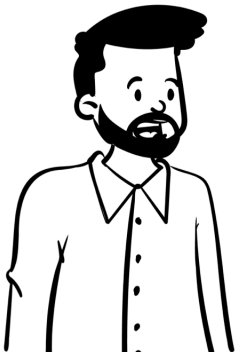



Communicating Data Visually



Matt Dzugan

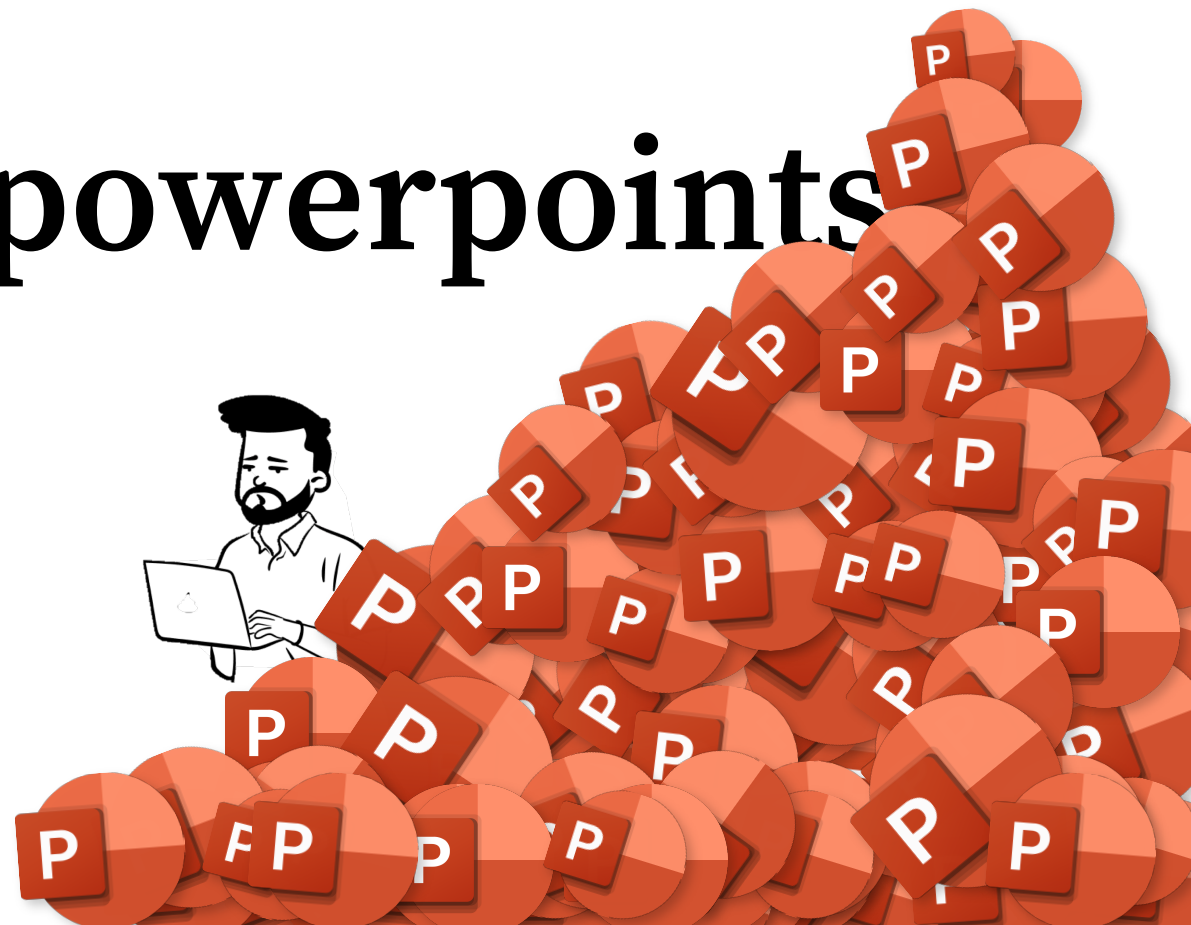
@mattdzugan
mattdzugan.com
mattdzugan

 **Hello ODSC, I'm Matt Dzugan**

Director of Data Science at project44

@mattdzugan on twitter

I make a lot of powerpoints



Takeaways

Be intentional about creating the scope of a visual.
Is it meant to **explore** data or **explain** data?

A list of **tools** of sources of **inspiration** for you to
kickstart your journey into data visualization

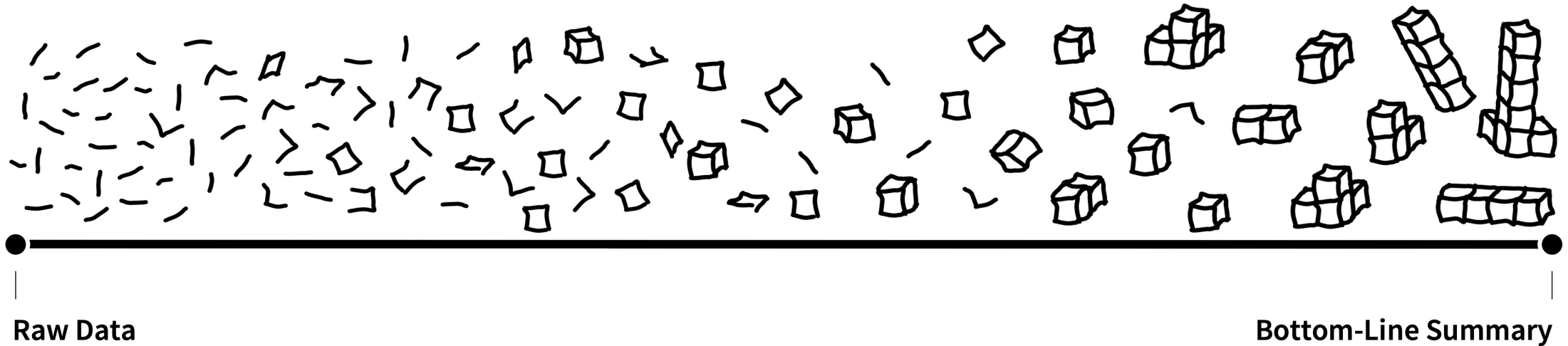
Some concrete **DOs** and **DONTs** to help make your
communication as professional as possible

A Mental Framework

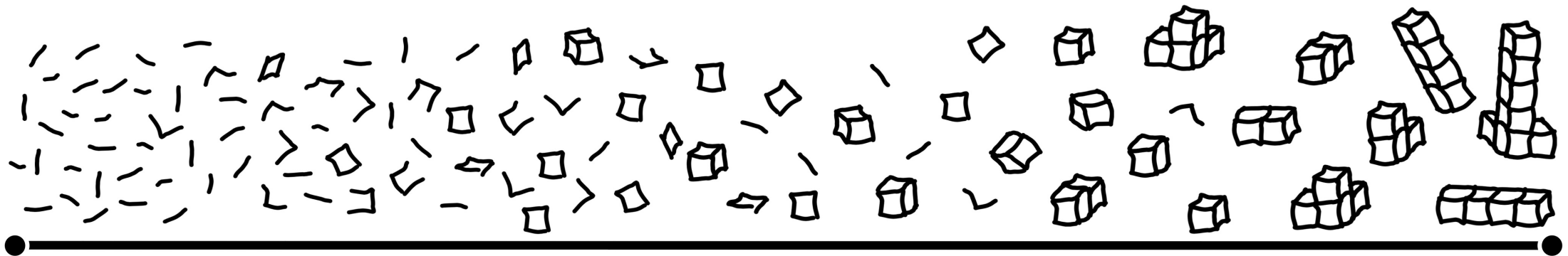


There's no "right way" to create a good data visualization - but there are a few things to consider that will help you consistently succeed

Data Communication Spectrum



Data Communication Spectrum



Raw Data

Bottom-Line Summary



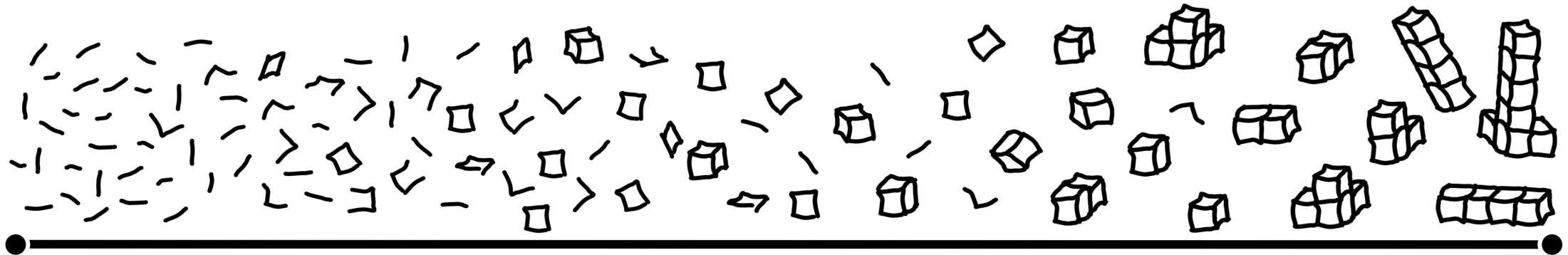
here are the results from the XYZ model using the latest satellite measurements of the air column

@mattdzuga

you will want to wear a sweater outside tomorrow



Data Communication Spectrum



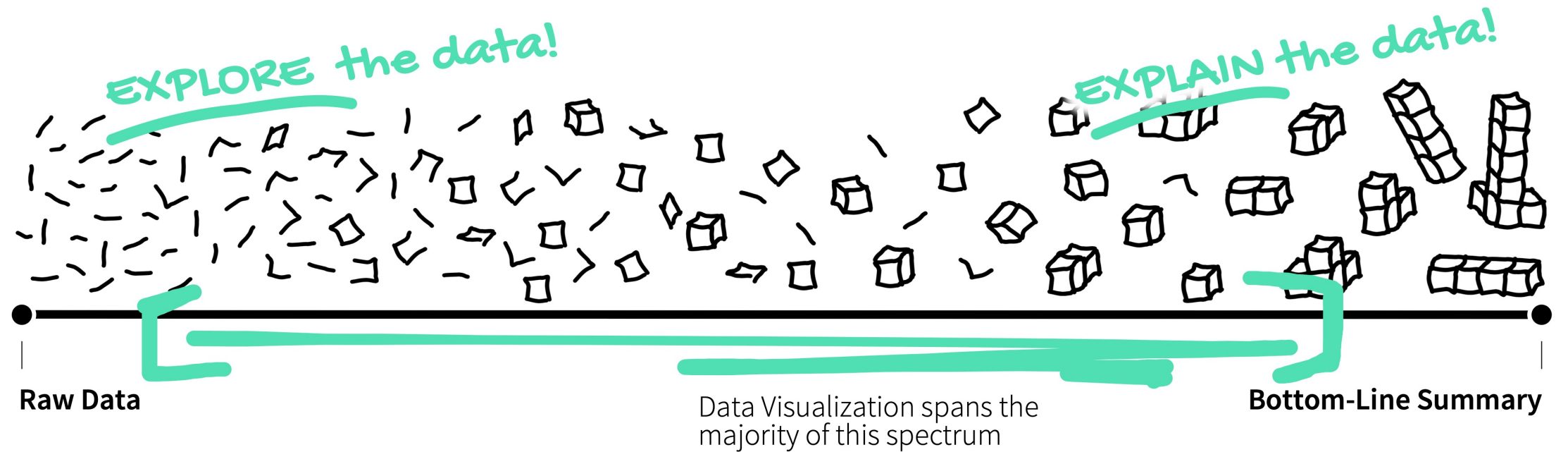
Raw Data

Lowest effort to prepare
Interpretation burden is on audience
Pure Facts, without bias
Multiple conclusions can be drawn

Bottom-Line Summary

Highest effort to prepare
Interpretation burden is on author
Author's biases may be present
Author controls how/which conclusions drawn

Data Communication Spectrum

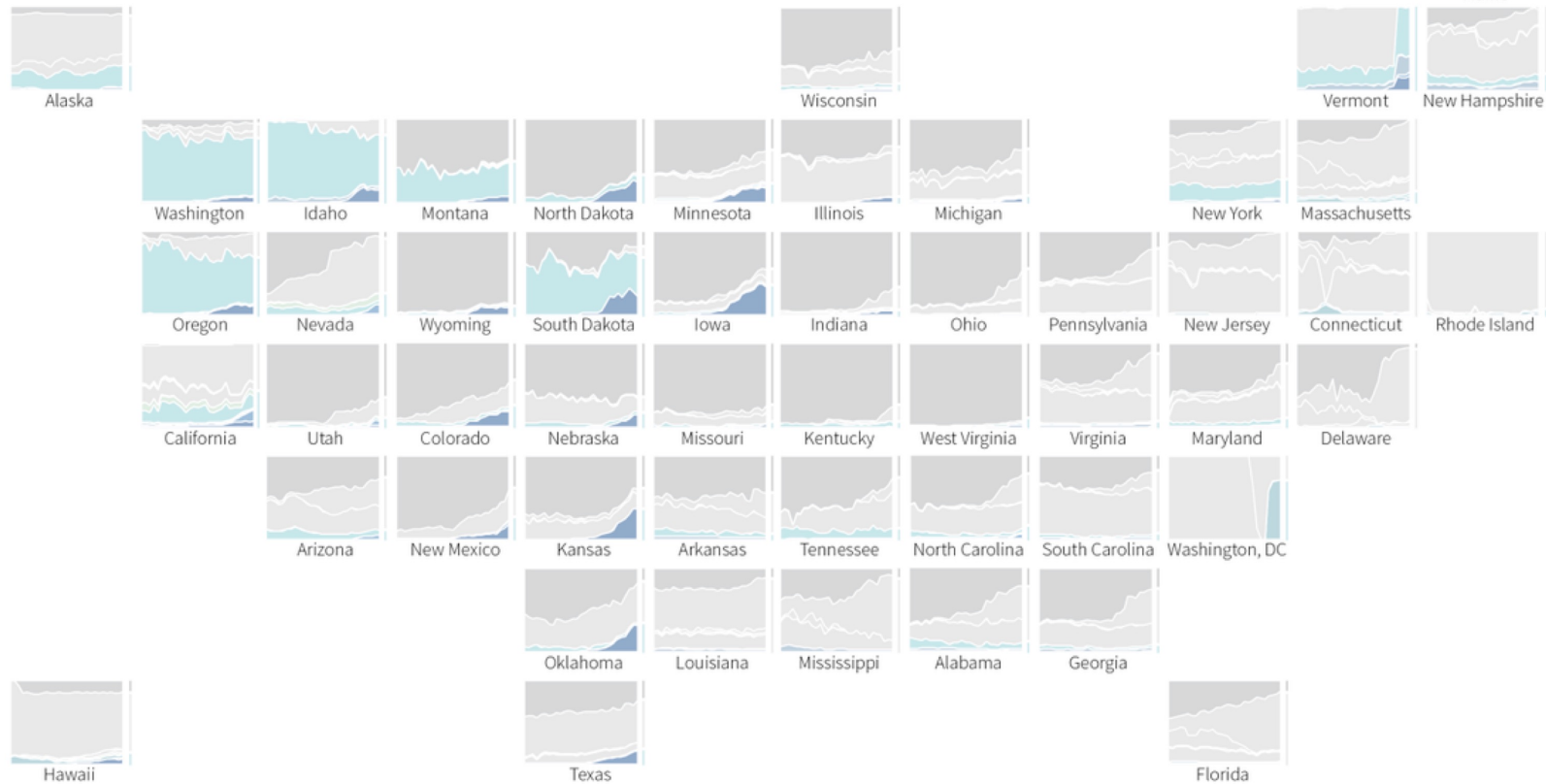


Energy Production in the United States

Net energy generation by state, 1990–2018

These charts show the percentage breakdown of energy *production* (not consumption) by energy source.

Since 1990, many states have begun to shift away from **coal** towards cleaner sources of energy. In particular, **wind** now plays an important role in the upper Midwest, **solar** in California, and **wood-based fuels** in parts of New England. **Hydropower** remains a major source of energy in the Pacific Northwest and Northeast.



Data: U.S. Energy Information Administration, Net Generation by State by Type of Producer by Energy Source, 1990–2018. For visualization purposes, these charts omit negative net generation values (primarily associated with pumped storage), which generally represented <1% of total state net generation.

www.cesantoro.com

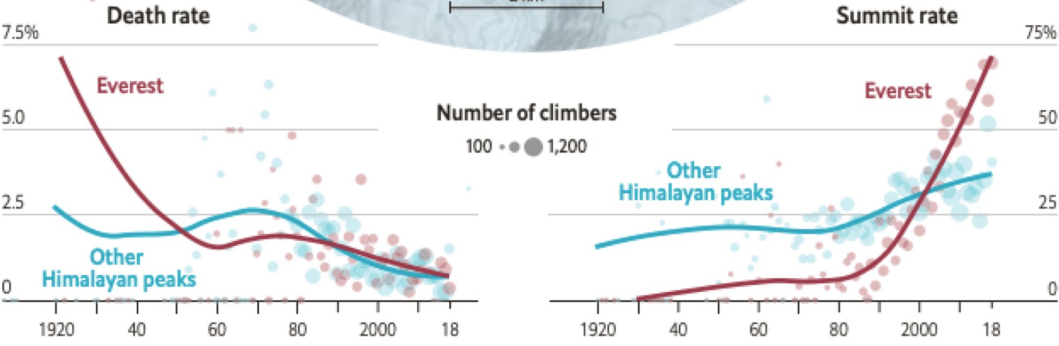
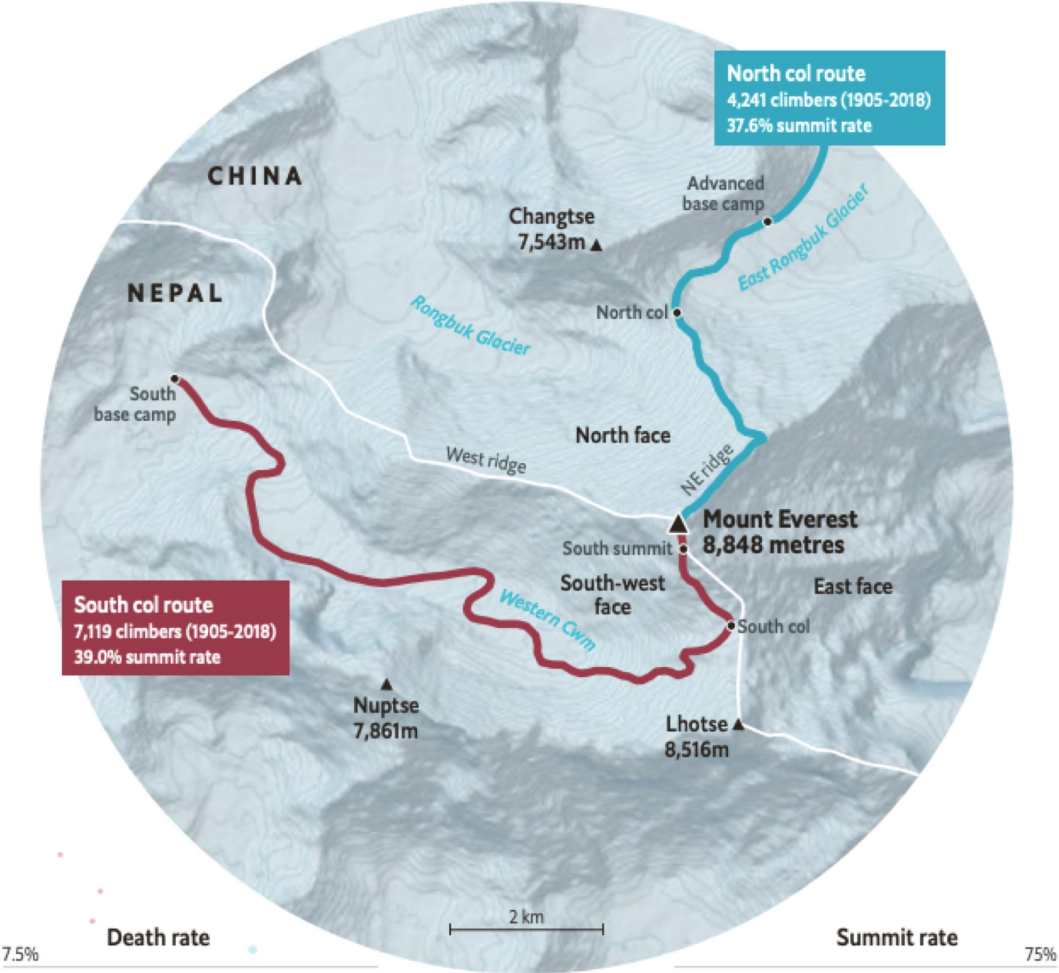
Explore

Notice how the layout allows you to quickly seek out information, in a way that is much more intuitive than looking at numbers in a table.

How many different “headlines” could you imagine walking away with from this graphic?

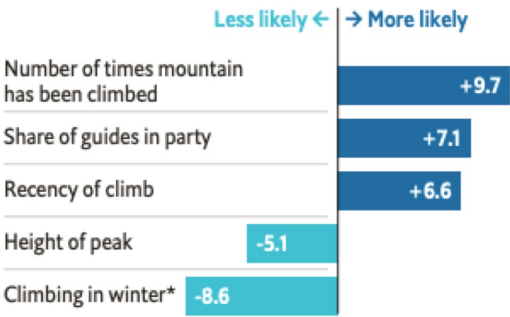


Compared with other Himalayan peaks, climbing Everest is getting easier

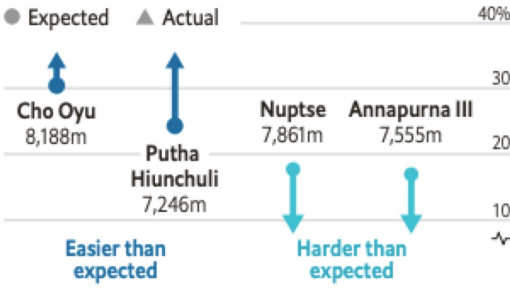


Climbers' odds of success vary based on when, how high and with whom they climb

Factors with biggest impact on probability of reaching a Himalayan summit
%-point change for every one-standard-deviation increase, relative to an average climb



Expected rate of reaching summit v actual
Based on factors listed above



Source: Himalayan Database. All figures exclude guides. Chinese and Nepalese peaks only. *Compared with other seasons

Explain

Notice how each of the 5 component-graphics all support the claim that Everest is getting easier to climb over time.

The author of the graphic has made an effort to convince you of this point. Are you skeptical at all? Why or why not?



How Trump compares with past presidents

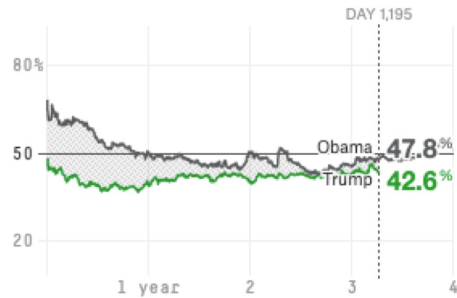
● Approval rating ○ Disapproval rating ○ Net approval

1,195 days

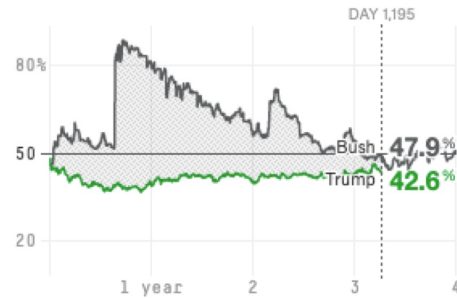
4 years

8 years

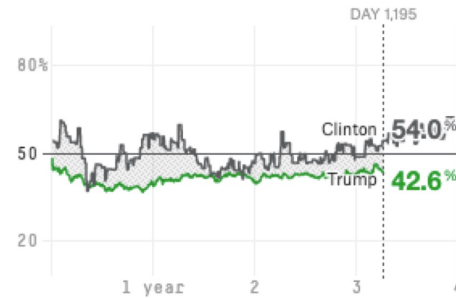
Barack Obama 2009-17



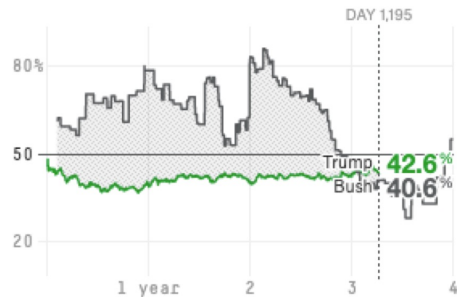
George W. Bush 2001-09



Bill Clinton 1993-2001



George H.W. Bush 1989-93



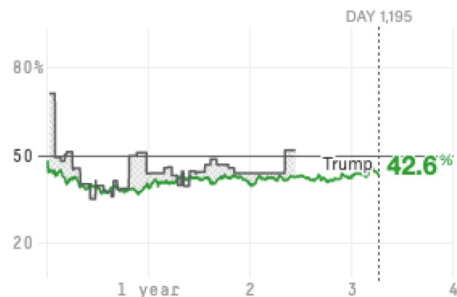
Ronald Reagan 1981-89



Jimmy Carter 1977-81



Gerald Ford 1974-77



Richard Nixon 1969-74



Lyndon B. Johnson 1963-69



Explore

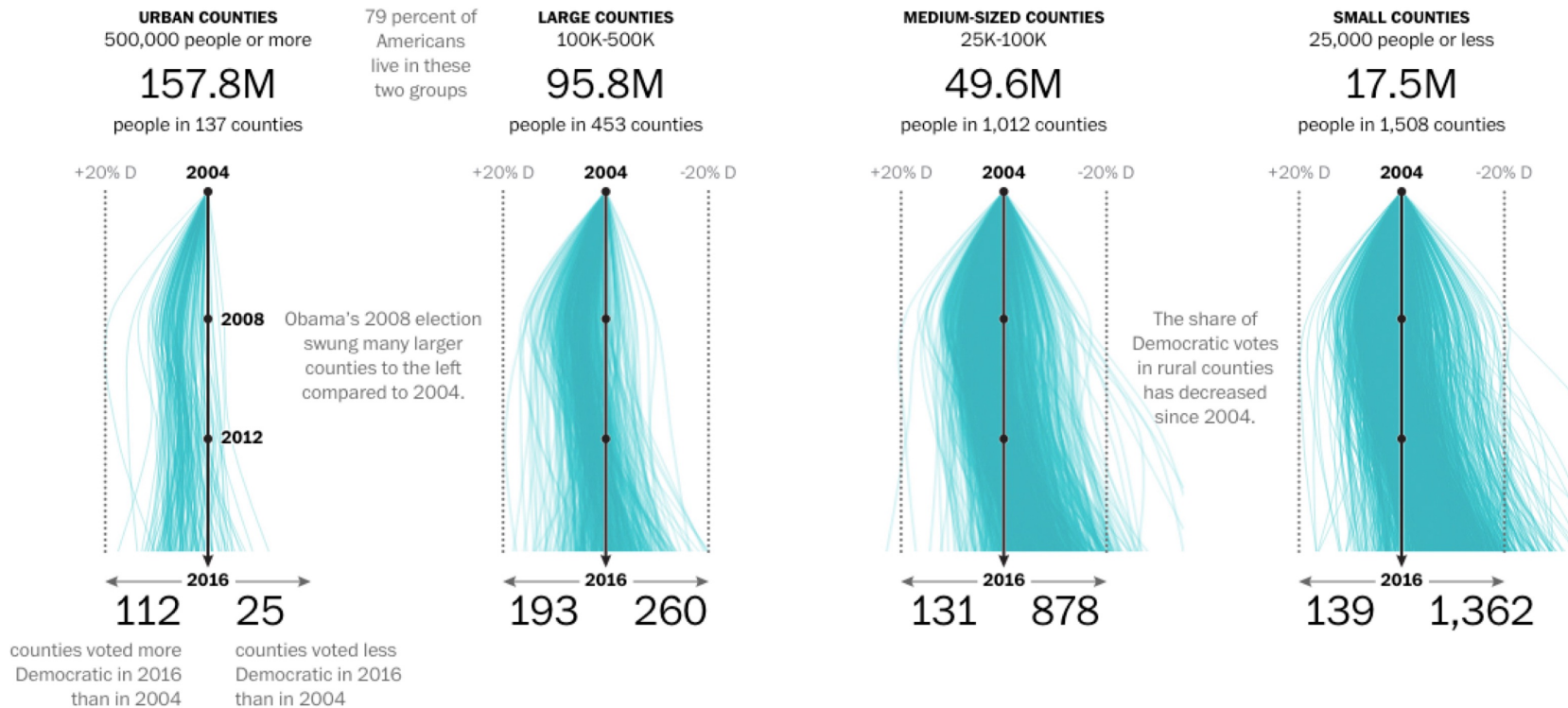
On one hand – this series of graphics offers a clear explanation that Trump's approval ratings are lower than his predecessors – but on the other hand it offers so much additional data that there are plenty of other relationships to explore.



Urban and rural America are becoming increasingly polarized

Since Obama's election in 2008, the trend of urban counties voting for Democrats and rural counties voting for Republicans has grown stronger.

How the Democratic vote changed in every county since 2004



By **Lazaro Gamio**
Nov. 17, 2016

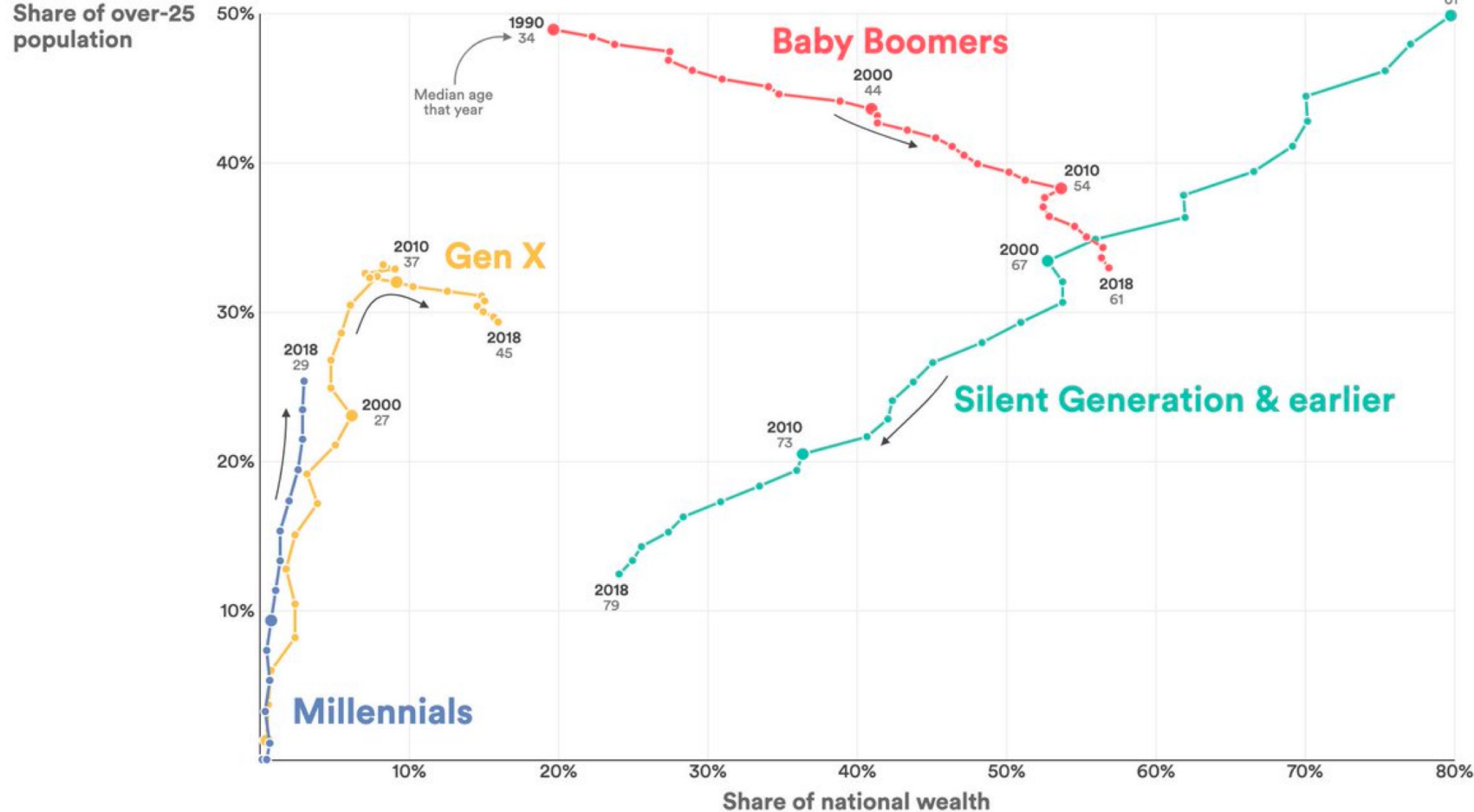
Explain

This visualization is an excellent example of being tailored to support one specific message. And it does a great job of showing the underlying data transparently while avoiding other junk.

For example – is there anything else (other than the headline) you can learn from this chart? Probably not. It's very focused.



Generational share of wealth vs. adult population



Sources: US Census Bureau, Federal Reserve's Distributional Financial Accounts

Explore

This graphic is a good example of something that takes a bit of mental investment.

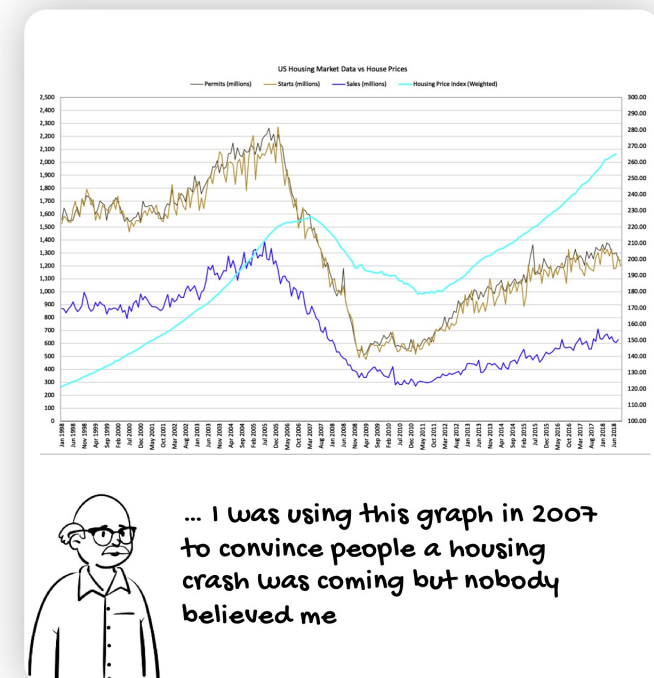
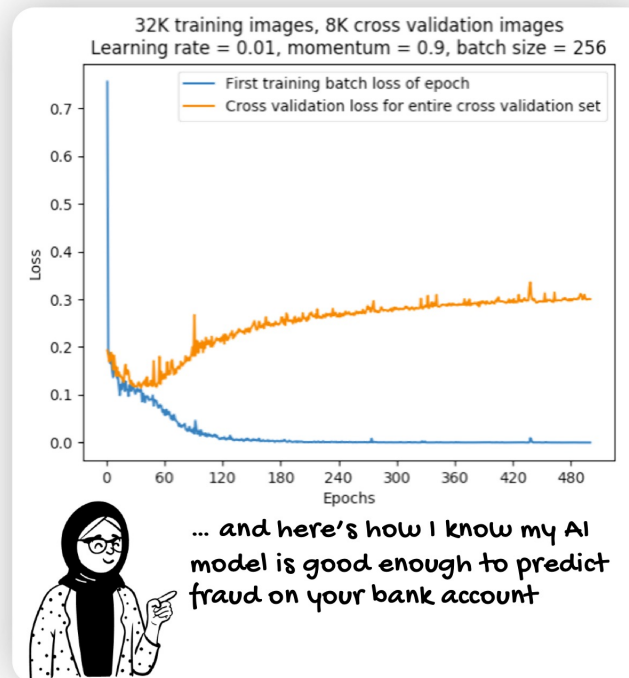
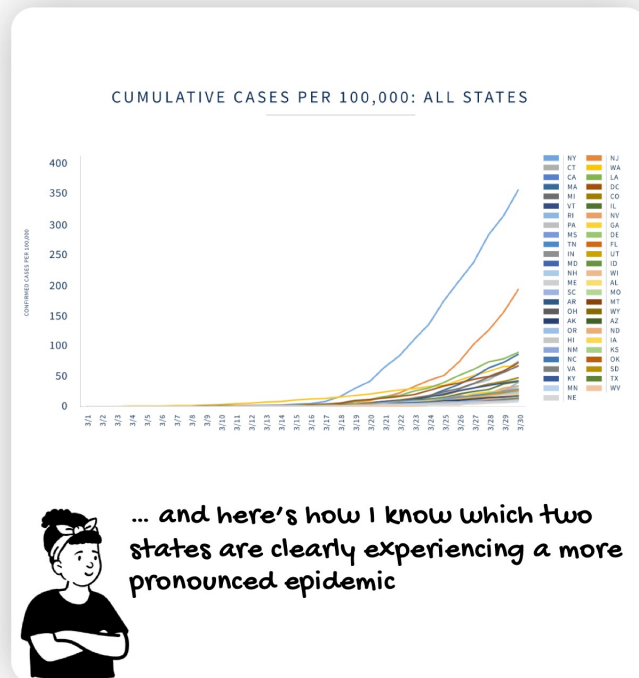
It's not immediately obvious "how to read it". But once you catch on – the number of conclusions you can reach is almost endless.

Yeah, I could stare at this one for hours.



A Common Mistake...

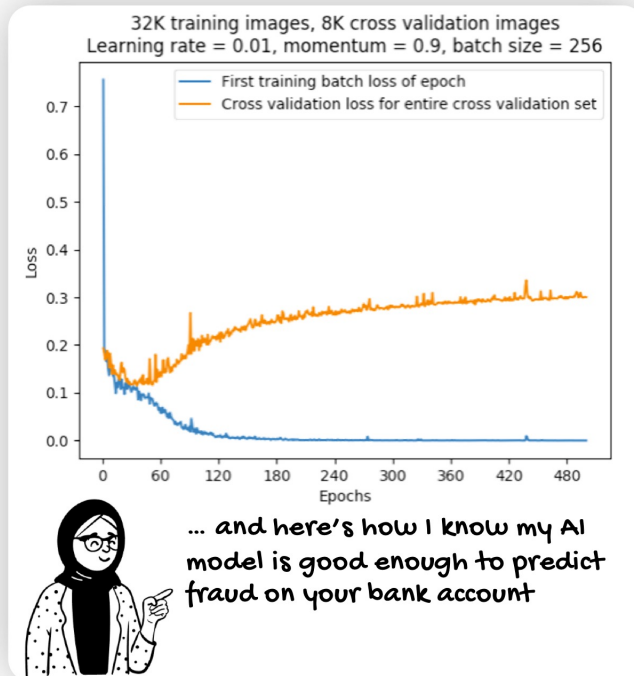
A graphic used by an expert to **explore** their own data, is pasted directly into a document to **explain** a concept to a less-informed audience. Just because it makes sense to the creator, doesn't mean it offers the intended **explanation**.



The context & background knowledge of these graphics' creators are necessary to understand the graphs

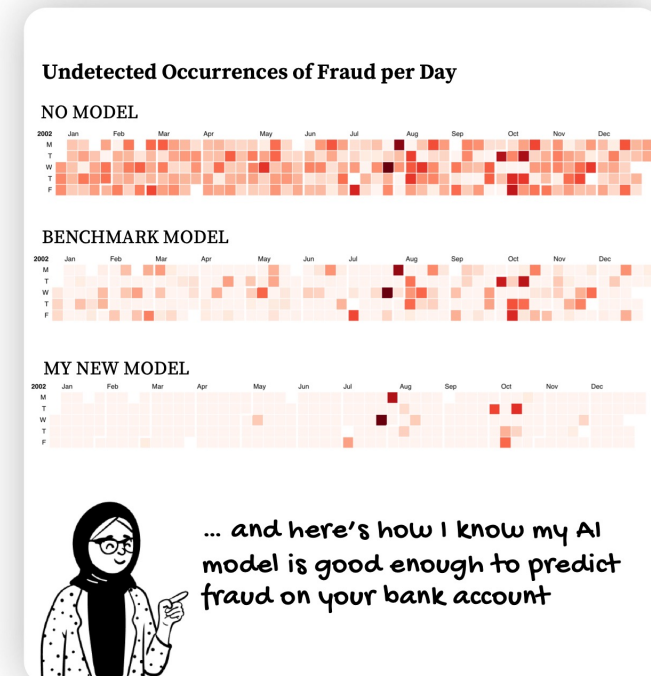
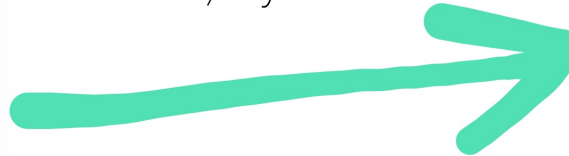
...A Potential Solution

Identify the core message being conveyed by your graphic. Something so simple it can be described in 10 words or less. Once this message is identified, try and design a graph that effectively conveys that simple message.



Take a step back.
What am I trying to explain?
“The model is good”
What’s a clear way to show the model is working well?

Maybe a calendar of all undetected cases of fraud with
1) no model 2) a benchmark model & 3) my model



The graphic you use to
discover the insight may
not be the right graphic to
communicate the insight

Design Considerations



Good visual communication is equal parts "form" and "function". Without both you either lose your audiences interest or convey no information.

Two Distinct Steps

1. Develop Your Story

- Who is the audience?
- What do they know? [current state]
- What do we want them to know? [desired state]
- What is the smallest set of info that takes them from [current] to [desired] state?



2. Create your Graphics

- Above all else, show the data
- Show context as needed
 - Remember audience's current state
- Highlight key points as needed
 - Remember audience's desired state
- Remove unnecessary Chart Junk

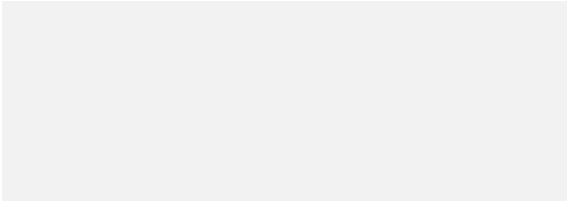
Develop Your Story Structure **Before** You Do the Project

I realize it sounds crazy
but I promise this is magic

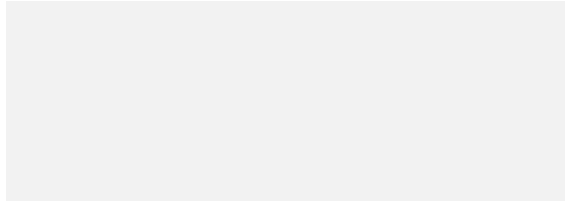


Example for a ML Model

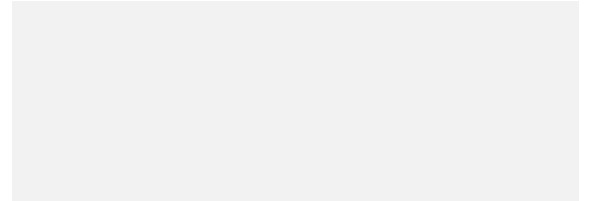
There's a problem in the world



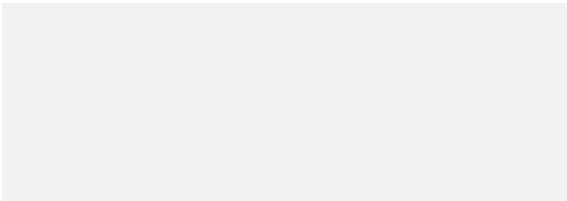
Here's How Users Try to Solve it Today



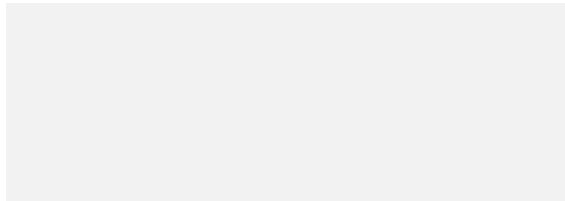
We can Measure their Success (benchmark)



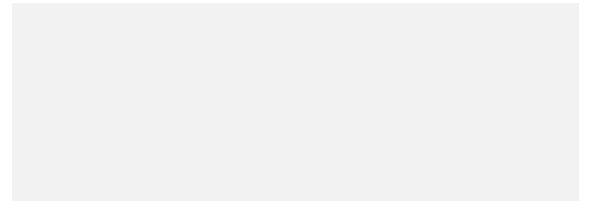
We have XYZ data available to us



Our approach to solving the problem



Our success metrics vs benchmark



Example for a ML Model

There's a problem in the world



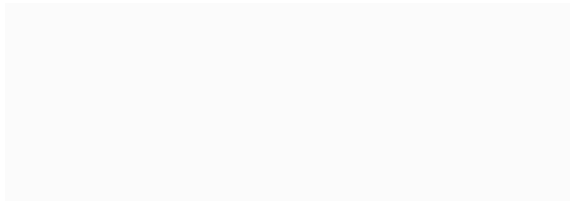
Here's How Users Try to Solve it Today



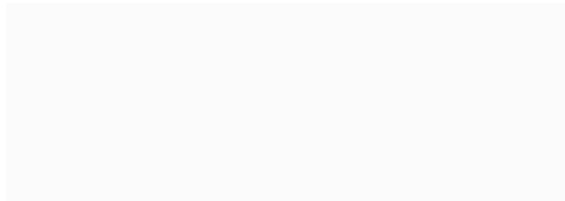
We can Measure their Success (benchmark)



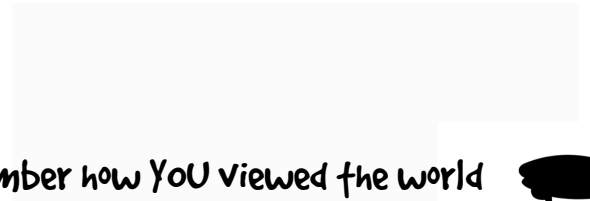
We have XYZ data available to us



Our approach to solving the problem



Our success metrics vs benchmark



Remember how YOU viewed the world
BEFORE you started your project?

That's probably where your audience is today!



Example for a ML Model

There's a problem in the world



Here's How Users Try to Solve it Today



We can Measure their Success (benchmark)



We have XYZ data available to us



Our approach to solving the problem



Our success metrics vs benchmark

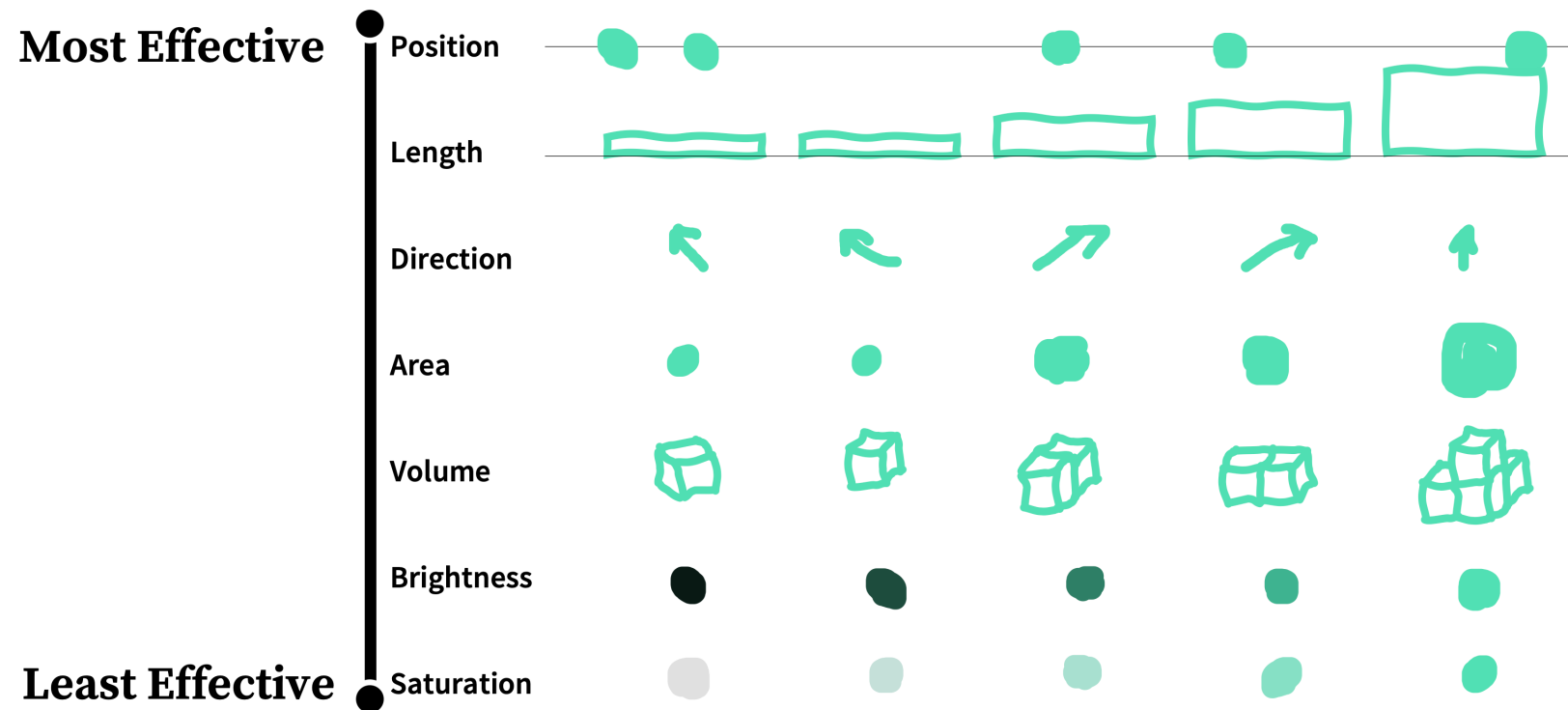


*This also acts as a great
project-management guide!*



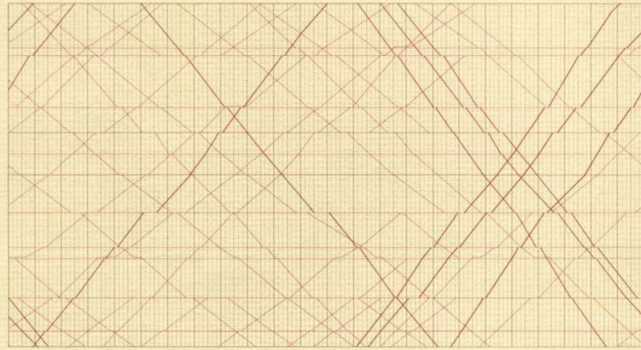
What To Consider

Studies have identified the easiest ways for people to understand differences in quantitative data, shown here on a scale from most effective to least.



The results of surveys tracking audiences' understandings of charts and graphics are clear: Not all visual elements are created equal





The Visual Display of Quantitative Information

EDWARD R. TUFTE

Above all else show the data

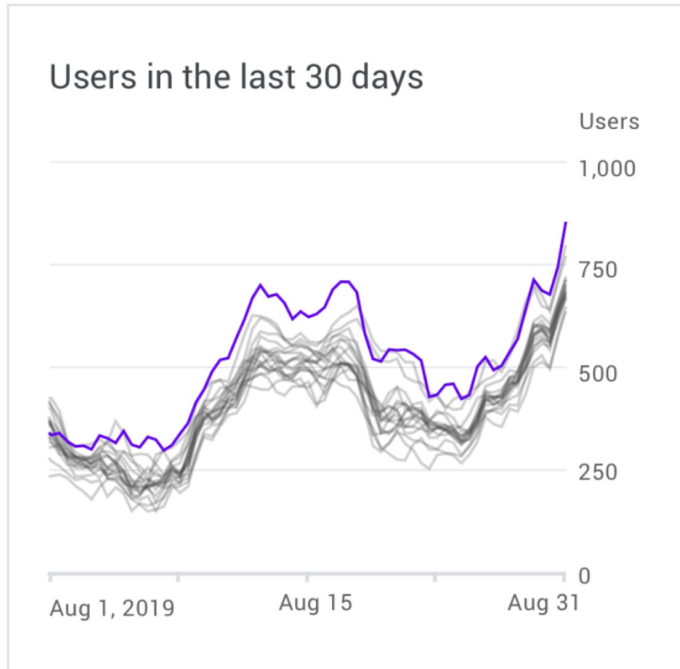
Tufte, 1983

A large share of ink on a graphic should present data-information, the ink changing as the data change. Data-ink is the non-erasable core of a graphic, the non-redundant ink arranged in response to variation in the numbers represented.

Tufte, 1983

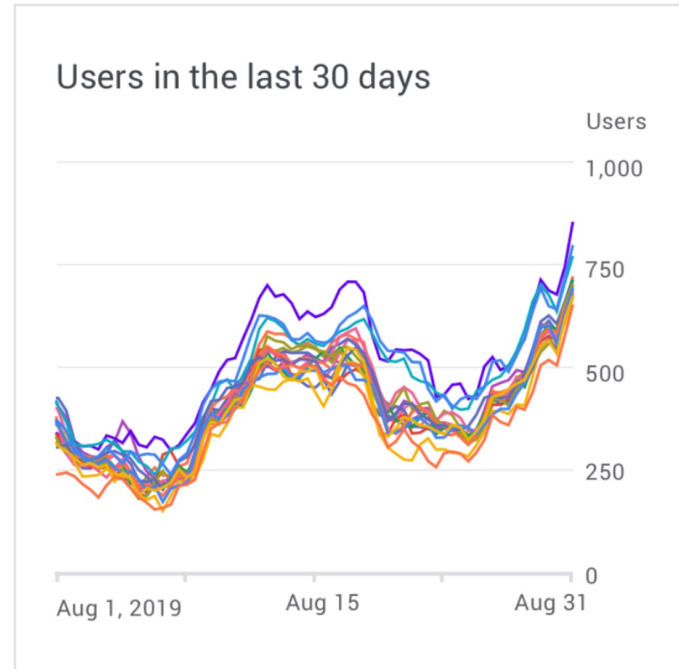


Highlight with Color, don't Identify



Do

Use a combination of color highlights and neutral colors to provide contrast and emphasis.



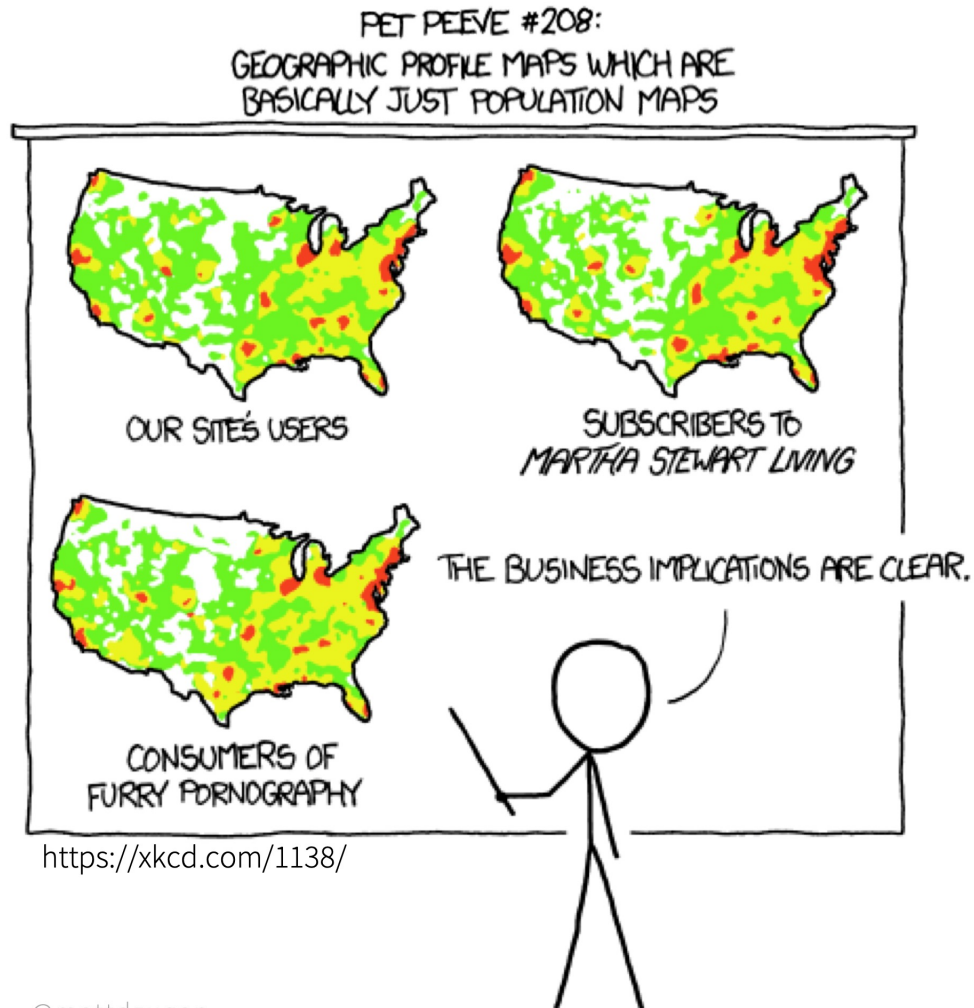
Caution

Many colors in a single chart can hinder focus.

This is my favorite of all the DO/DON'T tips. Once you start doing this, you'll never go back!



Transform your data before Plotting



More often than not,
normalizing your dataset by
population ("per capita") or
area is going to be helpful
before mapping it





One thing that bothers me is large numbers presented without context. We're always seeing things like, "This canal project will require 1.15 million tons of concrete." It's presented as if it should mean something to us, as if numbers are inherently informative. So we feel like if we don't understand it, it's our fault.

Randall Munroe - XKCD



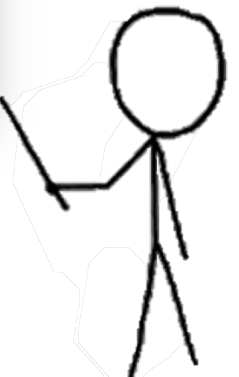
But I have only a vague idea of what one ton of concrete looks like. I have no idea what to think of a million tons. Is that a lot? It's clearly supposed to sound like a lot, because it has the word "million" in it. But on the other hand, "The Adventures of Pluto Nash" made \$7 million at the box office, and it was one of the biggest flops in movie history.

Randall Munroe - XKCD

FiveThirtyEight

It can be more useful to look for context. Is concrete a surprisingly large share of the project's budget? Is the project going to consume more concrete than the rest of the state combined? Will this project use up a large share of the world's concrete? Or is this just easy, space-filling trivia? A good rule of thumb might be, "If I added a zero to this number, would the sentence containing it mean something different to me?" If the answer is "no," maybe the number has no business being in the sentence in the first place.

Randall Munroe - XKCD

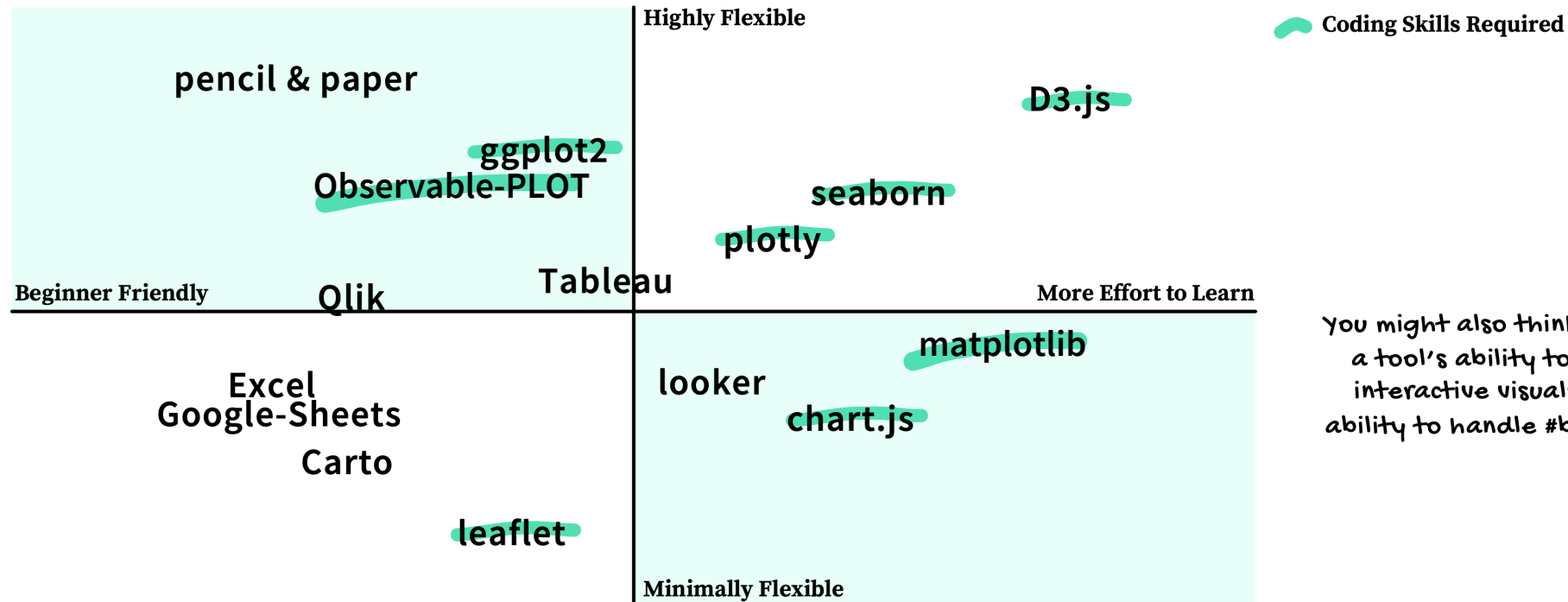


Tools & Software



Sometimes you need to make a graphic as quickly as possible. Other times it's worth taking a moment to create something customized. There's tools out there for everything.

Landscape of Tools

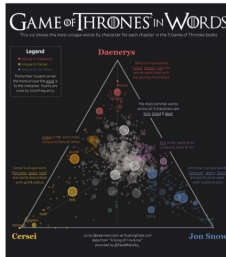


You might also think about a tool's ability to create interactive visuals, or its ability to handle #bigdata

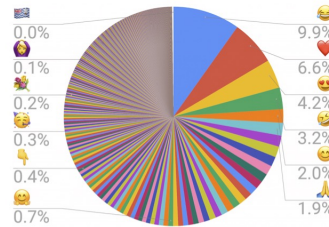


Avoid “Tool-Worship”

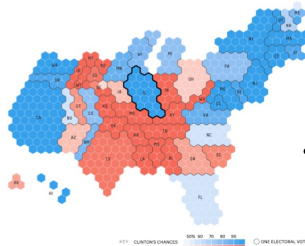
Tableau can do



...but it can also do



D3.js can do



...but it can also do



Excel can do



...but it can also do



A shiny new pair of basketball shoes isn't going to make me as good as Michael Jordan. Also, Michael Jordan could beat me even if he was wearing ski boots.



Learning by Example



They say imitation is the best form of flattery. That might be true, but it's also a really good way to hone those visualization skills!

Inspiration

Twitter

Hashtags like #dataviz, #MakeoverMonday and #TidyTuesday & posts from the best of the best

Big Name Newspapers

Washington Post, New York Times, The Economist all publish phenomenal Data Visualizations

Boutique and Niche Publications

Sites like pudding.cool, flowingdata.com, distill.pub, fivethirtyeight.com lead the way in viz innovation

reddit.com/r/dataisbeautiful

Tons of great and diverse content from folks around the world including a monthly contest!

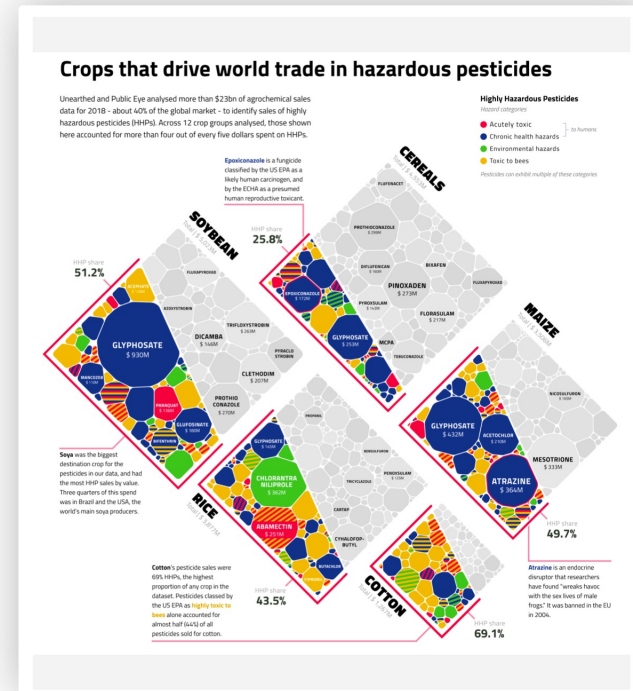
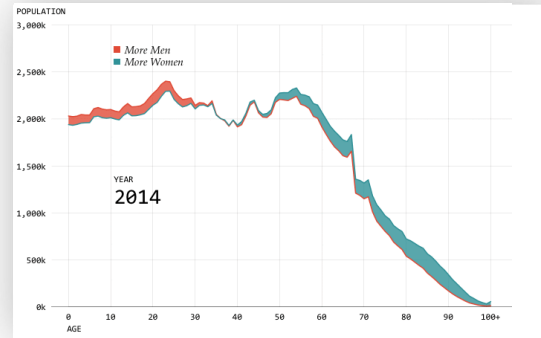
Data Visualization Society

The “DVS” aims to collect and establish best practices and foster a community



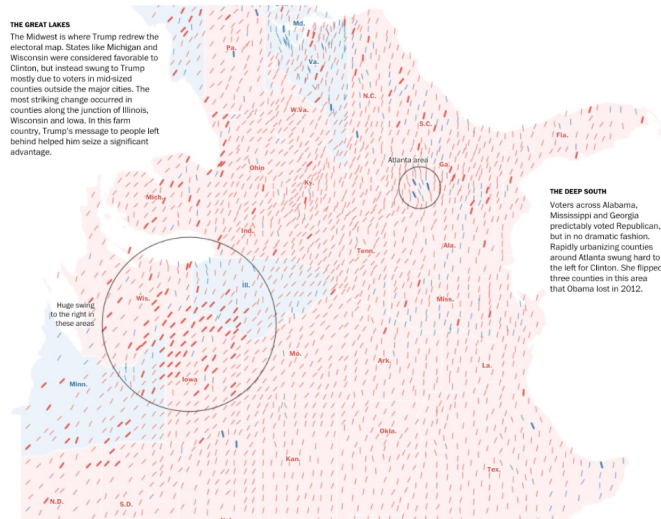
Here's an initial list of folks to get you started

@mattdzugan

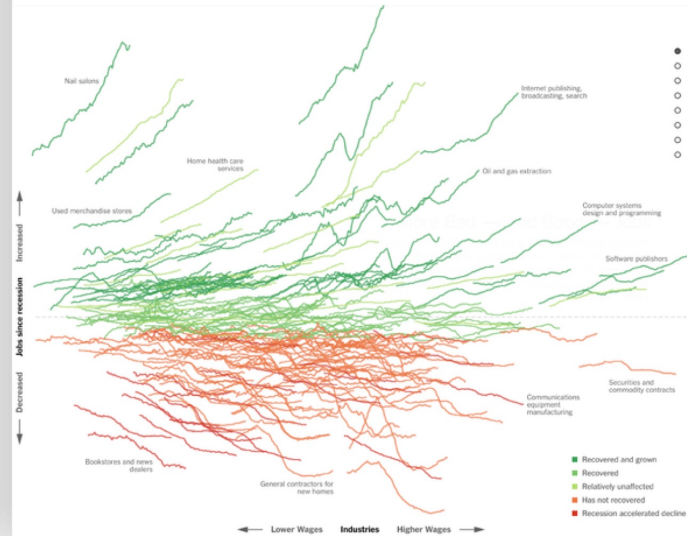


Newspapers

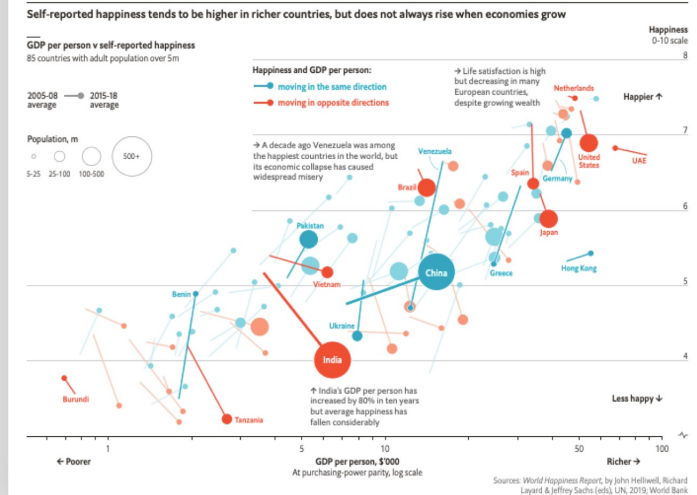
Washington Post



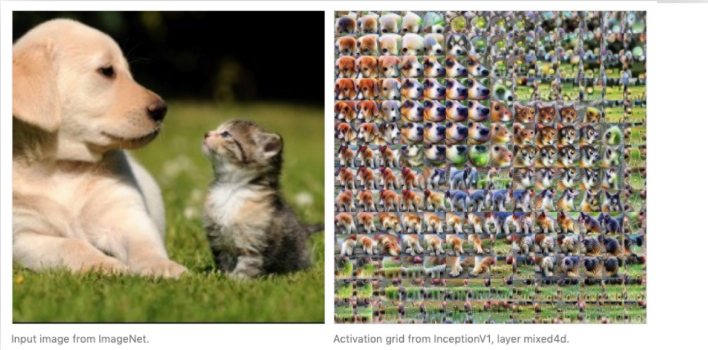
New York Times



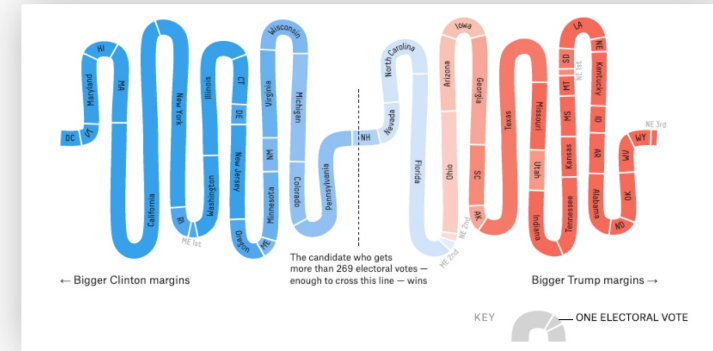
The Economist



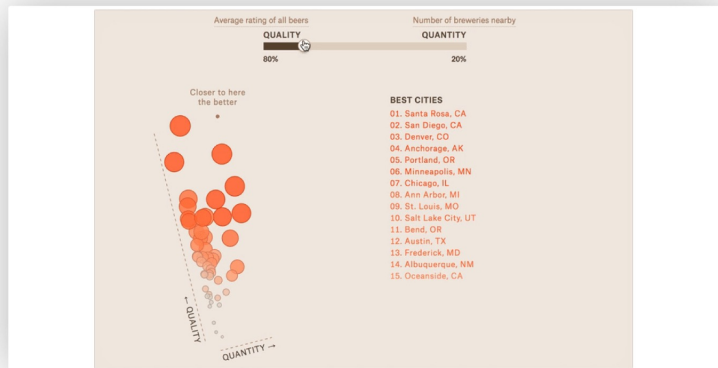
Niche Publications



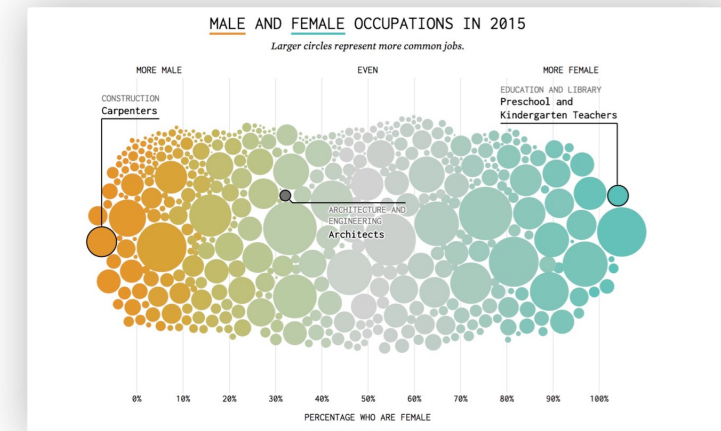
<https://distill.pub>



<https://fivethirtyeight.com>



<https://pudding.cool>

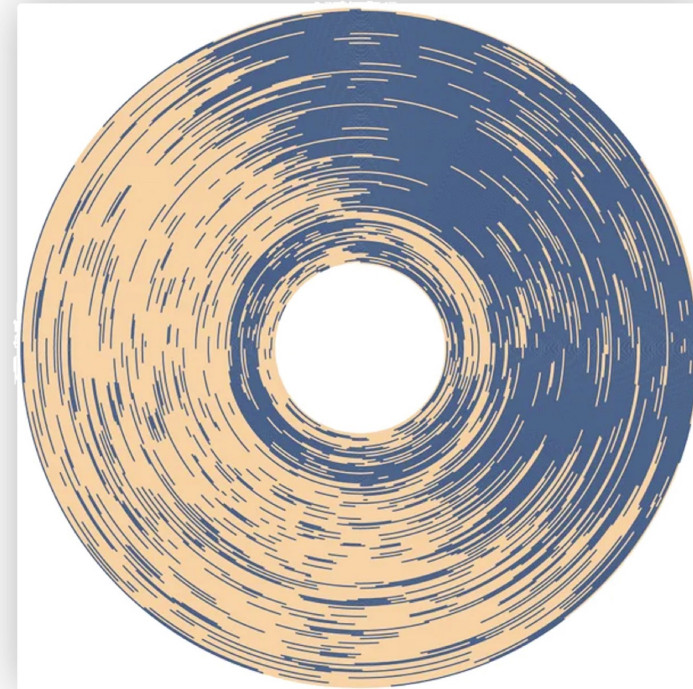
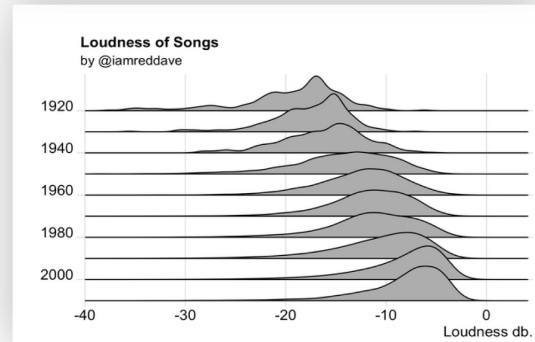
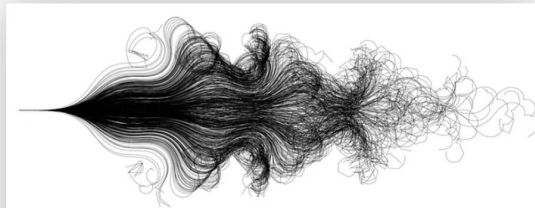
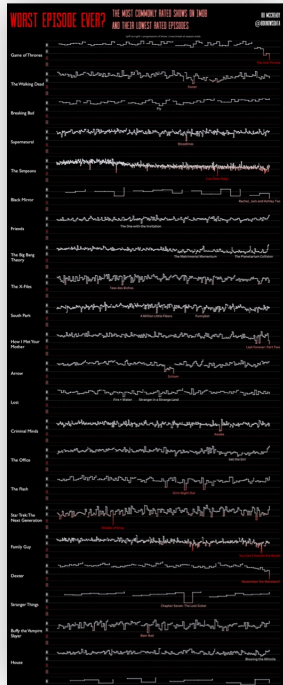


<https://flowingdata.com/>



Reddit

<https://www.reddit.com/r/dataisbeautiful/>

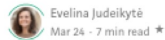


Data Viz Society



I Learned Data Viz in a Year, and You Can Too

How I went from making simple charts to running workshops, and what I learned along the way



Evelina Judeikyte
Mar 24 · 7 min read ★



How Self-Employed Data Visualization Designers Make a Living

Interviewing four designers about how they started—and made—their careers in data visualization



Jane Zhang
Mar 31 · 19 min read ★



[ABOUT](#) [PROGRAMS](#) [RESOURCES](#) [JOBS](#) [PUBLICATION](#) [CHALLENGES](#) [JOIN](#)

The **Data Visualization Society** aims to collect and establish best practices, fostering a community that supports members as they grow and develop data visualization skills. As data grows more central to our personal and professional lives, the practice of data visualization becomes ever more important.

JOIN THE COMMUNITY!

BECOME A MEMBER



How John Burn-Murdoch's Influential Dataviz Helped the World Understand Coronavirus

An interview with the Financial Times data-journalist about his experience visualizing the COVID-19 pandemic



Jason Forrest
Mar 14 · 16 min read



Ten Considerations Before you Create another Chart about COVID-19

To sum it up—#vizresponsibly; which may mean not publishing your visualizations in the public domain at all.



Amanda Makulec
Mar 11 · 9 min read



The Hungarian Statistician Behind Three Volumes of Visualization Masterpieces

Revisiting the life and work of Lajos Illyefalvi (1881–1944), the great data chronicler of Budapest



Attila Bátorfy
Apr 9 · 7 min read ★

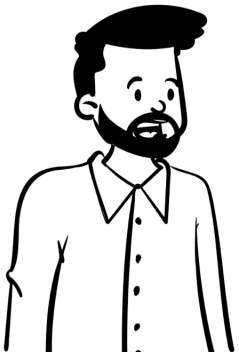


The graphic you use to **discover** the insight may not be the right graphic to **communicate** the insight

First **develop your story**, then create effective graphics to tell that story

Communicating is both **art and science**. Learn from those who you feel do it well!

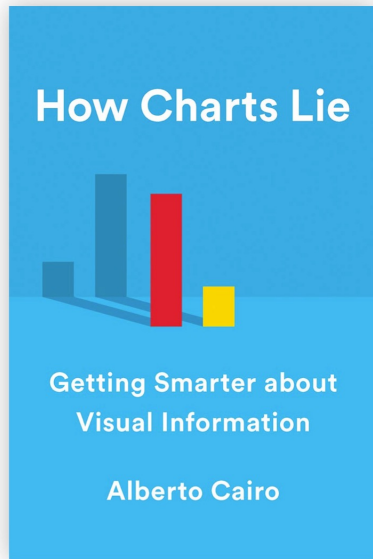
Thank You!!!



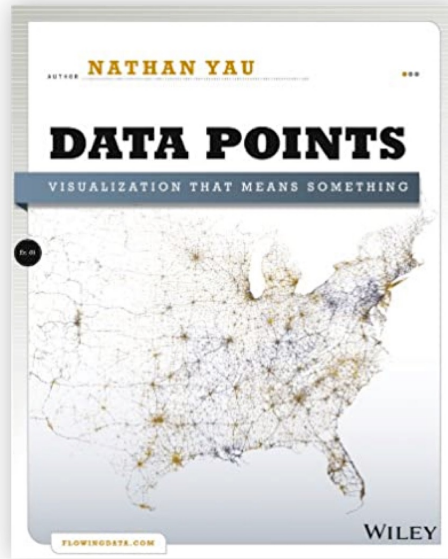
Matt Dzugan

@mattdzugan
mattdzugan.com
mattdzugan

Further Reading



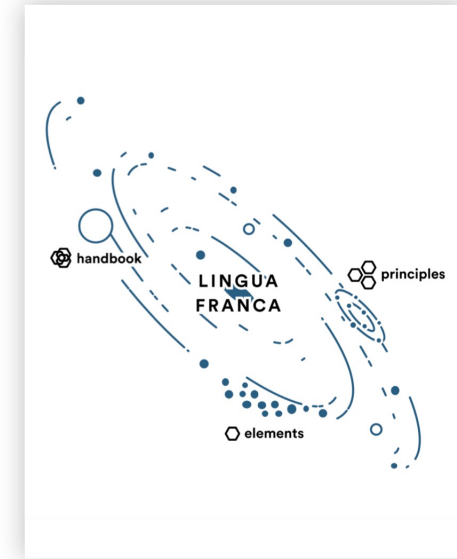
Targeted for a large audience, Cairo's book is meant to inform its readers how to spot BS and how to think critically about data and statistics in the media.



This book is like a much more exhaustive version of this presentation, it talks about a few core ideas and that illustrates them through LOTS of examples.



Essentially a textbook for learning D3, the field's powerhouse library for creating data-viz. This is the library used by all the Pros. If you want to make stuff that you see in the New York Times – this is the book to read.



This is a free web-book that is less about visualization than it is communication, especially around AI and data science.
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