

Introducing ggplot

Visualizing the distribution  
of one quantitative variable

Describing your distribution  
based on shape, center and  
spread

Time plots

# Lecture 03: Visualizing Data

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# Learning objectives for today:

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Visualizing your data: 1. What kind of visualization for a categorical vs continuous variable 2. Making lovely plots using ggplot in R - Visualization of categorical data: use ggplot's `geom_bar()` - Visualization of continuous data: use ggplot's `geom_histogram()` 3. Describe visualized distributions based on shape, center, spread

# Choosing a visualization

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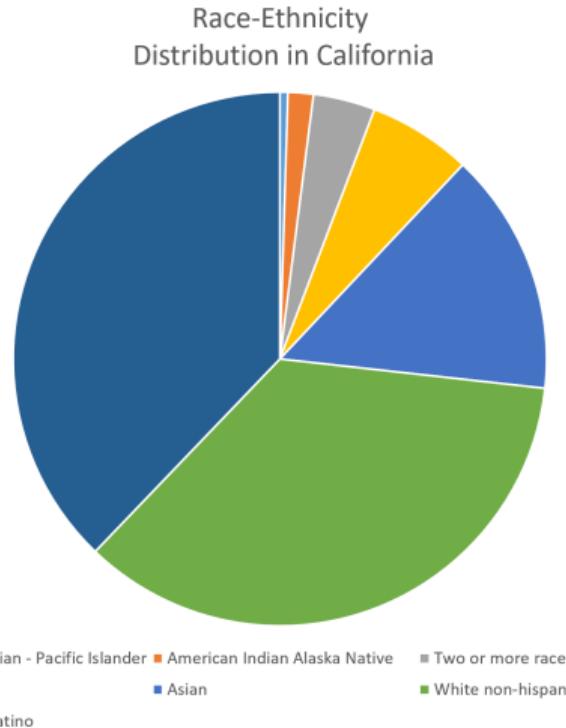
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Let's say I am interested in describing the race-ethnic distribution for the population of California.

What type of a variable is this?

How might I go about visualizing this information?

# Visualization 1: Pie chart



Can you tell which group is the largest in this graph?

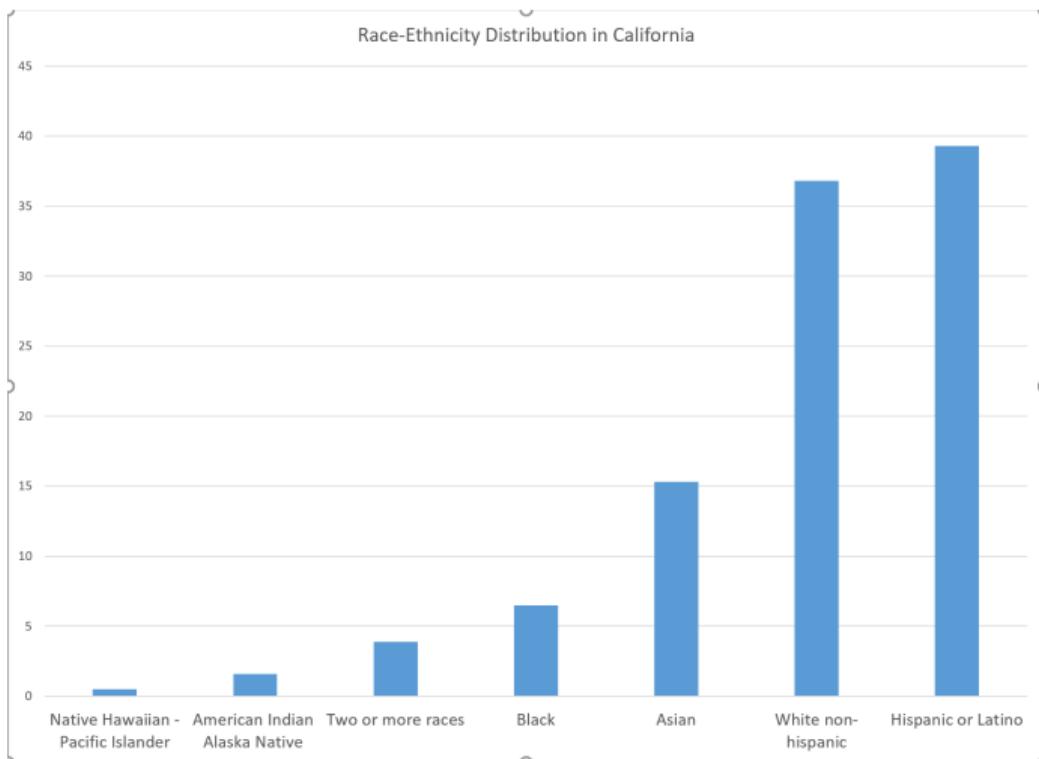
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## Visualization 2: Bar chart



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# Visualization of categorical data

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- ▶ We prefer bar graphs (also called bar charts) for the display of categorical data.
- ▶ Bar charts display the number or percent of data for each level of the categorical variable being plotted

## Example: infectious disease data

- ▶ Task: Make a bar chart of the percent of cases on infectious disease for each category of disease.
- ▶ First, read and view the infectious disease data from Baldi and Moore:

```
id_data <- read_csv("Ch01_ID-data.csv")
```

```
## Rows: 7 Columns: 4
## -- Column specification -----
## Delimiter: ","
## chr (2): disease, type
## dbl (2): number_cases, percent_cases
##
## i Use `spec()` to retrieve the full column specification for this data.
## i Specify the column types or set `show_col_types = FALSE` to quiet this m
```

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## Example: infectious disease data

id\_data

```
## # A tibble: 7 x 4
##   disease           type number_cases percent_cases
##   <chr>            <chr>      <dbl>        <dbl>
## 1 Chlamydia         STI       174557       66.4
## 2 Gonorrhea          STI       44974        17.1
## 3 Pertussis          Pertussis  11219        4.27
## 4 Campylobacteriosis Foodborne  7919        3.01
## 5 Early syphilis    STI       7191        2.74
## 6 Salmonellosis     Foodborne  5361        2.04
## 7 Other              Other      11559       4.40
```

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## Example: infectious disease data

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- ▶ Note the variables `number_cases` and `percent_cases`
- ▶ What do you want the bar chart to display?
- ▶ What are the x and y variables for a bar chart?

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# Introducing ggplot

# First step to building a `ggplot()`: set up the canvas

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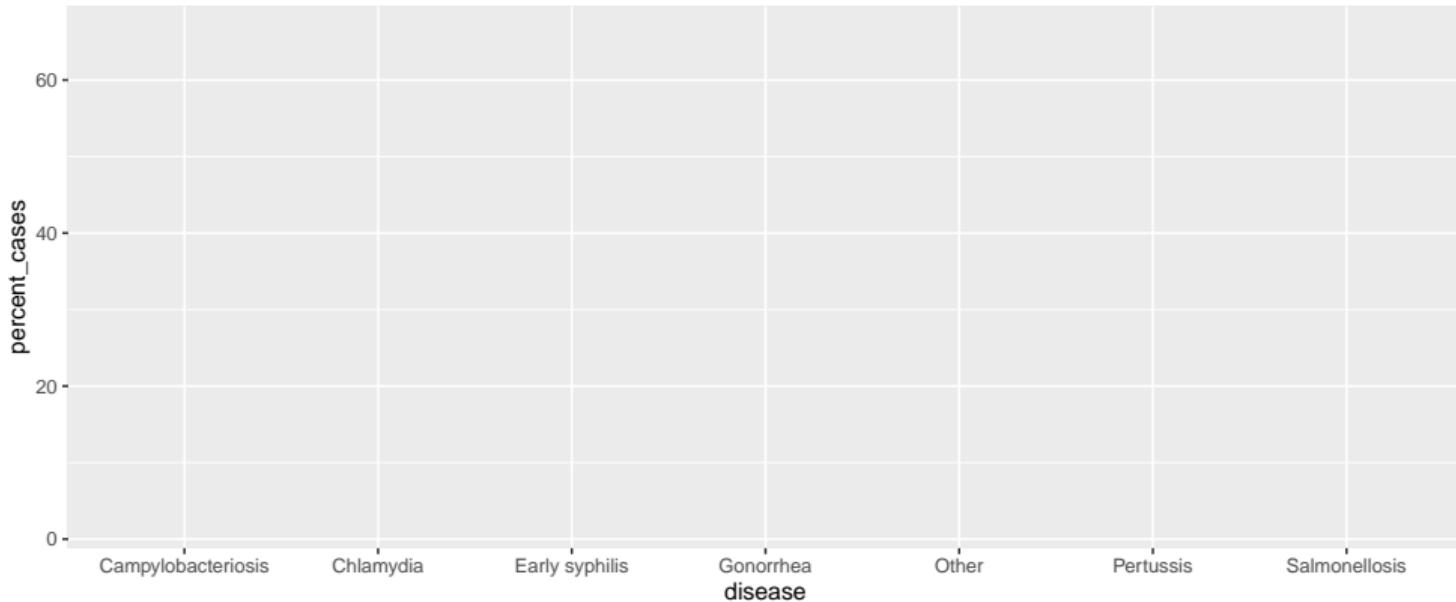
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- ▶ The first line of code below pulls in the `ggplot` package
- ▶ The second line of code below specifies the data set and what goes on the x and y axes

```
library(ggplot2) ggplot(id_data, aes(x = disease, y = percent_cases))
```

# First step to building a ggplot(): set up the canvas



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## Next choose a function

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- ▶ We will use a `geom_` function to create our chart

`ggplot()`'s `geom_bar()` makes a bar chart

# Syntax for bar charts

```
ggplot(id_data, aes(x = disease, y = percent_cases)) +  
  geom_bar(stat = "identity")
```

stat = “identity” tells geom\_bar that we supplied a y variable that is exactly what we want to plot.

We do not need geom\_bar() to calculate the number or percent for us.

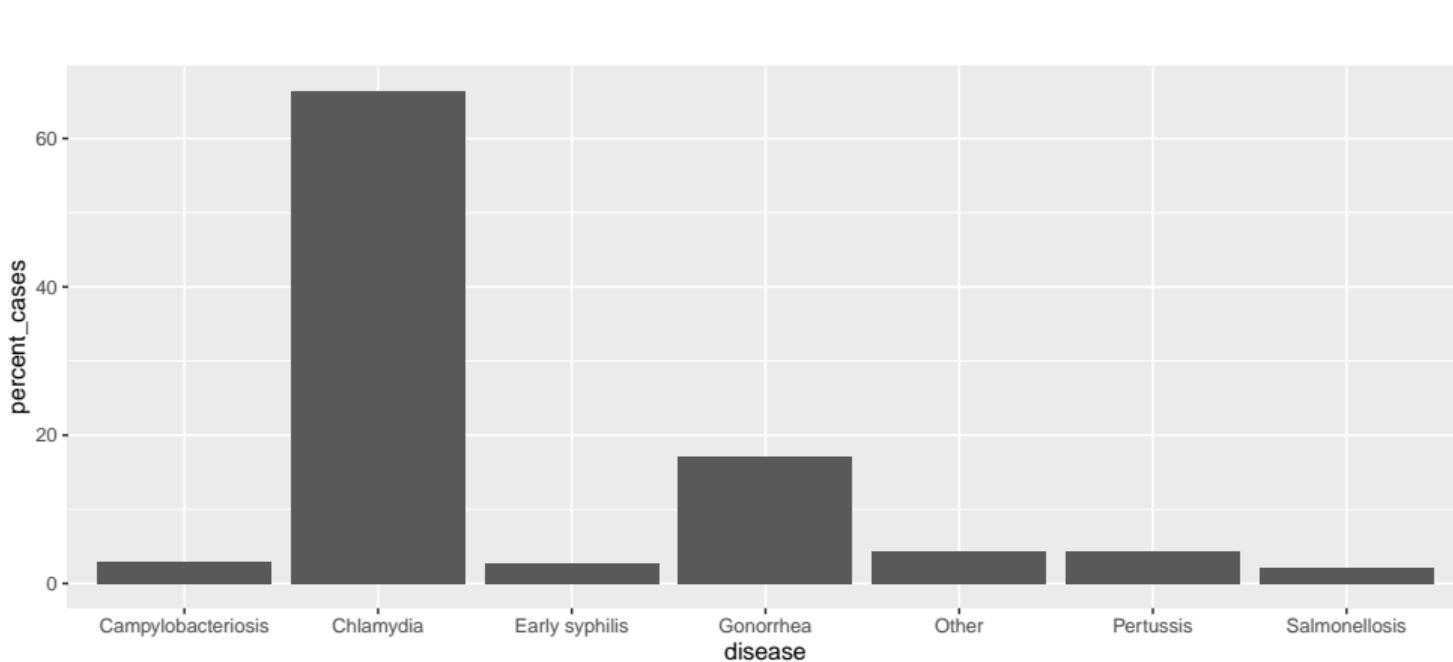
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# ggplot()'s geom\_bar() makes a bar chart



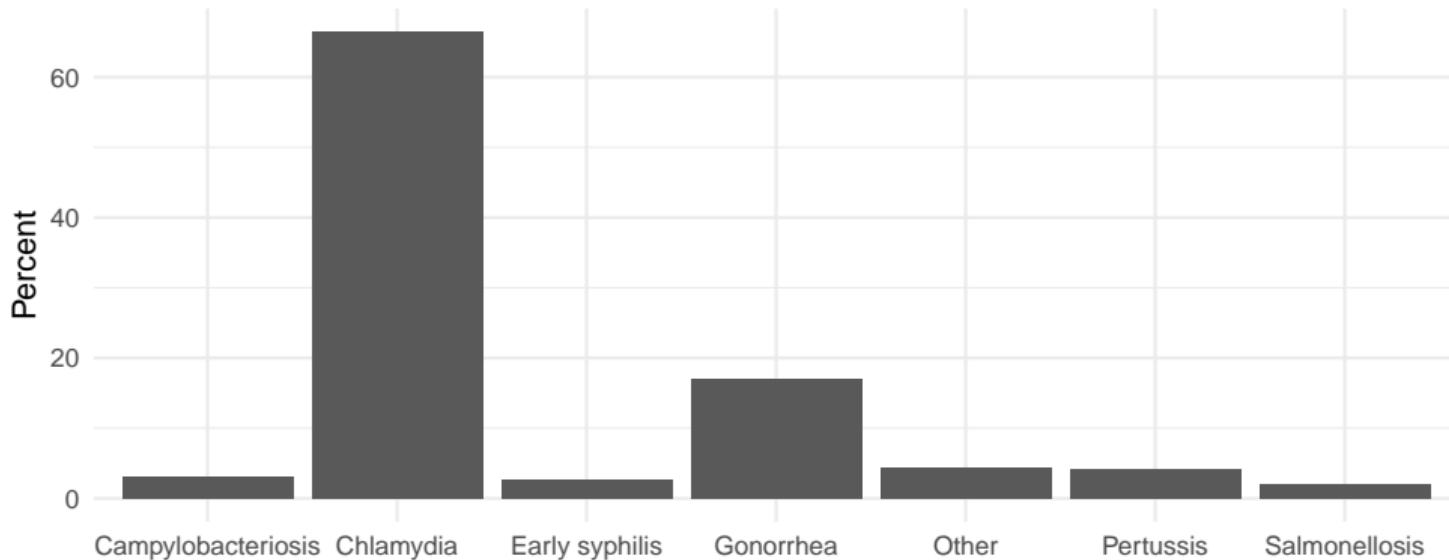
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## some additions to ggplot for style



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base\_size controls the font size on these plots

theme\_minimal affects the “look” of the plot it removes the grey background  
and adds grey gridlines

fct\_reorder reorders disease according to value of percent\_cases

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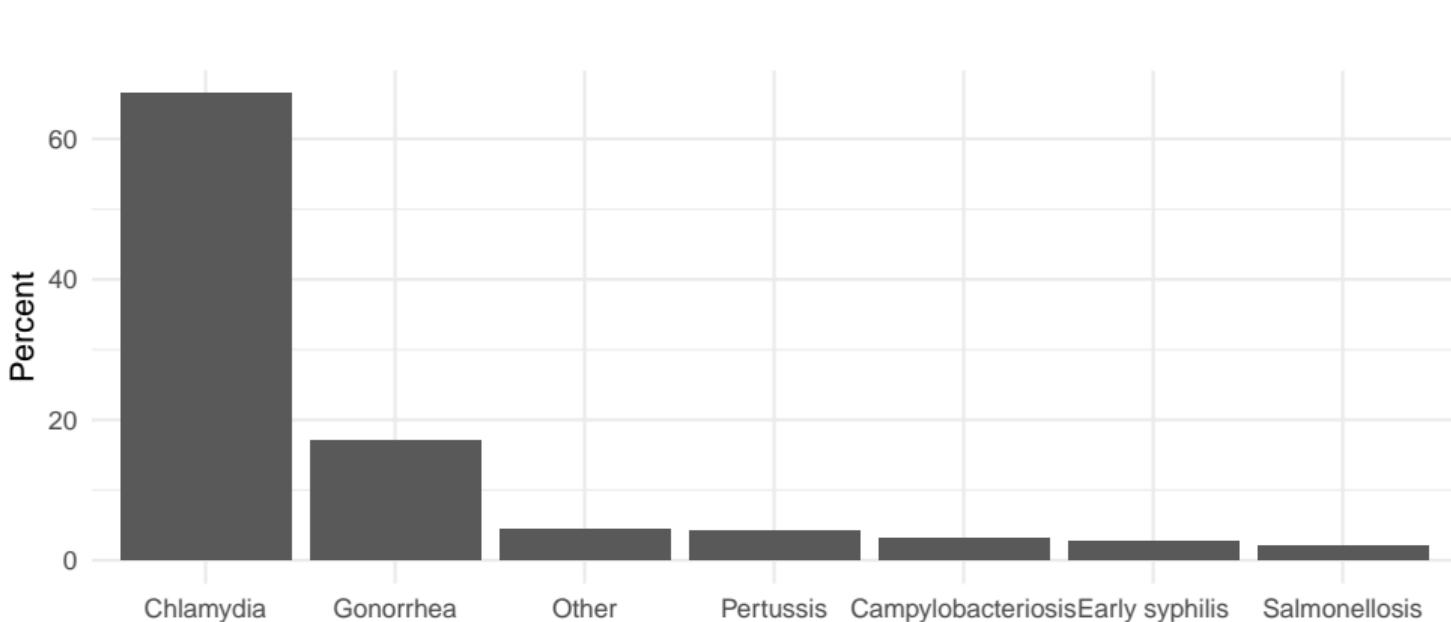
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```
id_data <- id_data %>%  
  mutate(disease_ordered = fct_reorder(disease, percent_cases, .desc = T))
```

# Re-ordered plot



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Use `aes(fill = type)` to link the bar's fill to the disease type

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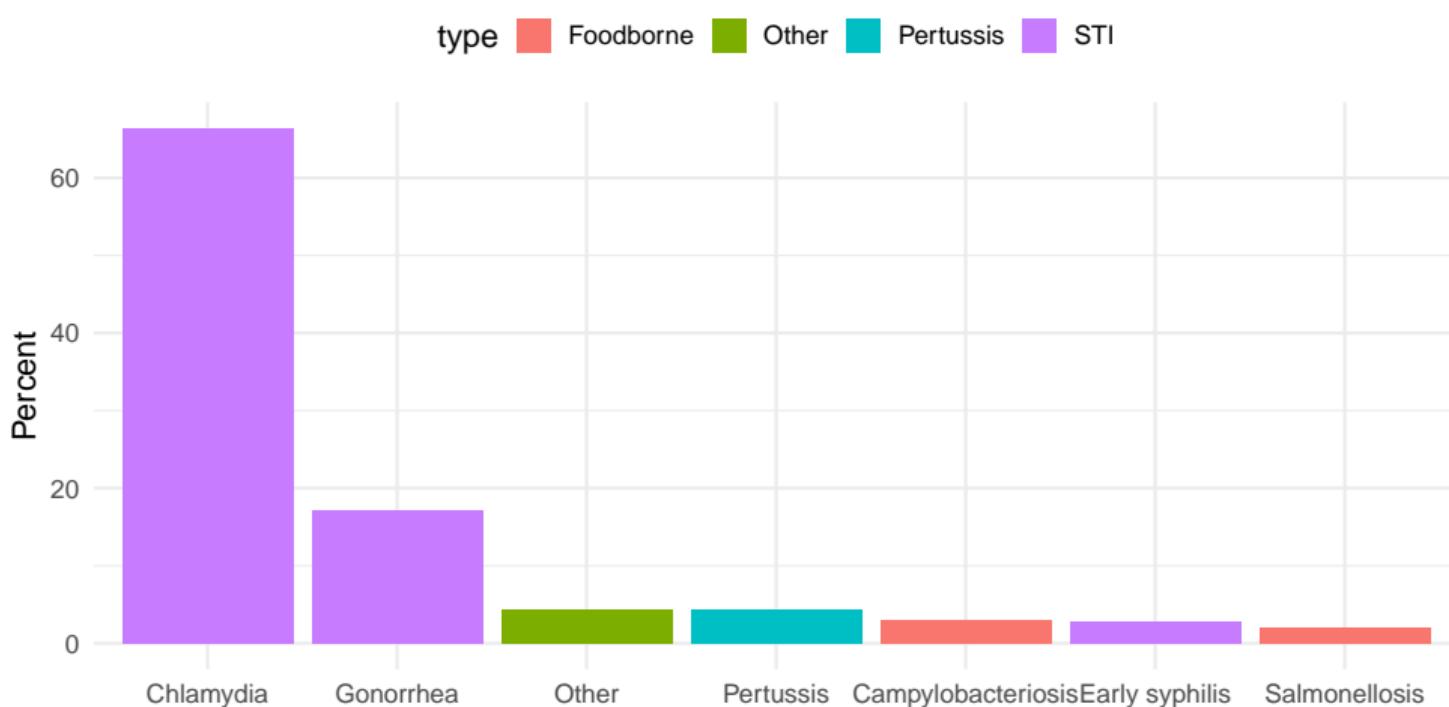
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```
geom_bar(stat = "identity", aes(fill = type)) +  
theme(legend.position = "top")
```

# Use aes(fill = type) to link the bar's fill to the disease type



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## Visualizing the distribution of one quantitative variable

# Visualize quantitative variables using histograms

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- ▶ Histograms look a lot like bar charts, except that the bars touch because the underlying scale is continuous and the order of the bars matters
- ▶ In order to make a histogram, the underlying data needs to be **binned** into categories and the number or percent of data in each category becomes the height of each bar.
- ▶ the **bins** divide the entire range of data into a series of intervals and counts the number of observations in each interval
- ▶ the intervals must be consecutive and non-overlapping and are almost always chosen to be of equal size

## Example: opioid state prescription rates

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- ▶ The textbook gives an example using data from 2012.
- ▶ In the data folder, there is updated data from 2018. It came from the paper: “Opioid Prescribing Rates by Congressional Districts, United States, 2016”, by Rolheiser et al. [link](#)

## Example: opioid state prescription rates

Problem: To determine the extent to which opioid prescribing rates vary across US congressional districts.

Plan: In an observational cross-sectional framework using secondary data, they constructed 2016 congressional district-level opioid prescribing rate estimates using a population-weighted methodology.

Data: In the data structure we have State as the unit of analysis, and measured prescription rates as the variable of interest

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## Example: opioid state prescription rates

```
opi_data <- read.csv("Ch01_opioid-data.csv")
head(opi_data)
```

##	Rank	State	Mean	Median	SD	Min	Max	Num_Districts
## 1	1	AL	121.31	113.09	21.87	105.58	166.69	7
## 2	2	AR	115.22	115.13	8.59	104.80	125.79	4
## 3	3	TN	108.12	108.26	19.16	73.60	133.00	9
## 4	4	MS	105.64	106.25	17.36	83.90	126.14	4
## 5	5	LA	98.38	98.88	10.34	83.22	112.65	6
## 6	6	KY	98.13	85.76	26.72	77.62	147.00	6

- ▶ Mean provides the mean prescribing rate per 100 individuals. Thus, a mean of 121.31 implies that in Alabama, there were 121.31 opioid prescriptions per 100 persons, an average across the 7 congressional districts.

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# Histogram of opioid prescription rates

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- ▶ Task: Make a histogram of the average prescribing rates across US states
- ▶ What is the x variable? What is the y variable?
- ▶ What geom should be used?

# Histogram of opioid prescription rates - default is 30 bins

```
ggplot(data = opi_data, aes(x = Mean)) +  
  geom_histogram(col = "white") +  
  labs(x = "Mean opioid prescription rate (per 100 individuals)",  
       y = "Number of states") +  
  theme_minimal(base_size = 15)
```

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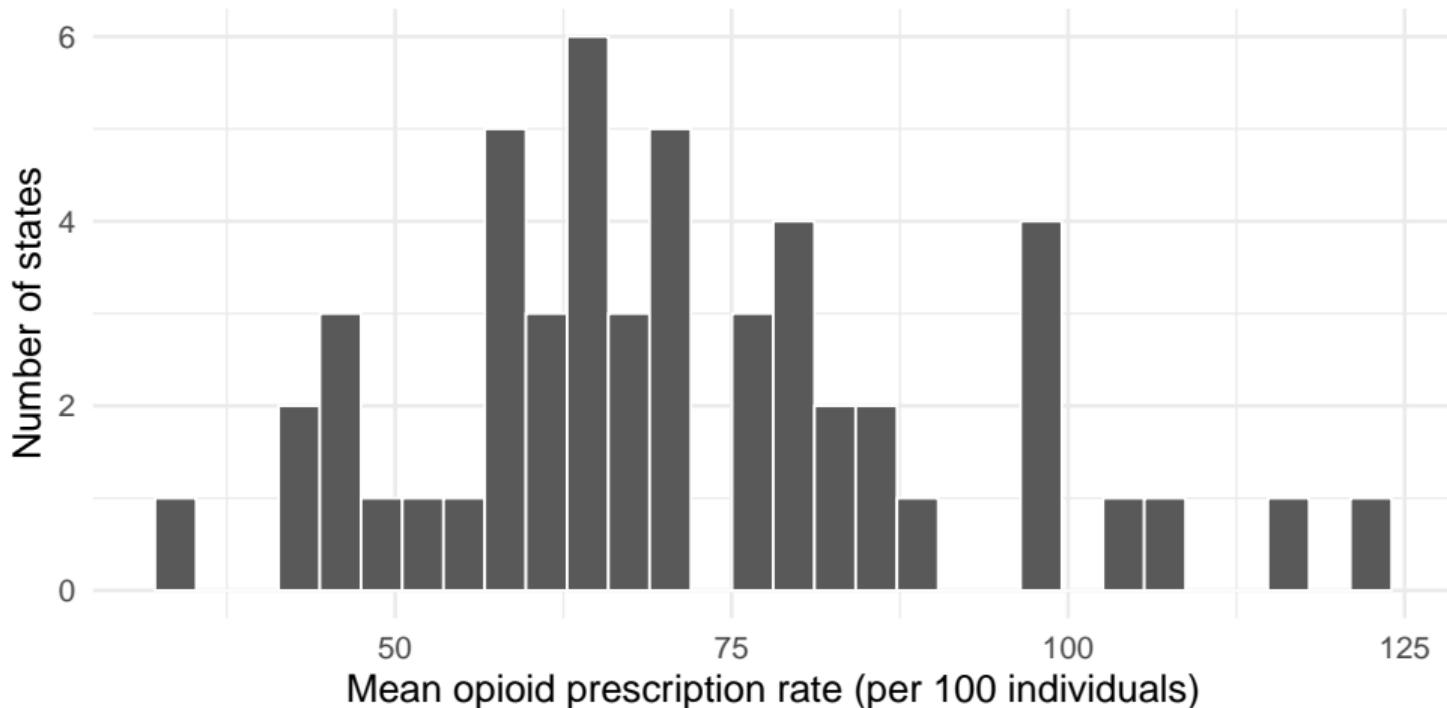
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# Histogram of opioid prescription rates

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



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same graph, change the bins `geom_histogram(binwidth = 5)`

```
ggplot(data = opi_data, aes(x = Mean)) +  
  geom_histogram(col = "white", binwidth = 5) +  
  labs(x = "Mean opioid prescription rate (per 100 individuals)",  
       y = "Number of states") +  
  theme_minimal(base_size = 15)
```

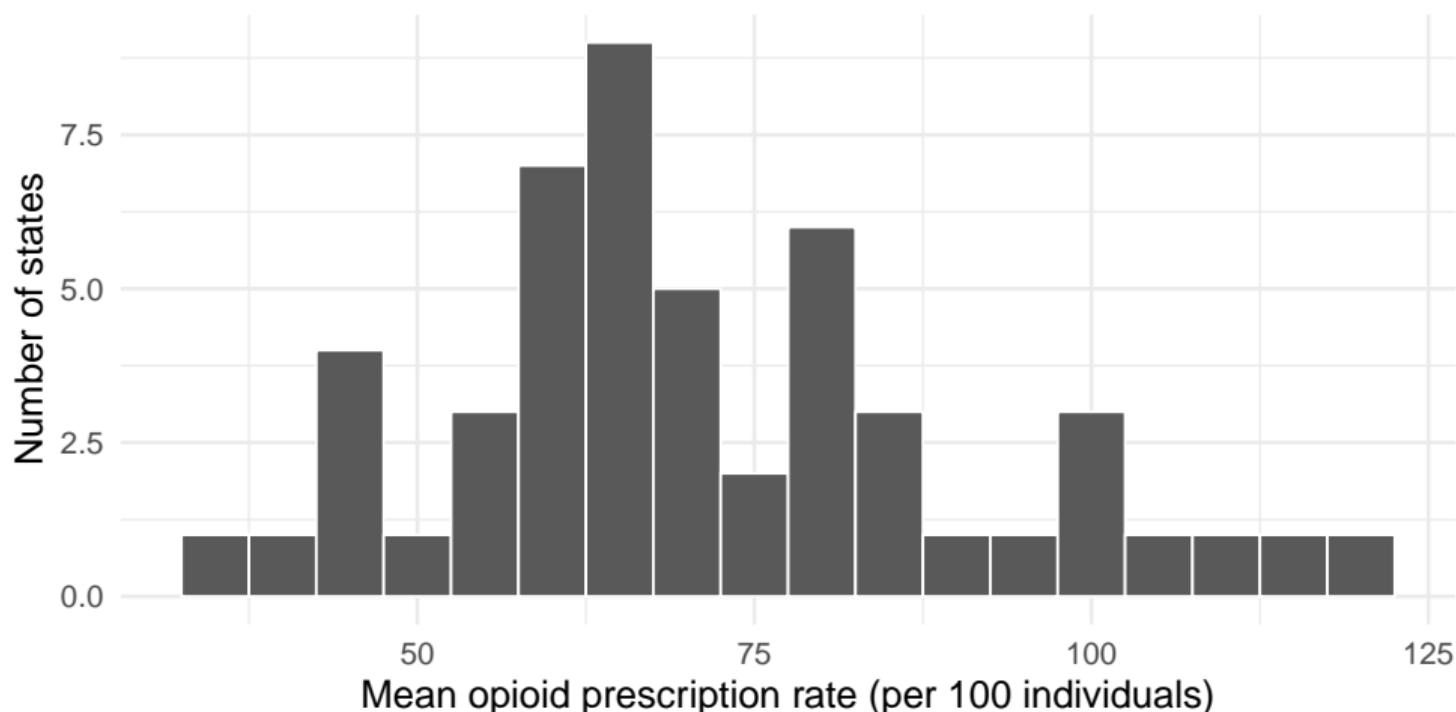
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same graph, change the bins `geom_histogram(binwidth = 5)`



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change the bins again `geom_histogram(binwidth = 10)`

```
ggplot(data = opi_data, aes(x = Mean)) +  
  geom_histogram(col = "white", binwidth = 10) +  
  labs(x = "Mean opioid prescription rate (per 100 individuals)",  
       y = "Number of states") +  
  theme_minimal(base_size = 15)
```

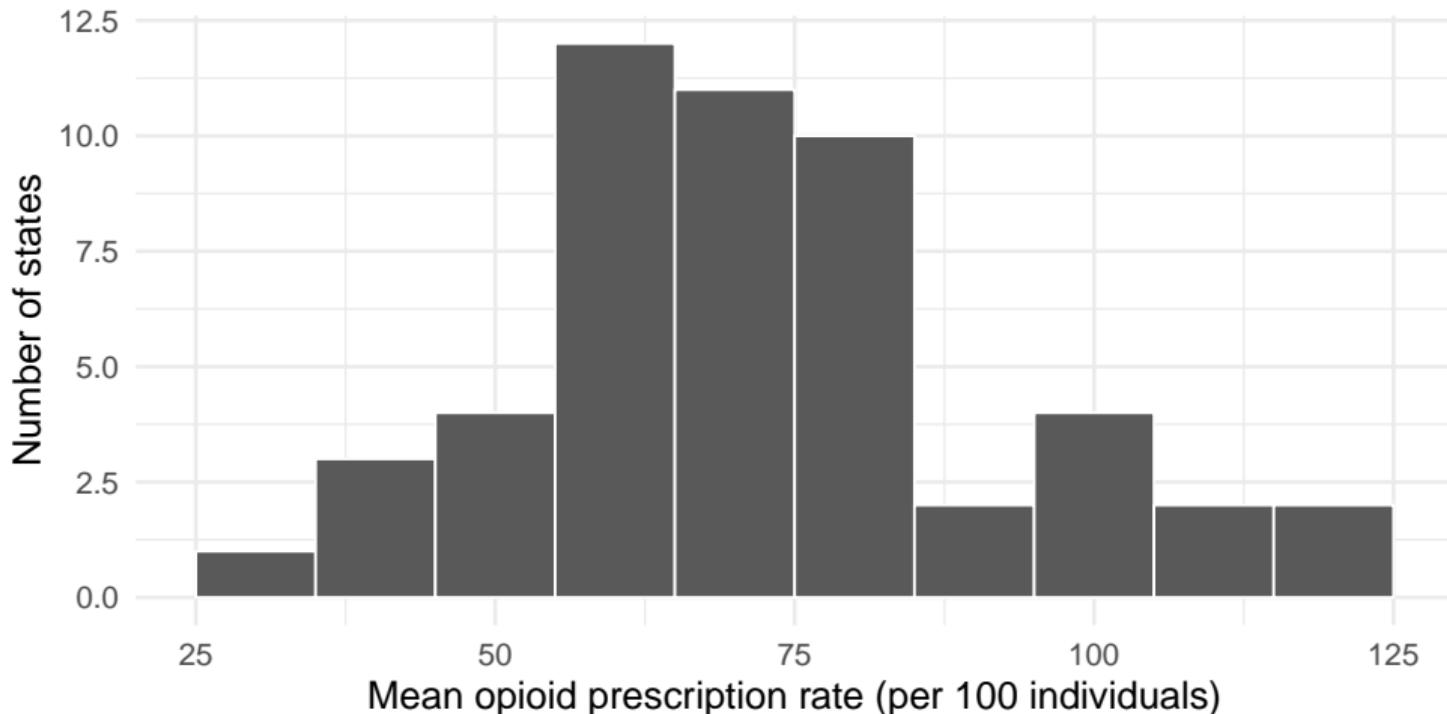
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change the bins again `geom_histogram(binwidth = 10)`



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## Describing your distribution based on shape, center and spread

# Shape, Center, Spread

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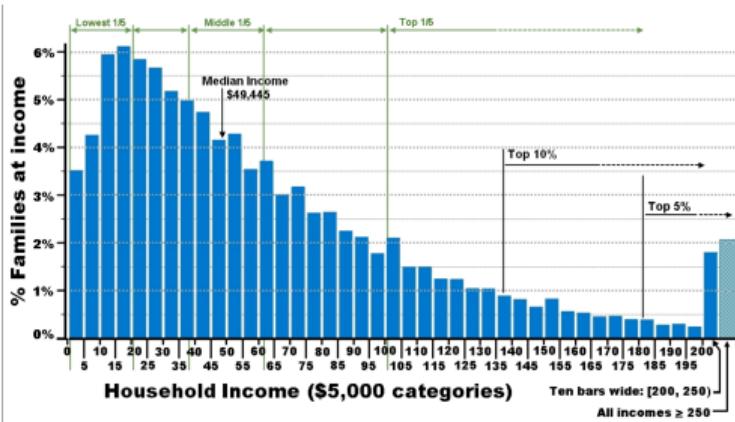
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- ▶ When we examine histograms, we can make comments on a distribution's:
  - ▶ Shape: Is the distribution **symmetric** or **skewed** to the left or right?
  - ▶ Center: Does the histogram have one peak (**unimodal**), or two (**bimodal**) or more?
  - ▶ Spread: How spread out are the values? What is the range of the data?
  - ▶ Outliers: Do any of the measurements fall outside of the range of most of the data points?

# Is this skewed left or skewed right?



Data source: [http://www.census.gov/hhes/www/cpstables/032011/hhinc/new06\\_000.htm](http://www.census.gov/hhes/www/cpstables/032011/hhinc/new06_000.htm)

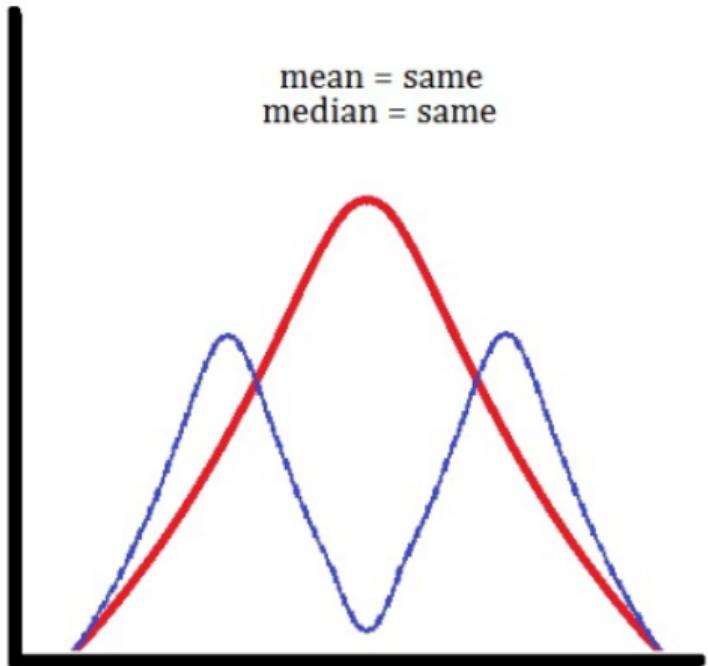
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# Center - one hump or two?



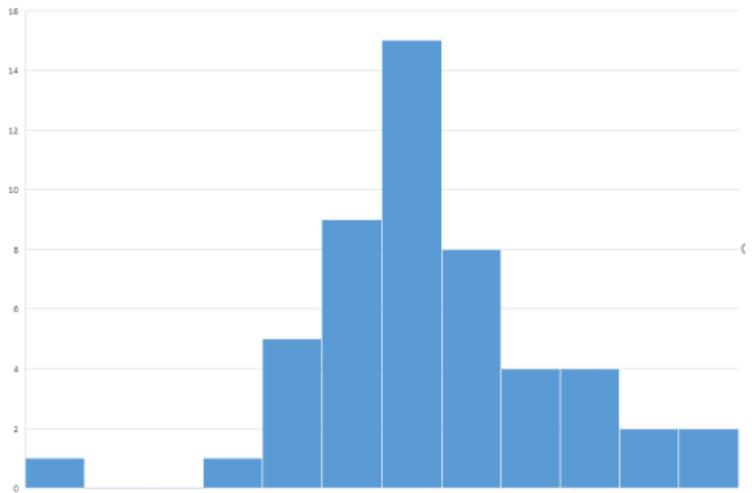
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# Outlier



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## Time plots

# Visualize quantitative variables over time using time plots

- ▶ Time plots are a specific subset of plots where the x variable is time.
- ▶ Unlike the previous plots, the time plot shows a relationship between two variables:
  - i) a quantitative variable
  - ii) time
- ▶ Often times, these plots can be used to look for cycles (e.g., seasonal patterns that recur each year) or trends (e.g., overall increases or decreases seen over time).

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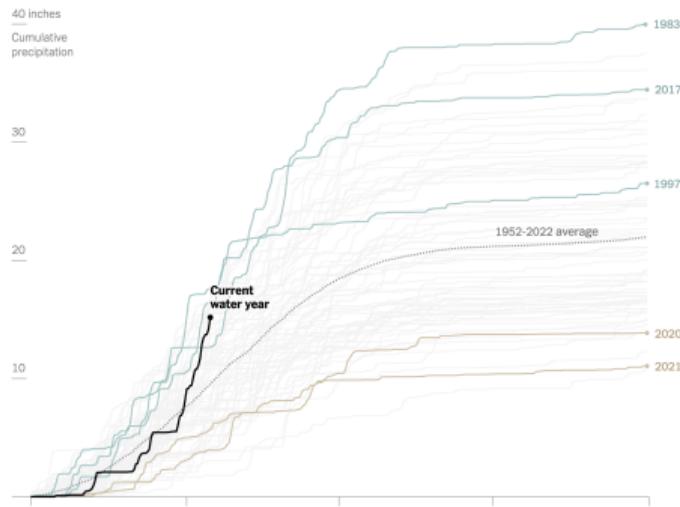
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# Time plot

- ▶ from nytimes.com 19 Jan 2023 article:

## California's Storms in Context

Cumulative rainfall across the state is above average so far this winter, but other years have been even wetter.



Note: The California water year starts in October, aligning with the typical beginning of the rainy season. Current water year data as of Jan. 15, 2023. • Source: NOAA NClimGrid • By Mira Rojanasukul

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# Life expectancy for White men in California

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Make a scatter plot of the life expectancy for White men in California over time.

Since the dataset contains 39 states across two genders and two races, first use a function to subset the data to contain only White men in California.

Which function from last lecture do we need?

- ▶ `mutate()`, `select()`, `filter()`, `rename()`, or `arrange()`?

## dplyr's filter() to select a subset of rows

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```
wm_cali <- le_data %>% filter(state == "California",  
                                sex == "Male",  
                                race == "white")
```

*#this is equivalent:*

```
wm_cali <- le_data %>% filter(state == "California" & sex == "Male" & race ==
```

# Here we use geom\_point to make a graph with dots

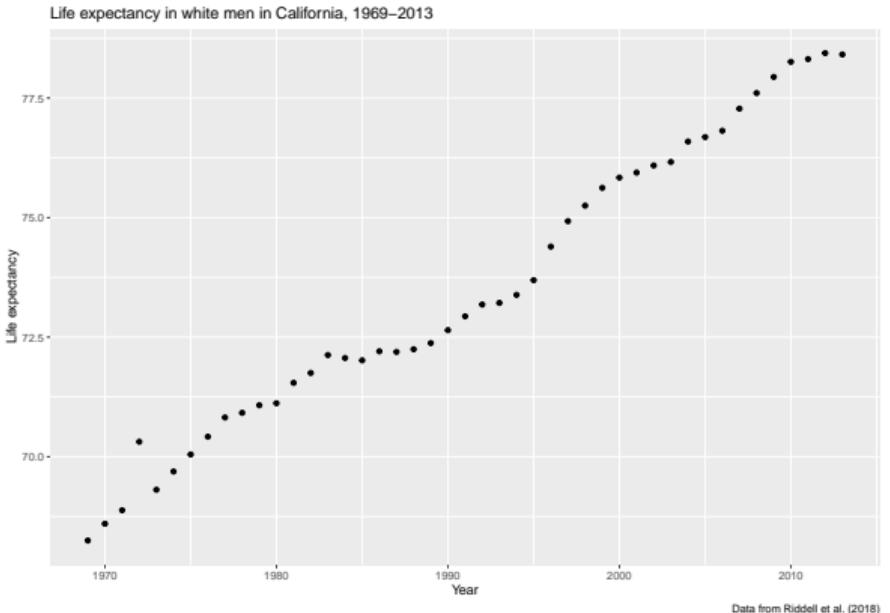
```
ggplot(data = wm_cali, aes(x = year, y = LE)) +  
  geom_point() +  
  labs(title = "Life expectancy in white men in California, 1969-2013",  
       y = "Life expectancy",  
       x = "Year",  
       caption = "Data from Riddell et al. (2018)")
```

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# Here we use geom\_point to make a graph with dots



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## geom\_line() to make a line plot

```
ggplot(data = wm_cali, aes(x = year, y = LE)) +  
  geom_line(col = "blue") +  
  labs(title = "Life expectancy in white males in California, 1969-2013",  
       y = "Life expectancy",  
       x = "Year",  
       caption = "Data from Riddell et al. (2018)")
```

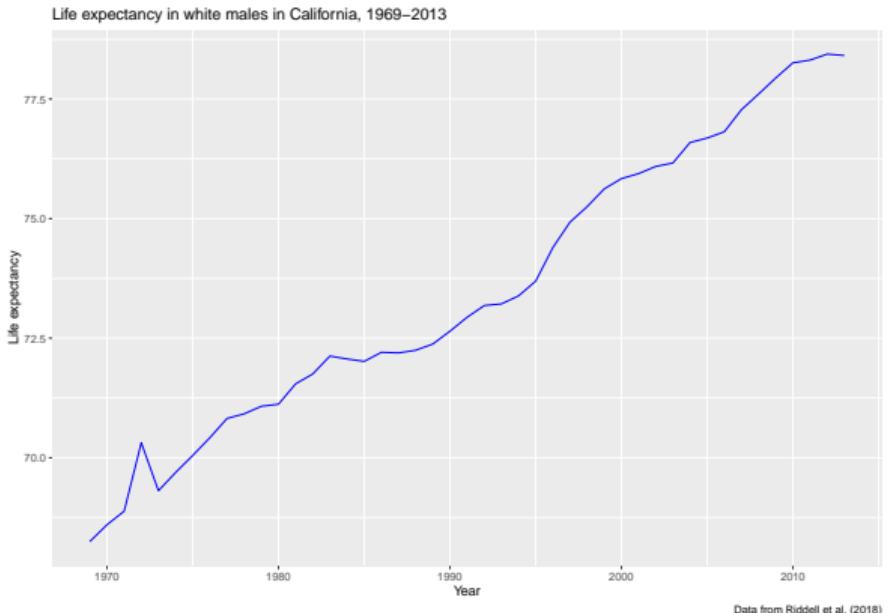
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# geom\_line() to make a line plot



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# R Recap: new code?

1. 'ggplot' to set up a canvas for graphics
2. `geom_bar(stat = "identity")` to make a bar chart when you specify the y variable
3. `geom_histogram()` to make a histogram for which ggplot needs to calculate the count
4. `fct_reorder(var1, var2)` to reorder a categorical variable (`var1`) by a numeric variable (`var2`)
  - ▶ from the `forcats` package
5. `geom_point()` to make a plot with dots
6. `geom_line()` to make a plot with lines

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# How to get help with code

- ▶ Ask questions during labs, GSI office hours, or on Piazza discussion forum.  
Use the appropriate thread!
- ▶ Develop your online search skills. For example if you have a `ggplot2` question, begin your google search with “r `ggplot`” and then describe your issues, e.g., “r `ggplot` how do I make separate lines by a second variable”.
- ▶ The most common links that will appear are:
  - ▶ <https://stackoverflow.com>: Crowd-sourced answers that have been upvoted. The top answer is often the best one.
  - ▶ <https://ggplot2.tidyverse.org/>: The official `ggplot2` webpage is very helpful.
  - ▶ <https://community.rstudio.com/>: The RStudio community page.
  - ▶ <https://rpubs.com/>: Web pages made by R users that often contain helpful tutorials.

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# We only skimmed the surface!

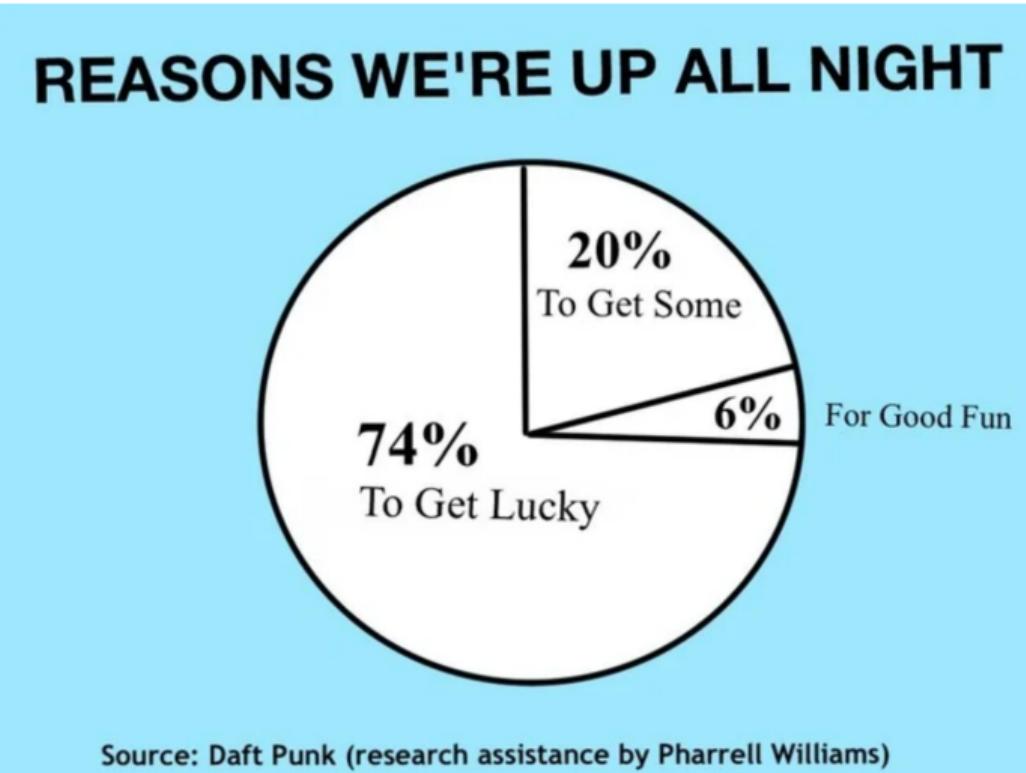
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- ▶ Here is some extra material for those of you who love data visualization.  
This material won't be tested.
  - ▶ RStudio ggplot2 cheatsheet
  - ▶ Kieran Healy's data visualization book



- ▶ from [Eric Tanoye Song Lyrics in Chart Form](#)

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