesis test

- evaluating whether the average height is different
  - o for those who exercise at least three times a week
  - o and those who don't.

#### Exercise 11 Now, a non-inference task:

- · Determine the number of different options there are in the dataset
  - for the hours\_tv\_per\_school\_day there are.

#### Exercise 12 Come up with a research question

- evaluating the relationship between height or weight and sleep.
- Formulate the question in a way that it can be answered
  - using a hypothesis test and/or a confidence interval.
- · Report the statistical results,
  - and also provide an explanation in plain language.
- · Be sure to check all assumptions,
  - state your  $\alpha$  level,
  - o and conclude in context.



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