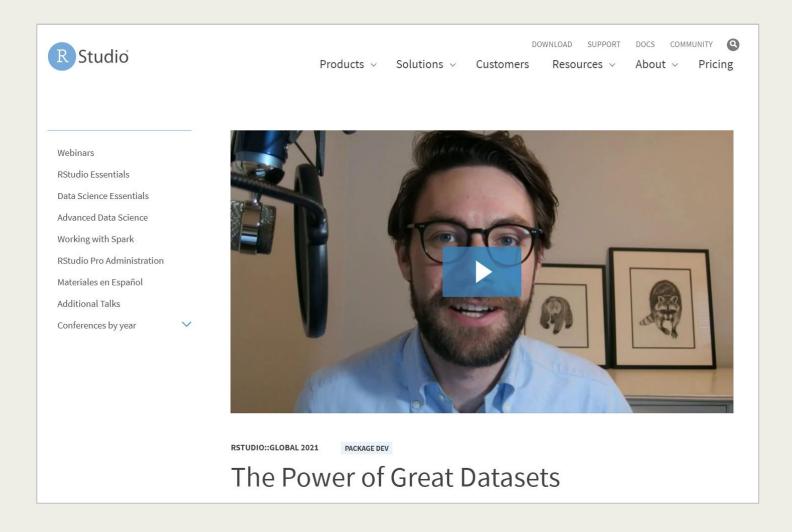
Great Datasets: A Story

Alex Cookson

- **Malexcookson**
- tacookson

Bored? Busy?

 Watch the 5-minute version of this talk



How do love stories usually 90?

Non-binary person meets Girl

Non-binary person meets Boy

Girl meets Boy

Girl meets Girl

Boy meets Girl

Boy meets Boy

Non-binary person meets

Non-binary person

Non-binary Person meets

Non-binary Person meets

Learner meets Data

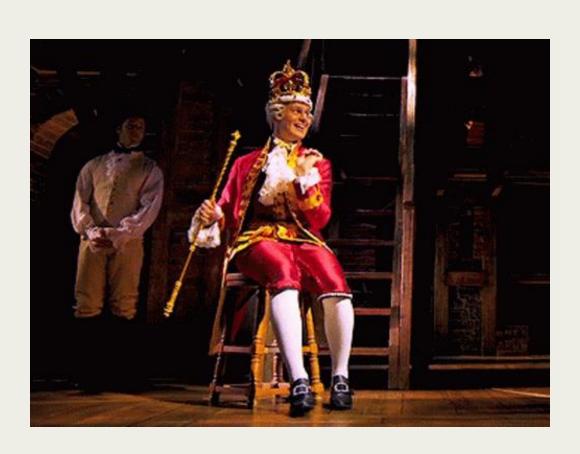
Ever seen a romantic comedy?

The Meeting

Sparks Fly

Tension / Crisis

The Meeting: Hamilton



- · Hamilton tickets for Christmas!
- My brother the Broadway fan
- Weekly grosses: tickets sales, ticket prices, percent of seats sold – all the way back to 1985

Sparks Fly: Weekly Grosses on Playbill



All data provided by The Broadway League

BROADWAY GROSSES WE	EK ENDING					EK'S TOTA ,700,955.	
2020-03-08		~					
SHOW	THIS WEEK GROSS POTENTIAL GROSS	DIFF\$	AVG TICKET TOP TICKET	SEATS SOLD SEATS IN THEATRE	PERFS PREVIEWS	% CAP	DIFF % CAP
HAMILTON RICHARD RODGERS THEATRE	\$2,688,721.00 \$2,605,608.00	-\$7,468.00	\$250.07 \$847.00	10752 1324	8	101.51%	-0.04%
THE LEHMAN TRILOGY NEDERLANDER THEATRE	\$188,126.00 \$171,298.00	\$0.00	\$163.02 \$397.00	1154 1154	0	100.00%	0.00%
MOULIN ROUGE! THE MUSICAL! AL HIRSCHFELD THEATRE	\$1,514,716.50 \$1,754,340.00	-\$56,397.25	\$147.92 \$399.00	10240 1302	8	98.31%	-1.69%
HADESTOWN WALTER KERR THEATRE	\$1,086,477.75 \$1,094,012.00	\$69,803.00	\$147.10 \$0.00	7386 918	8	100.57%	-0.04%
TINA: THE TINA TURNER MUSICAL LUNT-FONTANNE THEATRE	\$1,225,999.00 \$1,566,688.00	-\$94,767.00	\$129.68 \$297.00	9454 1478	8	79.96%	-4.65%
DEAR EVAN HANSEN MUSIC BOX THEATRE	\$981,271.30 \$1,234,034.00	\$15,538.20	\$126.62 \$297.00	7750 984	8	98.45%	1.42%
COMPANY BERNARD B. JACOBS THEATRE	\$779,588.10 \$875,460.00	\$0.00	\$124.16 \$327.00	6279 1030	0	101.60%	0.00%
TO KILL A MOCKINGBIRD SAM S. SHUBERT THEATRE	\$1,237,497.00 \$1,751,250.00	\$105,218.46	\$118.06 \$423.00	10482 1435	8	91.31%	-6.36%
THE BOOK OF MORMON EUGENE O'NEILL THEATRE	\$929,168.30 \$1,190,502.00	\$32,168.80	\$112.67 \$477.50	8247 1047	8	98.46%	3.43%
SIX: THE MUSICAL BROOKS ATKINSON THEATRE	\$884,878.20 \$1,057,206.00	-\$12,006.80	\$108.79 \$297.00	8134 1031	0	98.62%	0.83%

All data provided by The Broadway League

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All data provided by The Broadway League

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2020-03-08		~							
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HADESTOWN WALTER KERR THEATRE	\$1,086,477.75 \$1,094,012.00	\$69,803.00	\$147.10 \$0.00	7386 918	8	(\$850	i4440	(USD) a Pop!	
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All data provided by The Broadway League

BROADWAY GROSSES W	G	WEEK 25 \$5,093,602.0					
1988-11-20		~			\$5,636,632.33		
SHOW	THIS WEEK GROSS POTENTIAL GROSS	DIFF\$	AVG TICKET TOP TICKET	SEATS SOLD SEATS IN THEATRE	PERFS PREVIEWS	% CAP	DIFF % CAP
THE PHANTOM OF THE OPERA MAJESTIC THEATRE	\$536,239.00 \$0.00	-\$2,833.00	\$40.95 \$0.00	13096 1609	8	101.74%	0.00%
LES MISÉRABLES IMPERIAL THEATRE	\$497,755.00 \$0.00	-\$2,873.00	\$40.59 \$0.00	12264 1752	7 0	100.00%	0.00%
CATS WINTER GARDEN THEATRE	\$447,568.00 \$0.00	-\$5,715.00	\$39.16 \$0.00	11430 1482	8	96.41%	0.15%
LEGS DIAMOND MARK HELLINGER THEATRE	\$428,961.00 \$0.00	-\$18,561.00	\$42.94 \$0.00	9989 1603	0	77.89%	9.62%
ME AND OF INCOME.	\$425,317.00 \$0.00	-\$34,279.00	\$38.27 \$0.00	11113 1570	8	88.48%	0.94%
ME AND LOTHE WOODS	\$333,373.00 \$0.00	\$13,843.00	\$40.11 \$0.00	8311 1050	8	98.94%	0.44%
INTO THE WOODS MARTIN BECK THEATRE	\$302,008.00 \$0.00	-\$31,319.00	\$35.76 \$0.00	8445 1282	8	82.34%	-7.89%
M. BUTTERFLY EUGENE O'NEILL THEATRE	\$289,186.00 \$0.00	\$6,765.00	\$33.81 \$0.00	8553 1059	8	100.96%	1.11%
STARLIGHT EXPRESS GERSHWIN THEATRE	\$261,729.00 \$0.00	-\$57,498.00	\$34.08 \$0.00	7680 1803	8	53.24%	-9.76%
AIN'T MISBEHAVIN' AMBASSADOR THEATRE	\$221,248.00 \$0.00	-\$31,191.00	\$33.75 \$0.00	6556 1108	8	73.96%	-8.31%

what was week I was

All data provided by The Broadway League

BROADWAY GROSSES	G WEEK 25			WE \$5,					
SHOW	THIS WEEK GROSS POTENTIAL GROSS	DIFF\$	AVG TICKET TOP TICKET	SEATS SOLD SEATS IN THEATRE	PERFS PREVIEWS	% CAP	DIFF % CAP		
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CATS WINTER GARDEN THEATRE	\$447,568.00 \$0.00	-\$5,715.00	\$39.16 \$0.00	11430 1482	8	0.4	9.15%	.es	M
LEGS DIAMOND MARK HELLINGER THEATRE	\$428,961.00 \$0.00	-\$18,561.00	\$42.94 \$0.00	9989 1603	0 Q	nd	C62%	+41	
ME AND MY GIRL MARQUIS THEATRE	\$425,317.00 \$0.00	-\$34,279.00	\$38.27 \$0.00	11113 1570	8	88.48%	0.94%	' .	
ANYTHING GOES VIVIAN BEAUMONT THEATER	\$333,373.00 \$0.00	\$13,843.00	\$40.11 \$0.00	8311 1050	8	98.94%	0.44%		
INTO THE WOODS MARTIN BECK THEATRE	\$302,008.00 \$0.00	-\$31,319.00	\$35.76 \$0.00	8445 1282	8	82.34%	-7.89%		
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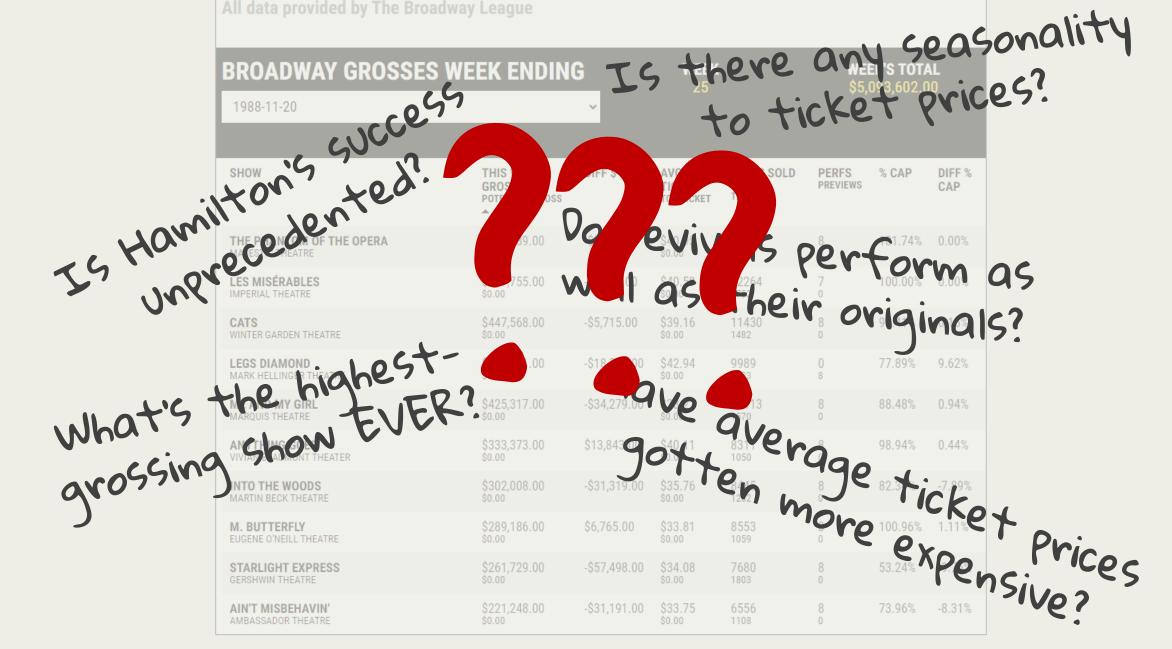
All data provided by The Broadway League

	All data provided by The Broadway	y League						206	mality
	BROADWAY GROSSES WE	EK ENDIN	G TC	, th	919	an	I 'S TOTA	200	-67
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	BROADWAY GROSSES WE 1988-11-20 SHOW THE PONCH OF THE OPERA NA EST HEATRE LES MISÉRABLES IMPERIAL THEATRE	THIS WEEK GROSS POTENTIAL GROSS	DIFF\$	AVG TICKET	SEATS SOLD SEATS IN THEATRE	PERFS PREVIEWS	% CAP	DIFF % CAP	
//	THE PONON OF THE OPERA	\$536,239.00 \$0.00	0833 1	2Viv	als p 12264 Their) 0 0 0 0	131.74%	0.00%	
1	LES MISÉRABLES IMPERIAL THEATRE	\$497,755.00	vell	as	12264	7 0	100.00%	'M	as
	CATS WINTER GARDEN THEATRE	\$447,568.00 \$0.00	-\$5,715.00	\$39.16 \$0.00	11430 1482	OV	191	nal	5?
	LEGS DIAMOND MARK HELLING AT THEAT	\$428,961.00 \$0.00	-\$18,561.00	\$42.94 \$0.00	9989 1603	0 8	77.89%	9.62%	
	MARQUIS THEATRE ANT THUS SEE	\$425,317.00 •\$0.00	-\$34,279.00	Ve	11113 570	8	88.48%	0.94%	
0	ANCTIONS ON VIVIATE OF MONTH THEATER	\$333,373.00 \$0.00	\$13,843	\$40/1 5.64	8314er	عُم	98.94%	0.44%	
	INTO THE WOODS MARTIN BECK THEATRE	\$302,008.00 \$0.00	-\$31,319.00	\$35.76 \$0.00	en h	ge	82.3	-7.89%	
	M. BUTTERFLY EUGENE O'NEILL THEATRE	\$289,186.00 \$0.00	\$6,765.00	\$33.81 \$0.00	8553 1059	Pre	100.96%	1.11%	+ pie
	STARLIGHT EXPRESS GERSHWIN THEATRE	\$261,729.00 \$0.00	-\$57,498.00	\$34.08 \$0.00	7680 1803	8	53.24%	Pe,	t Prices
	AIN'T MISBEHAVIN' AMBASSADOR THEATRE	\$221,248.00 \$0.00	-\$31,191.00	\$33.75	6556 1108	8	73.96%	-8.31%	, sives

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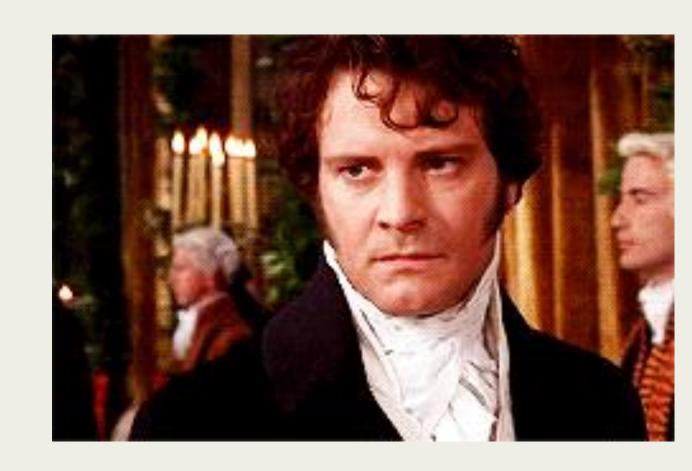
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All data provided by The Broadway League



Tension / Crisis: Stuck!

- I didn't want data (one week at a time) – I wanted DATA (full dataset)
- The data was right there, but I couldn't get to it

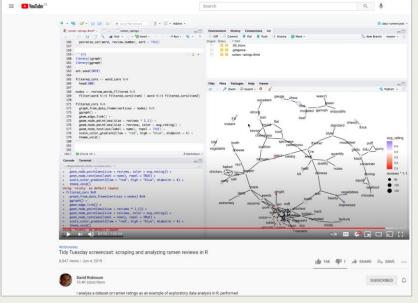


Tension / Crisis: Stuck!

Should I learn how to web scrape?



Tension / Crisis: Stuck!



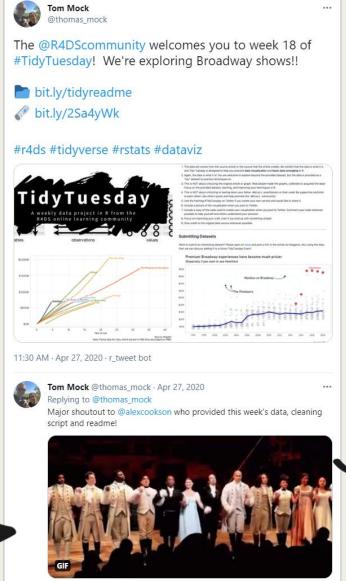




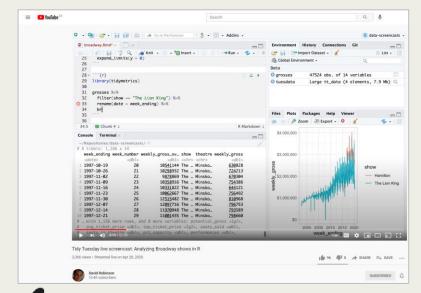
{rvest} package

```
library(tidyverse)
    library(lubridate)
    library(rvest)
   # Weekly grosses
    ### Create function to scrape grosses table
    get_playbill_data = function(url) {
      website <- read_html(url)
      show stats <- list(
        weekly_gross_overall = html_nodes(website, ".week-total .accent") %>% html_text(trim = TRUE),
       show = html_nodes(website, ".col-0 .data-value") %>% html_text(trim = TRUE),
       theatre = html nodes(website, ".col-0 .subtext") %>% html text(trim = TRUE).
       weekly gross = html nodes(website, ".col-1 .data-value") %>% html text(trim = TRUE),
       potential_gross = html_nodes(website, "td.col-1 .subtext") %>% html_text(trim = TRUE),
       avg_ticket_price = html_nodes(website, ".col-3 .data-value") %>% html_text(trim = TRUE),
       top_ticket_price = html_nodes(website, "td.col-3 .subtext") %>% html_text(trim = TRUE),
       seats_sold = html_nodes(website, ".col-4 .data-value") %>% html_text(trim = TRUE),
       seats in theatre = html nodes(website, "td.col-4 .subtext") %>% html text(trim = TRUE),
       pct_capacity = html_nodes(website, ".col-6 .data-value") %>% html_text(trim = TRUE),
       performances = html_nodes(website, ".col-5 .data-value") %>% html_text(trim = TRUE),
       previews = html_nodes(website, "td.col-5 .subtext") %>% html_text(trim = TRUE)
      tibble(show stats = show stats) %>%
       mutate(variable name = names(show stats)) %>%
       pivot_wider(names_from = variable_name, values_from = show_stats) %>%
        unnest(cols = everything())
38 ### Create tibble with list of URLs and scrape data
 99 ### TAKES A LONG TIME (~10 HOURS)
    tibble(week_ending = seq(ymd("1985-06-09"), ymd("2020-03-01"), by = "1 week")) %>%
      mutate(grosses url = paste@("https://www.playbill.com/grosses?week=", week ending)) %>%
     mutate(week data = map(grosses url, possibly(get playbill data, NULL, quiet = FALSE)))
    broadway_grosses <- broadway_grosses_raw %>%
      unnest(week_data, keep_empty = TRUE) %>%
      mutate at(vars(week number:weekly gross overall, weekly gross:previews).
               parse_number) %>%
       pct_capacity = pct_capacity / 100,
       show = stringi::stri_trans_general(show, "Latin-ASCII")
      mutate at(vars(potential gross, top ticket price), ~ ifelse(. == 0, NA, .)) %>%
      select(-grosses_url)
     write_csv("./broadway-grosses/grosses.csv")
 55 ### Create function to scrape show synopses
    get synopsis <- function(url) {
      message(url)
       html_nodes(".spotlight-search-result .bsp-list-promo-desc") %>%
       html text(trim = TRUE)
                  Web scraping
                                      code
       synopsis = map(
         synopsis_url,
         possibly(get synopsis, NA character , quiet = FALSE)
88 # Clean synopsis data
89 synopses <- synopses raw %>%
90 select(-synopsis url) %>%
      unnest(cols = c(synopsis), keep_empty = TRUE)
   synopses %>%
      write csv("./broadway-grosses/synopses.csv")
```





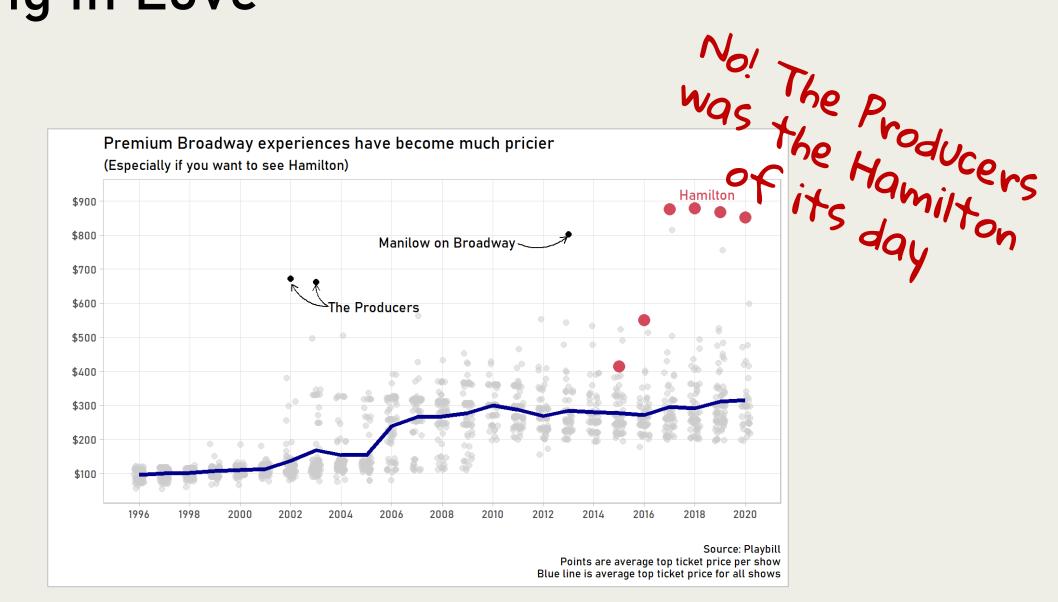
Dataset featured on Tidy Tuesday





Another David Robinson screencast







Great Datasets: A Story

Great Datasets: **Story** Many**

More web scraping!





Using Google Language API with {googleLanguageR}

Japanese Mascots (Yuru-chara)

Yuru-chara are Japanese mascot characters, often representing towns or organizations. Western audiences, if they are familiar with yuru-chara at all, might know Chiltan, who was featured on Last Week Tonight With John Oliver. These mascots are often silly and whimsical, and they are definitely kawaji (cute)! For example, here is Chiyopen, the mascot for the Chiyoda Real Estate Company



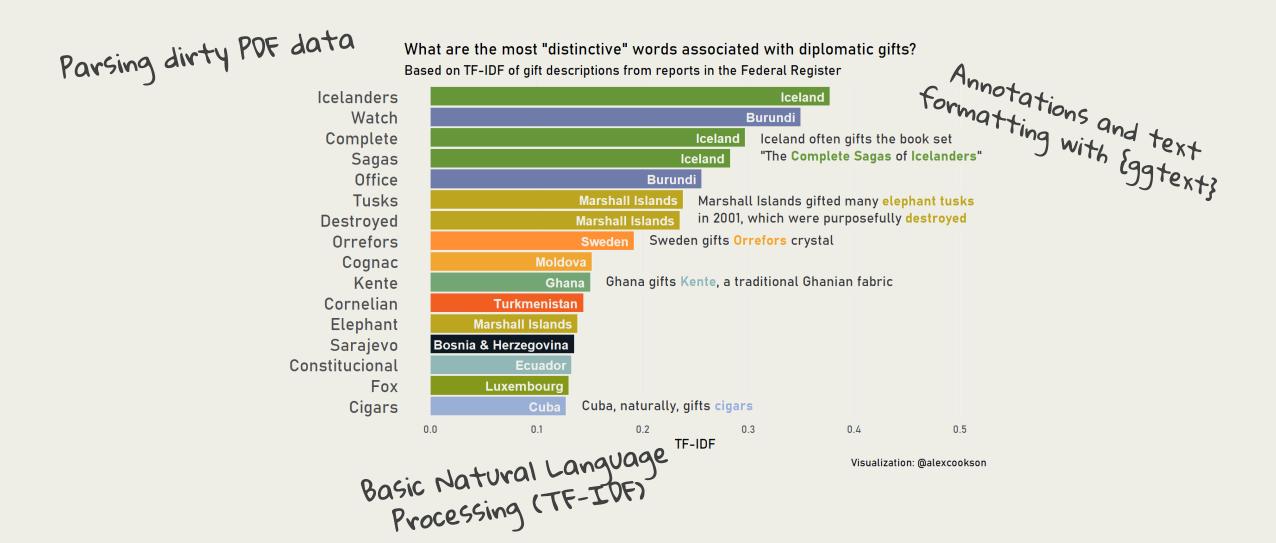
The Twitter account Mondo Mascots regularly posts pictures and descriptions of the many mascots that exist. Chris Carlier, curator of Mondo Mascots, was also featured on an episode of 99% Invisible, Return of the Yokai

The data is from the official website of the Yuru-Chara Grand Prix (Japanese), an annual competition where the public votes for their favourite yuru-chara. The English translation of names, areas, organizations, and descriptions was done using Google's Cloud Translation API, so if there is any weird phrasing or syntax, it is likely a result of automated translation.

Data Dictionary

yuru-gp.tsv

variable	class	description
variable	Ciass	description
year	double	Year of Yuru-chara Grand Prix
category	character	Ranking category (in 2017, it was split into two categories: local and company/organization)
rank	double	Character's rank within their category for that year
character_id	double	Unique identifier of character used by yurugp.jp
name	character	Character name
area	character	Area character is from (usually a prefecture)
affiliation	character	Company, town, or organization the character represents
description	character	Character description
image_url	character	Link to character's picture



More text formatting with {ggtext}

Creating beautiful graphs with {99910+2}

Principal Component Analysis (PCA)

Reasonable

Rugged

Refined

Brienne of Tarth

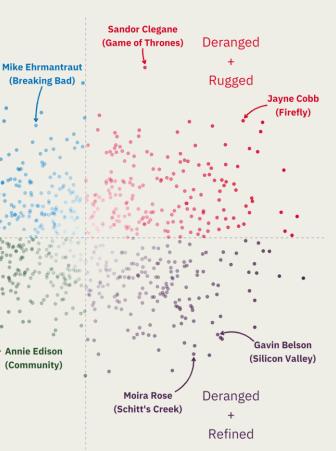
(Game of Thrones)





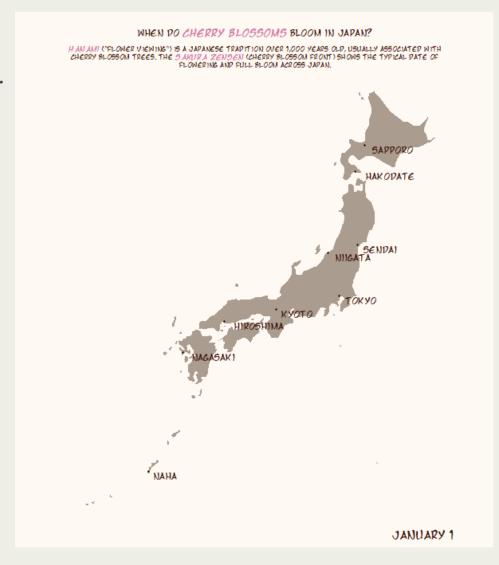






So. Much. Egganimate?.

custom icons with Egginnages



Text formatting with [99 text]. Again.

Installing and using custom fonts

The One Big Benefit (and Two Small Benefits)

of Great Datasets

1. Decide what you want to learn

"I want to learn logistic regression"

1. Decide what you want to learn

2. Find a dataset to practice on

"I want to learn logistic regression"



Titanic Passengers

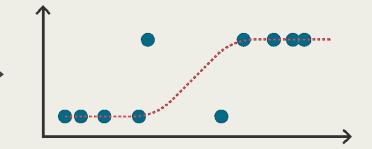
1. Decide what you want to learn

2. Find a dataset to practice on

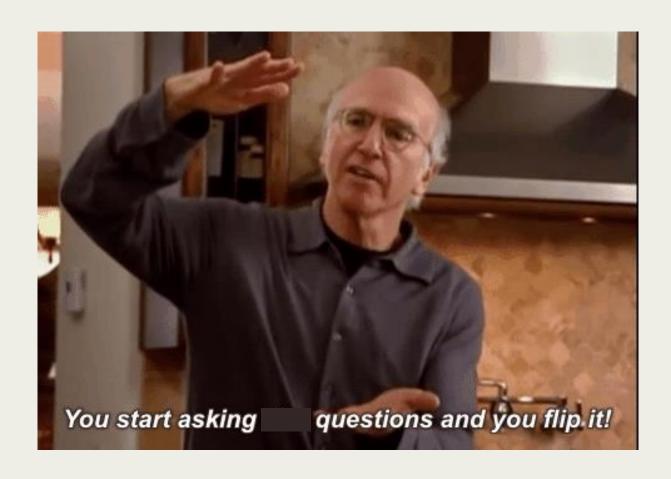
3. Achieve the outcome

"I want to learn logistic regression"





Flip it!



1. Find a dataset that piques your curiosity

1. Find a dataset that piques your curiosity

2. Let your curiosity guide you

Broadway Grosses

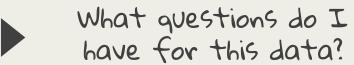


What questions do I have for this data?

1. Find a dataset that piques your curiosity

2. Let your curiosity guide you

3. Learn something as a by-product

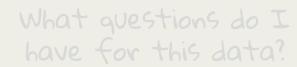


- Web scraping?
- Time-series analysis?
- Forecasting?
- NLP?
- Causal inference?



2. Let your curiosity guide you

3. Learn something as a by-product





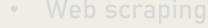
- Time-series analysis?
- Forecasting?
- NLP?
- Causal inference?



2. Let your curiosity guide you



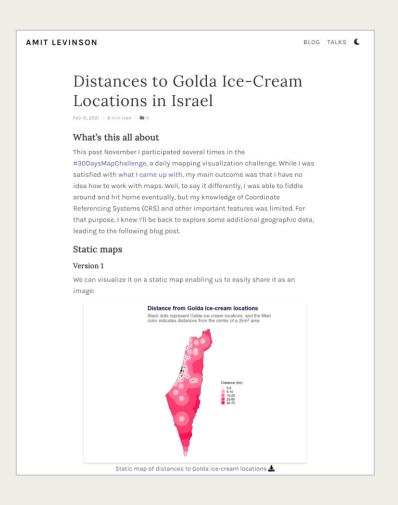




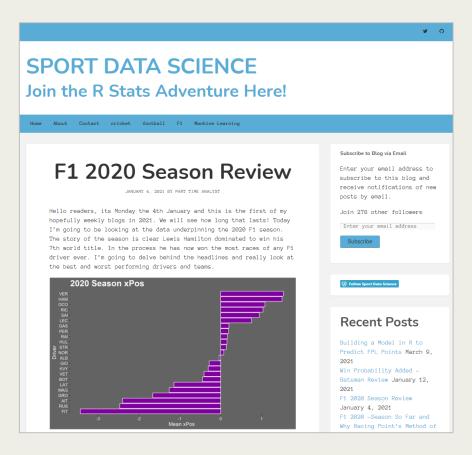
- Time-series analysis?
- Forecasting?
- NLP?
- Causal inference?

Great Datasets are... Sharing who you are

Great Datasets are...Sharing who you are







Great Datasets are... Community-builders

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Me when someone likes a tweet about a dataset I shared

- If you like a dataset...so does someone else
- More (and more diverse) datasets enrich the community
- Curating and sharing datasets is a way for you to engage with the community



Okay Alex, I'm convinced! How do I start?

Getting Going with Great Datasets

- 1. Start with existing datasets (<u>TidyTuesday</u>, <u>Kaggle</u>, my <u>data</u> repository)
- 2. Don't force it know your interests and be watchful
- 3. Know that curating your own datasets will probably involve web scraping
- 4. Share! Encouragement from others is a great motivator

Great Datasets: A Story

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