Today's topics:

- Data graphics (2)
- Experiment design

Background preparation:

 Kaplan (2016), Appendix, "Statistics brief reference", especially sections A.1.2 and A.3

0. Today's objectives

After today's class, you should be able to:

- Explain how probability (*p*-value) is used to evaluate statistical significance
- (Review) Identify the null hypothesis for a particular statistical test
- Recognize common types of data graphic and know when they are appropriate to use
- Discuss factors that are important to consider when designing or evaluating an experiment

1. Inferential statistics and probability

- Finish slides from last time
- See also today's PQ #2

- Commonly encountered data graphics
 - bar graph or line graph
 - histogram
 - scatterplot

(see examples of each type in Kaplan, sec A.1.2)

Bar graph / line graph

 What kinds of information are these good at showing?

Bar graph / line graph

 A good way to compare values (numerical) for two or more groups across two or more categories

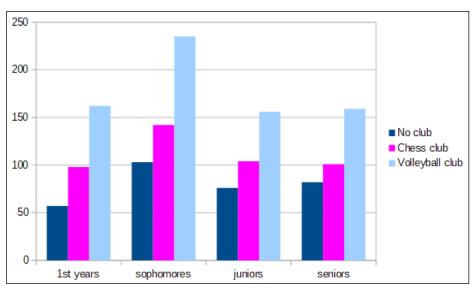
Bar graph / line graph

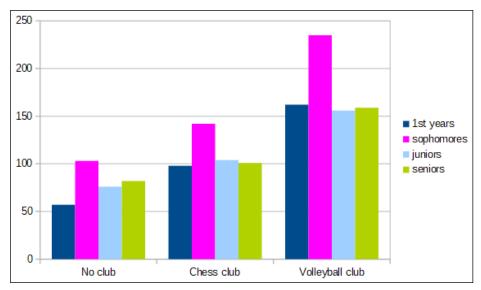
- How do we set one up? try it in your group
- Pizza consumption (invented data)
 Average number of slices per student per semester

| | No club | Chess club | Volleyball club |
|------------|---------|------------|-----------------|
| 1st years | 57 | 98 | 162 |
| sophomores | 103 | 142 | 235 |
| juniors | 76 | 104 | 156 |
| seniors | 82 | 101 | 159 |

Bar graph / line graph

How do we set one up? — Bar graph

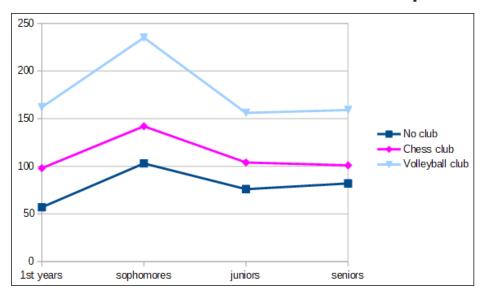




Which comparisons are easier in each graphic?
 What "research question" is each better for?

Bar graph / line graph

How do we set one up? — Line graph





Which comparisons are easier in each graphic?
 What "research question" is each better for?

Note: Some researchers do not use connecting lines between points representing *categories* (because there are no intermediate values)

Histogram

 What kinds of information are these good at showing?

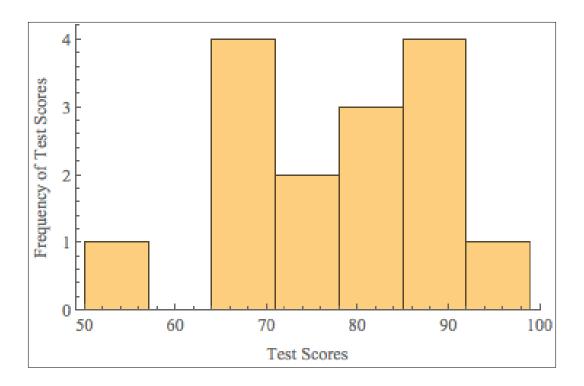
Histogram

- One way to see how the values in your data set are distributed over **subdivisions** of the range of values
 - Which values are frequent? Rare?
 - Are there two distinct groups of values in your data set (bimodal distribution)?
- How do we set one up?

Test scores for a geometry class:

53, 67, 69, 70, 74, 75, 79, 83, 84, 88, 88, 90, 91, 97

Histogram



 Is this how you would have done a histogram for these test scores?
 (What is a crucial decision for histograms?)

Scatterplot

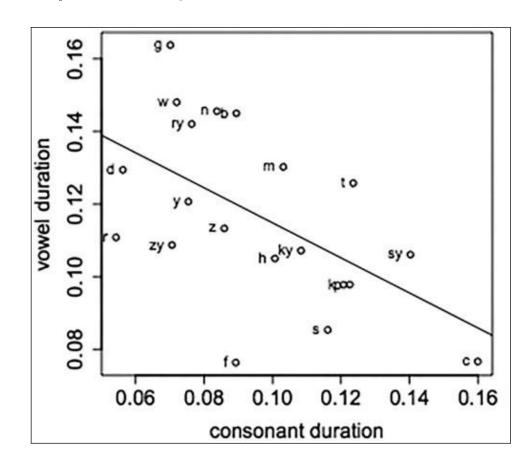
 What kinds of information are these good at showing?

Scatterplot

- Useful when predictor and outcome are both continuous
 - versus when predictor has a small number of categories
- Which axis to use for each variable? Usually:
 - Independent / predictor variable: x-axis
 - Dependent / outcome variable: *y*-axis

Scatterplot

| Example from Kawahara (2017)



Are the x- and y-axis values correlated?

- The *Economist* (UK-based news magazine) generally has good data graphics
- Here's a blog post discussing some that could have been done better and why!
 https://medium.economist.com/mistakes-weve-drawn-a-few-8cdd8a42d368

We discussed this briefly last time:

What are some **reasons** to use data graphics?

What are some **reasons** to use data graphics?

- Communication: making your results easy for your audience to see and understand
 - Be clear on what point you most want to communicate about your data, and choose a type of data graphic that highlights that point

What are some **reasons** to use data graphics?

- Analysis check: Making sure you know what your data set is actually like
 - Before you start any inferential statistical analysis — look to see if there is anything going on in the data that you should take into account or be careful about
 - Remember the Harry Potter movies bar graph from last time!

 What are some of the factors that Kaplan identifies that help us evaluate whether a study is welldesigned or has trustworthy results?

The topics in her discussion:

- Subject selection
- Task design
- Data analysis
- Publication bias and replication

Participants

- Are they representative of the groups of people we want to know about?
- Many study participants in linguistics or psychology are university undergraduates...
 - WEIRD! = from <u>Western</u>, <u>educated</u>,
 <u>i</u>ndustrialized, <u>rich</u>, and <u>democratic societies
 (Henrich et al. 2010)
 </u>
 - typically aged 18-24 or so

Henrich, J., Heine, S., & Norenzayan, A. (2010). The weirdest people in the world? *Behavioral and Brain Sciences* 33(2-3): 61-83.

Task design (see PQ #1)

- Is the experimental task really similar to what we want to study?
 - Is it likely to affect different groups of participants differently?
 - Does observing participants change the data?
- What potential confounding factors can we identify?
 - Can we reduce or eliminate them, or at least include them explicitly in our analysis?

Data analysis

- How is the data to be coded? Is the coding protocol explicit? Is it reliable across coders? (Can we avoid coder bias?)
- Should outliers be excluded from analysis? If so, how can they be safely (objectively) identified?
- Appropriateness of statistical analysis: the right test; not too many tests ('fishing')

Problems in replication and underreporting of null results

- More exciting to publish a non-null result than a null result
- More exciting to publish a new study than a replication
- So it might be the case that various effects are not as robust as the literature makes it seem

4. Summary and upshot

Statistics

- A little background in statistics can help us get a sense of what the results section in a research paper is saying
- Inferential statistics can help us understand whether an (apparent) numerical difference is meaningful

4. Summary and upshot

Data graphics

Useful for communication and for checking your analysis

Experiment design

- It is difficult to design a good experiment
- When reading a research article, keep an eye out for some of these pitfalls