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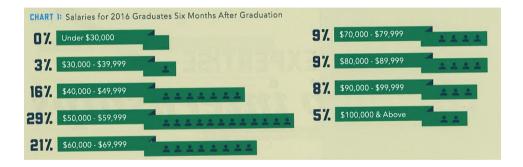
#### R Tools

# Lecture 1: Welcome to Data Visualization Using R

January 23, 2023

R Tools

#### Take This Class So You Won't Make This Graphic

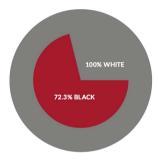


From Trachtenberg's 2018 magazine.

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R Tools

# Or This One, 2 of 3



#### EQUALITY INDEX OF BLACK AMERICA, 2016-2017

	REVISED 2016	2017
EQUALITY INDEX	72.2%	72.3%
Economics	56.2%	56.5%
Health	79.4%	80.0%
Education	77.4%	78.2%
Social Justice	60.9%	57.4%
Civic Engagement	100.6%	100.6%

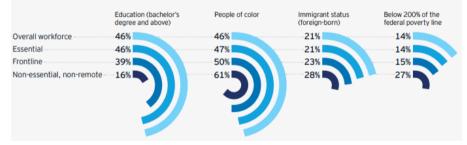
"U.S. Metros Ranked on Black-White Income Inequality," Next City, May 2, 2017

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### Or This One, 3 of 3

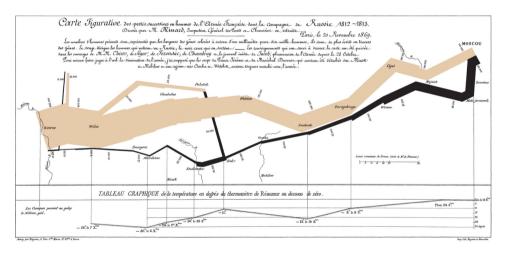
#### Demographic and socioeconomic characteristics of workers by occupation type



Remote Work in the Capital Region, 2021, Greater Washington Partnership.

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#### Instead, Aspire to This



See Tufte for citation.

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# To Create Memories

- Journalists frequently start articles with anecdotes because they are
  - relateable
  - memorable
  - compelling (?)

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R Tools

## To Create Memories

- Journalists frequently start articles with anecdotes because they are
  - relateable
  - memorable
  - compelling (?)
- Raw data is none of these things
- Goal of this course is to create graphics that are
  - compelling
  - clear
  - memorable
  - succinct

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#### **Course Administration**

- 1. Syllabus
  - Policy brief handout
  - Fully composed chart handout
  - Good/bad/ugly assignments handout
- 2. Bring a name tent to class
- 3. Questions/issues with readings?

- 4. Make sure you're signed up for Piazza
- 5. Introductions
  - name and degree
  - why this course?
  - what you do now
  - what you'd like to do when you're done

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Today

- 1. R examples
- 2. Tufte
- 3. Getting started with R
- 4. R tools

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# R Examples

# **R** Examples

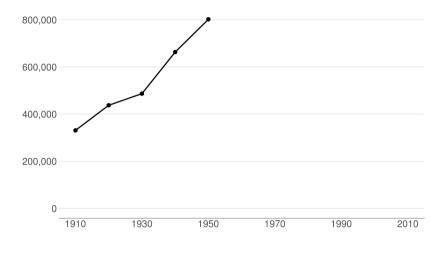
- 1. From a project about the long-run impacts of DC's 1968 civil disturbance
- 2. From a project about whether and why infrastructure costs are increasing
- 3. From a project about working from home in the DC region

R

#### From a Project about the Long-Run Impacts of DC's 1968 Civil Disturbance

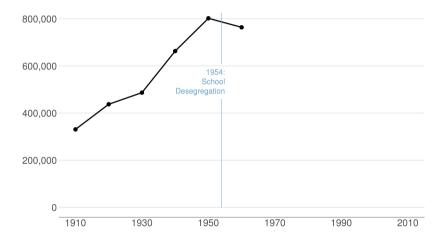


#### DC Gains Population Through 1950

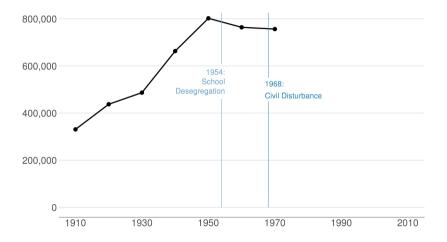


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#### Population Loses Start with Desegregation

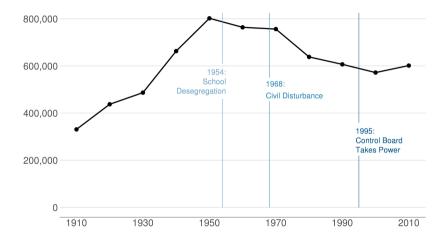


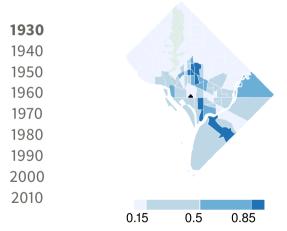
#### Continue After Civil Disturbance

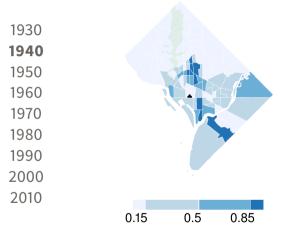


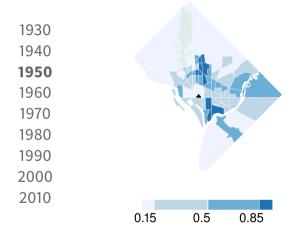
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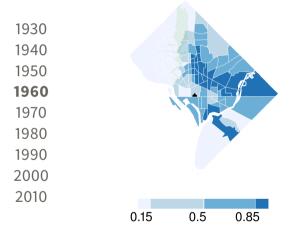
#### Population Turns Up After 2000

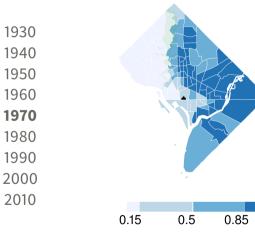


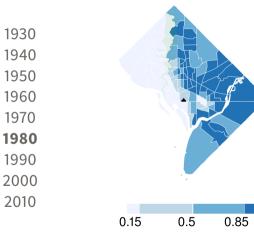




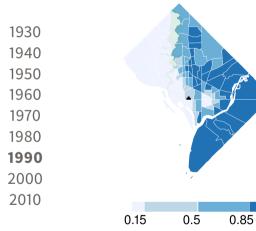




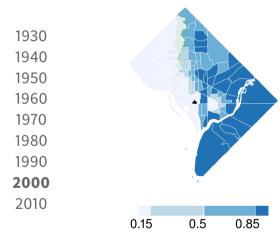




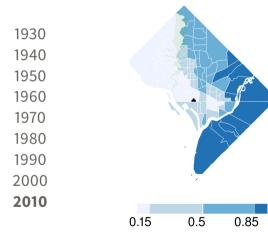
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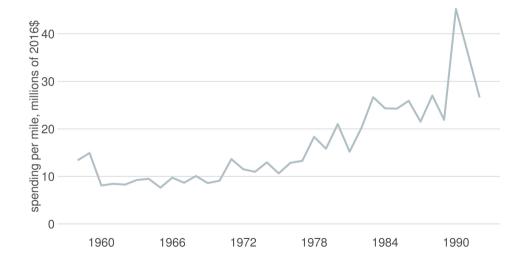
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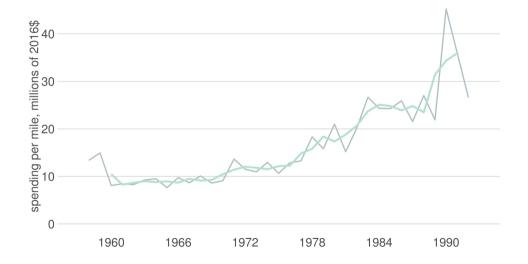
#### From a project about whether and why infrastructure costs are increasing

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# Spending Per Mile has Tripled Since 1960s

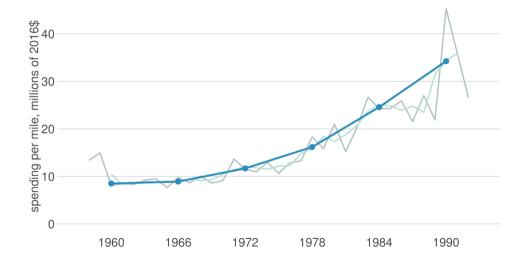


# Spending Per Mile has Tripled Since 1960s

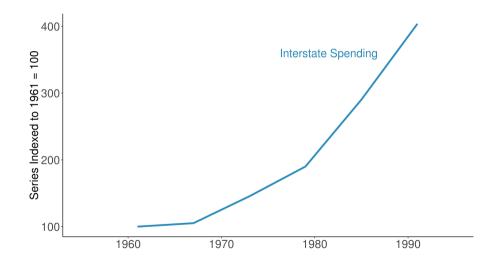


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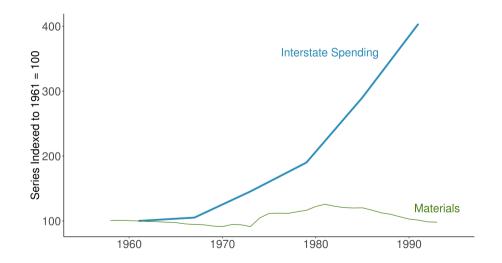
# Spending Per Mile has Tripled Since 1960s



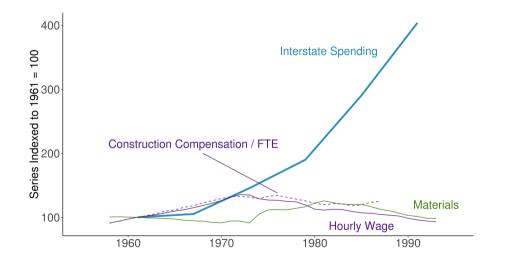
# Interstate Spending Per Mile, Indexed to 100 in 1961



#### Materials Prices are Roughly Flat Over the Period



#### Wages Are Flat, Too $\rightarrow$ Input Prices Cannot Explain Increase



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#### From a project about the likely impacts of Covid on the DC region



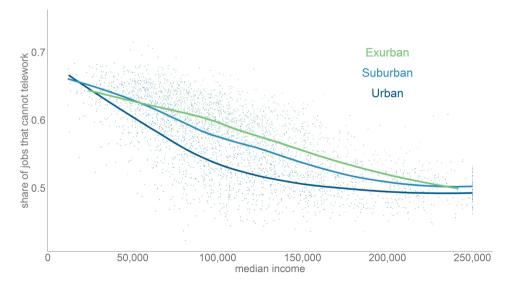
### Capitol Region Strong in Work-from-home Sectors

Share Jobs w/o Telework

#### Prof'nl, Scientific & Tech Services Health Care and Social Assistance Educational Services Accord and Food Services Retail Trade Public Administration Administration/Waste Management Other Services Construction Finance and Insurance Transportation & Warehousing Information Wholesale Trade Manufacturing Real Estate/Rental/Leasing Arts/Entertainment/Recreation Management Utilities Agriculture Mining/Gas 1 00 0.75 0.50 0.25 0.00 0.00 0 10 0.15 0.05

#### Share of All Jobs in Capital Region

#### Wealthier People More Likely to Be Able to Telework



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# Tufte

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Tufte

- 1. Why Tufte?
- 2. Beginnings of graphics
- 3. Why visualizations help

- 4. Tufte's four types of graphs, with examples
- 5. Tufte's problems with graphics
- 6. Rules of graphic integrity

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### Edward Tufte

- A quantitative political scientist
- Writing in the mid-1970s
- Became interested in visualization by working with pioneering statistician John Tukey
- Remember that this is the pre-Excel era, in which data graphics are difficult to make

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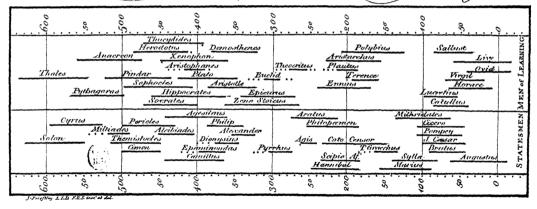
R Tools

### Why Do We Read This?

- Among the first to take the field as a whole seriously
- Greatest popularizer of a now-accepted set of conventions
- Highlights that visualizations only began
  - 1765 with Joseph Priestley
  - 1786 with William Playfair

#### Priestely's Sensation

pecimens of a Chart of Biography.



Joseph Priestley (1733-1804), chart from 1765. [Public domain via Wikipedia] See discussion here.

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### The World's First Bar Chart

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William Playfair (1759-1823), 1786. [Public domain via Wikipedia]

R Tools

# An Argument for Better Visualization

#### Anscombe's quartet

	I	I	I	I	Ш	IV		
х	у	х	у	х	у	х	у	
10.0	8.04	10.0	9.14	10.0	7.46	8.0	6.58	
8.0	6.95	8.0	8.14	8.0	6.77	8.0	5.76	
13.0	7.58	13.0	8.74	13.0	12.74	8.0	7.71	
9.0	8.81	9.0	8.77	9.0	7.11	8.0	8.84	
11.0	8.33	11.0	9.26	11.0	7.81	8.0	8.47	
14.0	9.96	14.0	8.10	14.0	8.84	8.0	7.04	
6.0	7.24	6.0	6.13	6.0	6.08	8.0	5.25	
4.0	4.26	4.0	3.10	4.0	5.39	19.0	12.50	
12.0	10.84	12.0	9.13	12.0	8.15	8.0	5.56	
7.0	4.82	7.0	7.26	7.0	6.42	8.0	7.91	
5.0	5.68	5.0	4.74	5.0	5.73	8.0	6.89	

All series have the same

- mean of X
- variance of X
- mean of Y
- variance of Y
- $\operatorname{corr}(X, Y)$
- *β*

•  $R^2$ 

# An Argument for Better Visualization

#### Anscombe's quartet

	I	I	I	I	III	IV		
х	у	х	у	х	у	х	у	
10.0	8.04	10.0	9.14	10.0	7.46	8.0	6.58	
8.0	6.95	8.0	8.14	8.0	6.77	8.0	5.76	
13.0	7.58	13.0	8.74	13.0	12.74	8.0	7.71	
9.0	8.81	9.0	8.77	9.0	7.11	8.0	8.84	
11.0	8.33	11.0	9.26	11.0	7.81	8.0	8.47	
14.0	9.96	14.0	8.10	14.0	8.84	8.0	7.04	
6.0	7.24	6.0	6.13	6.0	6.08	8.0	5.25	
4.0	4.26	4.0	3.10	4.0	5.39	19.0	12.50	
12.0	10.84	12.0	9.13	12.0	8.15	8.0	5.56	
7.0	4.82	7.0	7.26	7.0	6.42	8.0	7.91	
5.0	5.68	5.0	4.74	5.0	5.73	8.0	6.89	

All series have the same

- mean of X
- variance of X
- mean of Y
- variance of Y
- $\operatorname{corr}(X, Y)$
- β̂

• *R*<sup>2</sup>

Which one is a vertical line?

# An Argument for Better Visualization

#### Anscombe's quartet

	I	I	I	I	Ш	IV		
х	у	х	у	х	у	х	у	
10.0	8.04	10.0	9.14	10.0	7.46	8.0	6.58	
8.0	6.95	8.0	8.14	8.0	6.77	8.0	5.76	
13.0	7.58	13.0	8.74	13.0	12.74	8.0	7.71	
9.0	8.81	9.0	8.77	9.0	7.11	8.0	8.84	
11.0	8.33	11.0	9.26	11.0	7.81	8.0	8.47	
14.0	9.96	14.0	8.10	14.0	8.84	8.0	7.04	
6.0	7.24	6.0	6.13	6.0	6.08	8.0	5.25	
4.0	4.26	4.0	3.10	4.0	5.39	19.0	12.50	
12.0	10.84	12.0	9.13	12.0	8.15	8.0	5.56	
7.0	4.82	7.0	7.26	7.0	6.42	8.0	7.91	
5.0	5.68	5.0	4.74	5.0	5.73	8.0	6.89	

All series have the same

R

- mean of X
- variance of X
- mean of Y
- variance of Y
- corr(*X*, *Y*)
- β̂

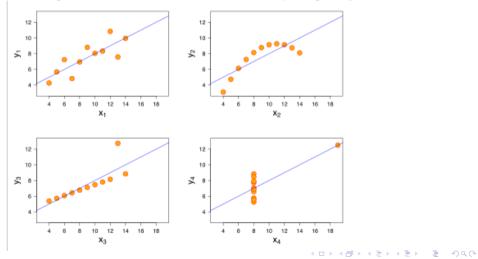
• R<sup>2</sup>

Which one is a vertical line? Which one is an upside-down U?

Thanks for Wikipedia for quartet table.

### An Argument for Better Visualization

Because good visualizations tell the most compelling story



R Ex

R

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### Tufte's Types of Graphs

- 1. Data maps
- 2. Time series
- 3. Space-time narrative designs
- 4. Relational graphs the holy grail

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### Data Maps

- Describe the location of numbers
- This can be revealing or obfuscating
- We will make these in this class
- A product of the mid-1800s

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# John Snow on the Location of Cholera in London, c. 1850



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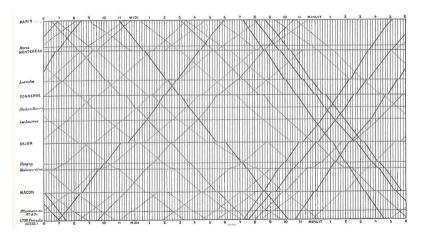
### **Time Series**

- Time on the horizontal axis
- Something else on the vertical axis
- One of the first types of data graphics

R Ex

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# Train, Paris to Lyon



See Tufte for citation.

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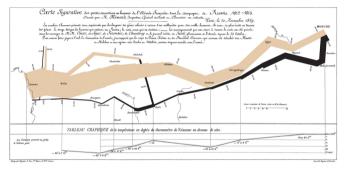
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### Space-Time Narrative Designs

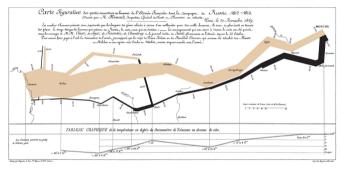
- Move over space and time at the same time
- A time series plus

#### Space-Time Narrative Example



Which dimensions?

#### Space-Time Narrative Example



#### Which dimensions?

- 1. army size
- 2. army location, N/S
- 3. army location, E/W

- 4. direction of movement
- 5. temperature
- 6. by date

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#### **Relational Graphics**

- One variable on the vertical, another on the horizontal
- A conceptual advance in graphics
- A more sophisticated way of thinking

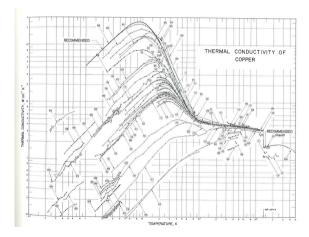
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Tufte

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# Relational Graphics Example



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### Tufte's Main Causes of Distortion in Graphics

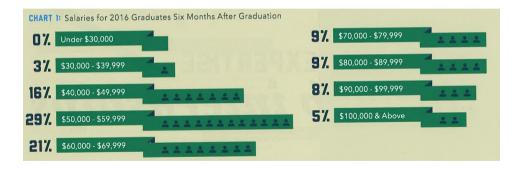
#### 1. Data are bad

- should be per capita and are not
- data are not consistent over time
- don't adjust for inflation
- 2. Graphics are rotten
  - size doesn't match the numbers
  - colors and styles are misleading
  - graphic fails to highlight key point

- 3. Graphics are irrelevant
  - too much extraneous stuff

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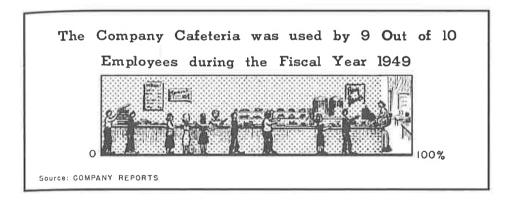
#### Ex. of 2: Size and Number Don't Match



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Ex. of 3: Graphics are Irrelevant



### Tufte's Six Rules of Graphic Integrity, 1 to 3 of 6

- 1. The representation of numbers, as physically measured on the surface of the graphic itself, should be directly proportional to the numerical quantities represented.
- Clear, detailed, and thorough labeling should be used to defeat graphical distortion and ambiguity. Write out explanations of the data on the graphic itself. Label important events in the data.
- 3. Show data variation, not design variation.

R Tool

#### Tufte's Six Rules of Graphic Integrity, 4 to 6

- 4. In time-series displays of money, deflated and standardized units of monetary measurement are nearly always better than nominal units.
- 5. The number of information-carrying (variable) dimensions depicted should not exceed the number of dimensions in the data.
- 6. Graphics must not quote data out of context.

R

# Getting Started with ${\sf R}$

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### What is R?

- A programming language
- Developed by statisticians from New Zealand
- Open source, and therefore free
- Based on "S," developed by Bell Labs

R Ex

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R

# Strengths of R

- Free
- Open-source, so packages by all kinds of users are available
- There are frequently many ways to do the same task
- Very good graphics
- Very flexible
- Can have many datasets in memory at once
- Can analyze large datasets
- Can do maps and spatial analysis
- Big user community and lots of online help

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### Weaknesses of R

- Not always enterprise-ready: packages break and there is no central help
- There are frequently many ways to do the same task
- Syntax can be challenging
- Syntax is inconsistent across packages

RE

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R Tools

### Today's Goals

- Digest info and ask questions to me about R
- When you finish today's tutorial, you will be able to
  - run a R script
  - create a R dataframe
  - do basic operations with a R dataframe
- Please work together! Now and later
- And turn in your own work in your own words

R

# R Tools

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#### Rest of Today's Class

- Download today's tutorial from lectures page
- I'll put you into breakout groups to work together
  - I will check on groups
  - Feel free to return to main room for help as needed
- You'll continue work at home on your own and turn in a problem set next lecture

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#### Next Lecture: Lecture 2

- Turn in work for tutorial 1
- Read Few Chapters 3 and 5
- Look at "Graph Choice Chart"