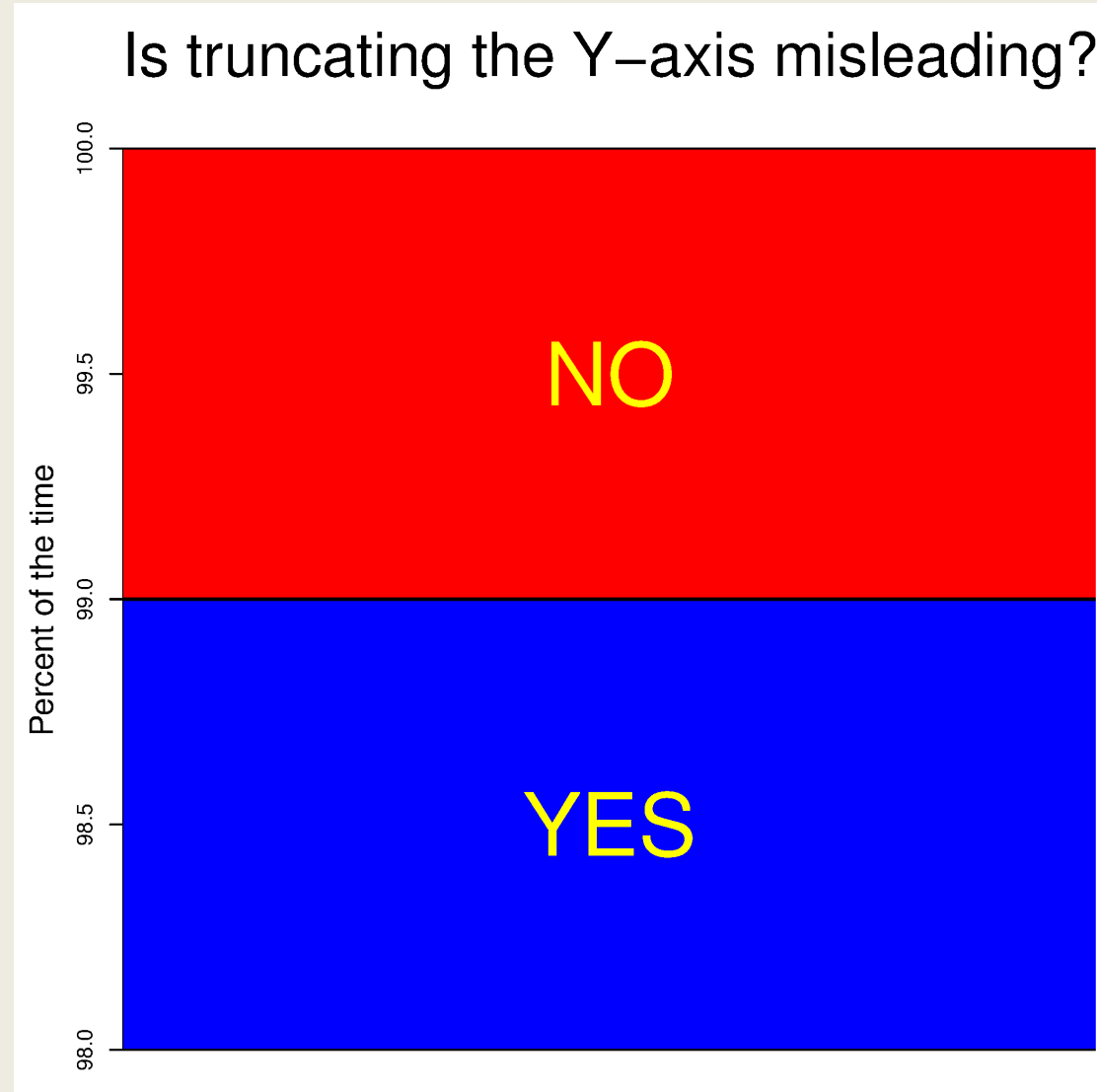


# Change over time



**Rubric test run**

**Final project**

**Replication**

**Change over time**

**PaRRRRty time!**

Rubric test run

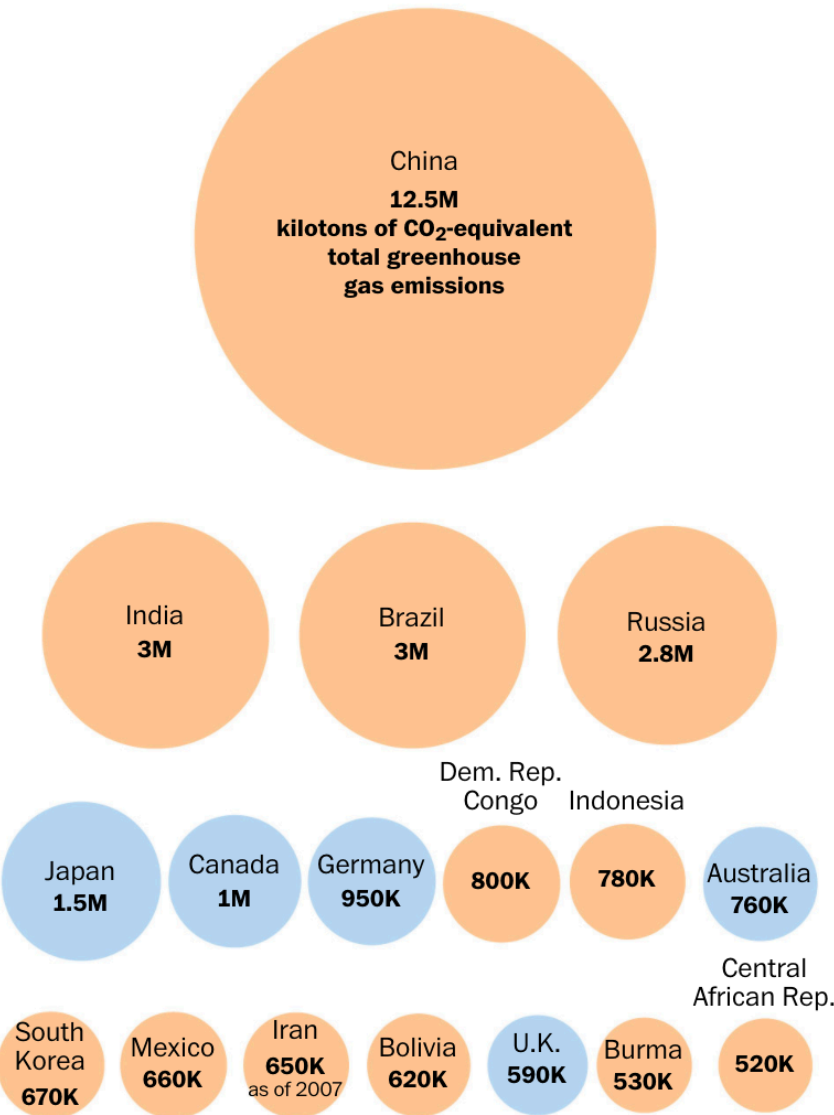
# Who's in and who's out of the Paris agreement, by total greenhouse gas emissions

● Developed country ● Developing country

## PART OF PARIS AGREEMENT

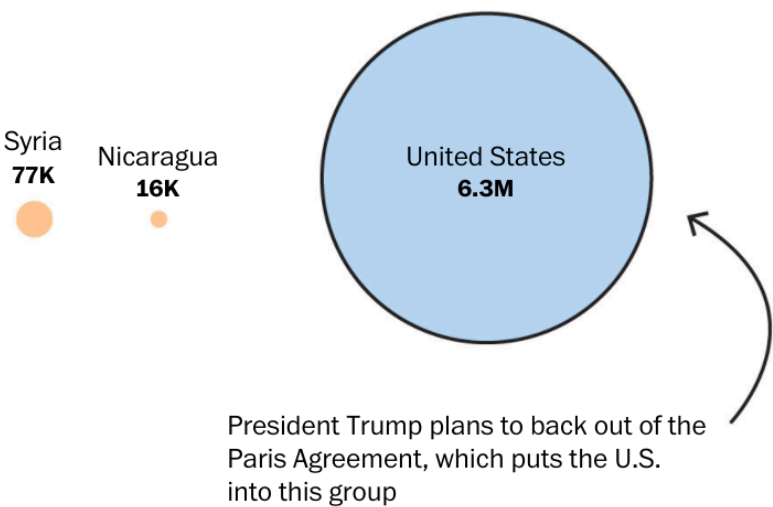
**194 parties**

192 countries + E.U. + Palestinian Authority

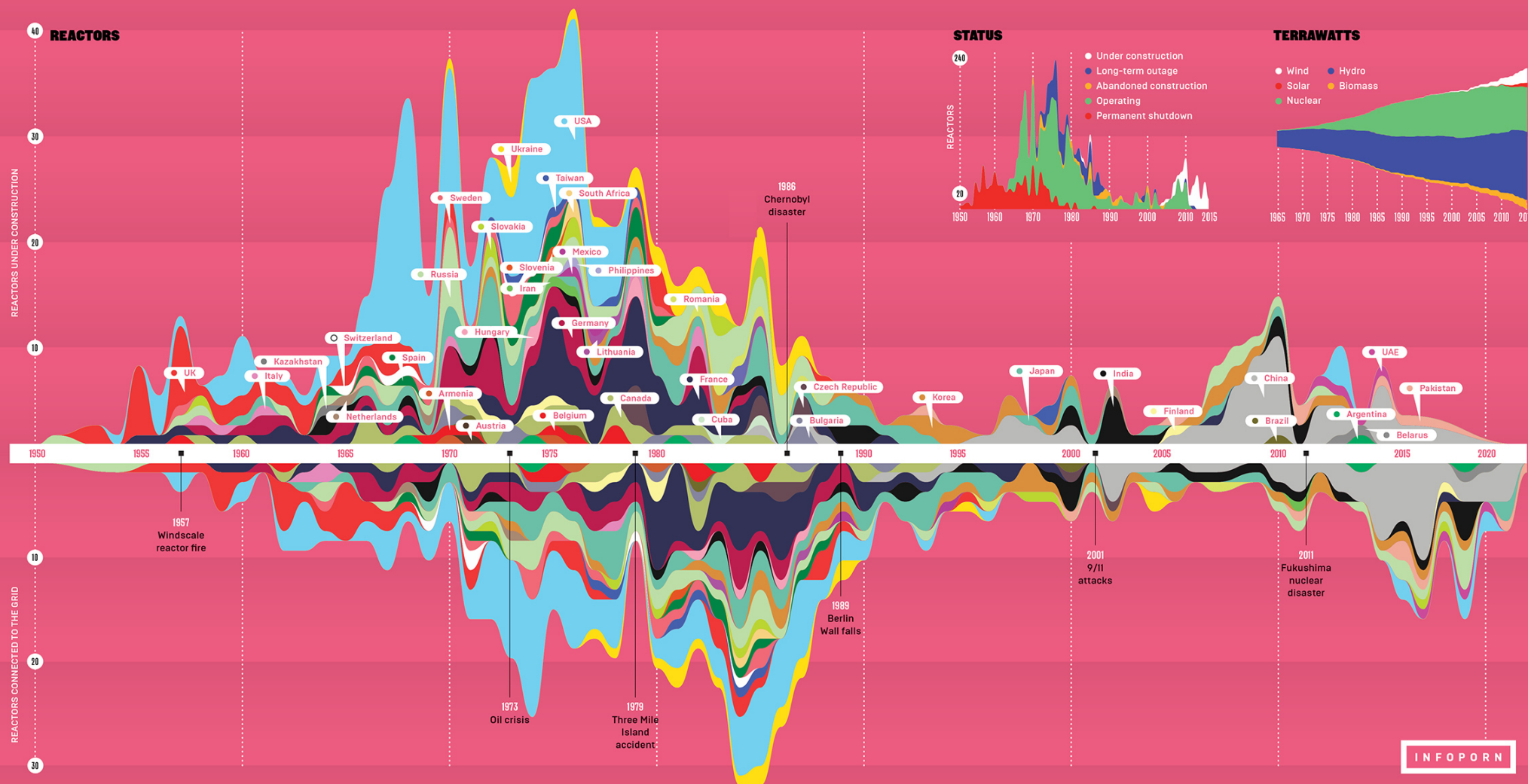


## NOT PART OF AGREEMENT

**3 countries**









**KANTAR**  
Information is Beautiful  
Awards

# Rubrics in final project

---

**50% = my rubric**

**50% = your rubric**

**Your rubric graded  
separately too**

# Final project

 Due in 15 days 

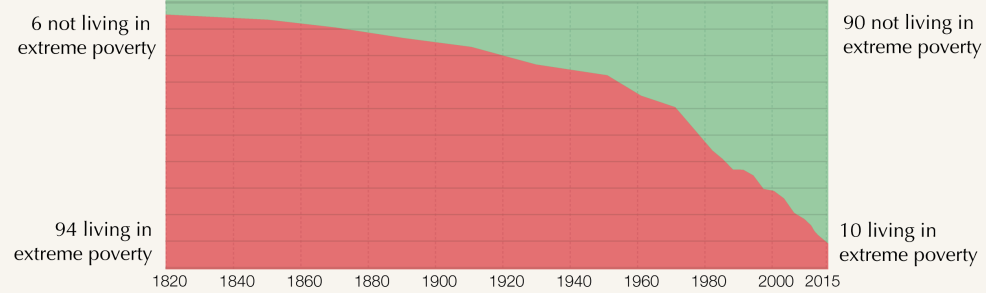
oh noes

---

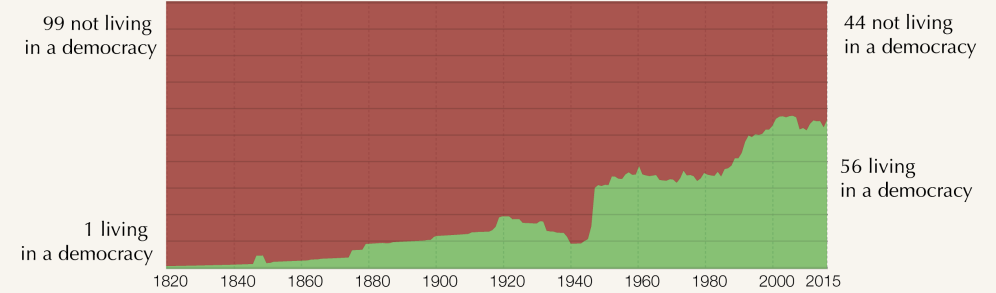


# The World as 100 People over the last two centuries

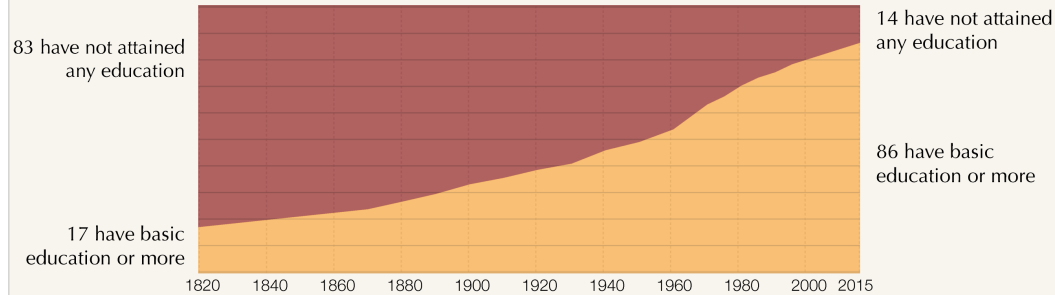
## Extreme Poverty



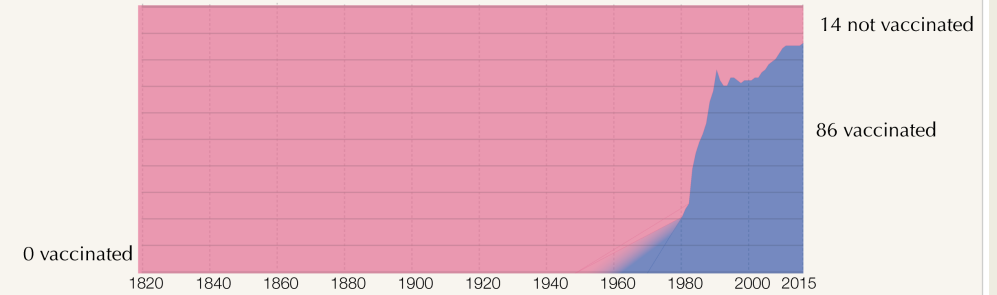
## Democracy



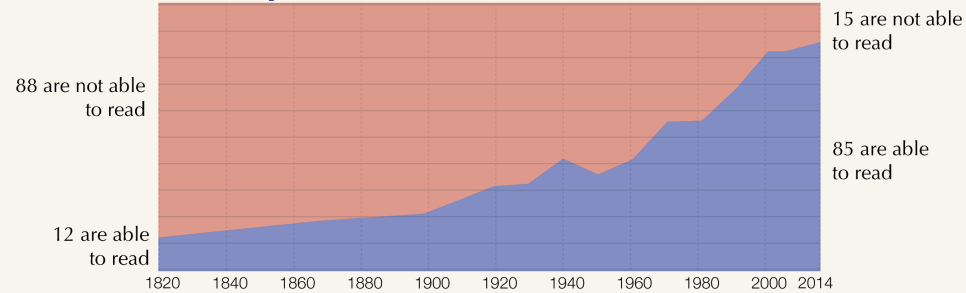
## Basic Education



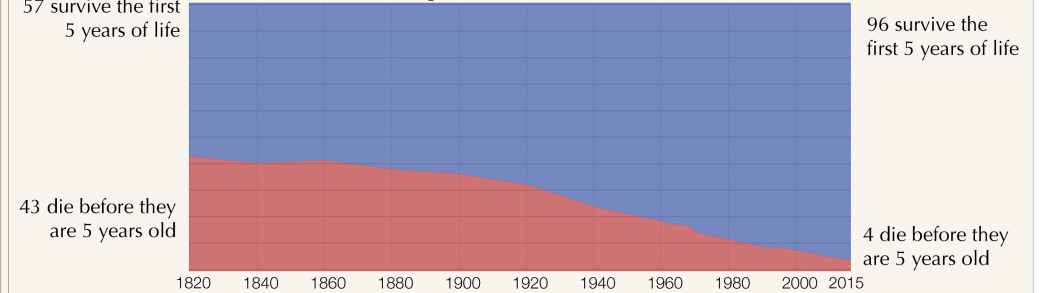
## Vaccination against diphtheria, pertussis (whooping cough), and tetanus



## Literacy



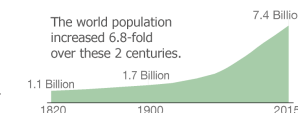
## Child Mortality



### Data sources:

Extreme Poverty: Bourguignon & Morrison (2002) up to 1970 – World Bank 1981 and later (2015 is a projection).  
Vaccination: WHO (Global data are available for 1980 to 2015 – the DPT3 vaccination was licenced in 1949)  
Education: OECD for the period 1820 to 1960. IIASA for the time thereafter.  
Literacy: OECD for the period 1820 to 1990. UNESCO for 2004 and later.

Democracy: Polity IV index (own calculation of global population share)  
Colonialism: Wimmer and Min (own calculation of global population share)  
Continent: HYDE database  
Child mortality: up to 1960 own calculations based on Gapminder; World Bank thereafter



All these visualizations are from [OurWorldInData.org](https://ourworldindata.org) an online publication that presents the empirical evidence on how the world is changing.

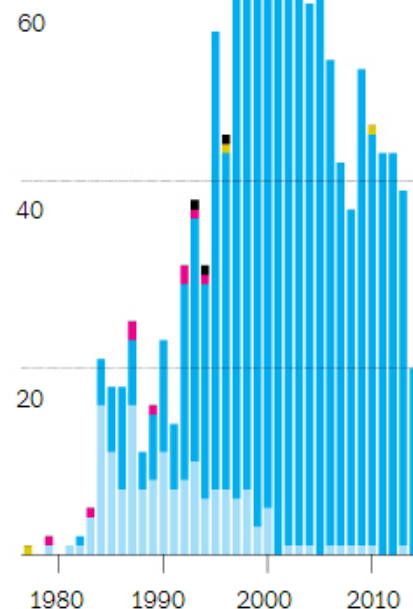


# Breaking down U.S. executions

## BY METHOD

Most common has been the lethal injection of one, two or three drugs, some of which are in short supply after European drugmakers stopped exports. Many appeals and stays have hinged on whether alternatives are reliable and humane.

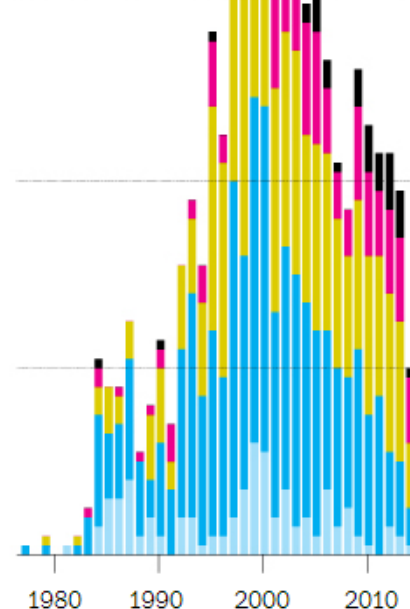
|               |       |
|---------------|-------|
| Electrocution | 158   |
| Injection     | 1,204 |
| Firing squad  | 3     |
| Gas chamber   | 11    |
| Hanging       | 3     |



## BY AGE

Age at the time of execution has ranged from 22 to 77. Twenty-two people were executed for crimes committed before they were 18. In 2005, the Supreme Court banned executions for crimes committed by juveniles.

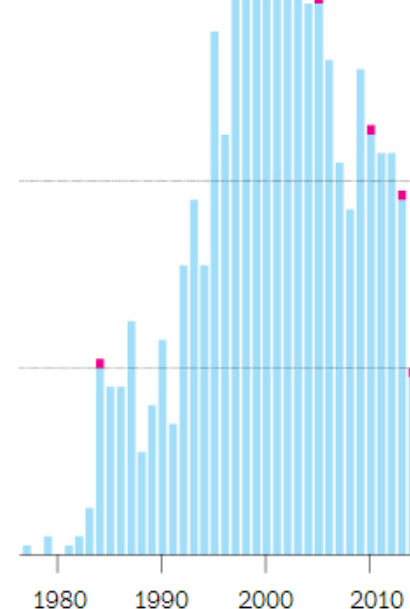
|      |     |
|------|-----|
| 20s  | 123 |
| 30s  | 547 |
| 40s  | 455 |
| 50s  | 195 |
| 60s+ | 59  |



## BY GENDER

Three women were executed in 2001, the most since the death penalty was reinstated. All were in Oklahoma: Wanda Jean Allen killed her girlfriend, Marilyn Plantz hired men to kill her husband, Lois Smith killed her son's ex-girlfriend.

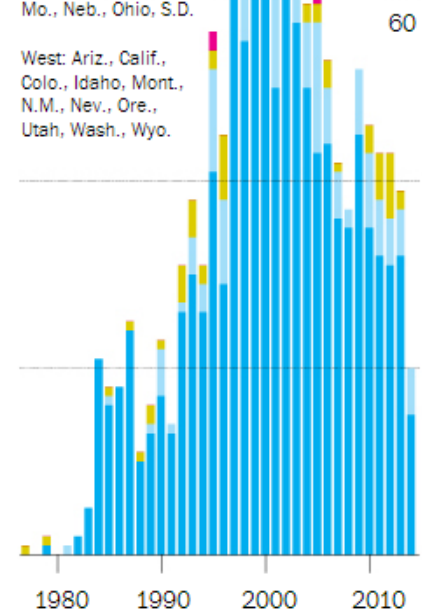
|       |       |
|-------|-------|
| Men   | 1,365 |
| Women | 14    |



## BY REGION

Texas (515), Oklahoma (111) and Virginia (110) have accounted for more than half of all U.S. executions. Colorado, Connecticut, New Mexico and Wyoming have executed one person each. The federal government has executed three.

|         |       |
|---------|-------|
| South   | 1,123 |
| Midwest | 165   |
| West    | 84    |
| North   | 4     |
| Federal | 3     |



South: Ala., Ark., Del., Fla., Ga., Ky., La., Md., Miss., N.C., Okla., S.C., Tenn., Texas, Va.

Midwest: Ill., Ind., Mo., Neb., Ohio, S.D.

West: Ariz., Calif., Colo., Idaho, Mont., N.M., Nev., Ore., Utah, Wash., Wyo.

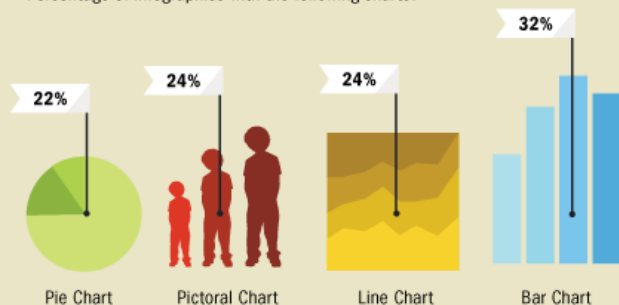
# INFOGRAPHIC OF INFOGRAPHICS

Data visualization is a popular new way of sharing research. Here is a look at some of the visual devices, informational elements, and general trends found in the modern day infographic.

## DESIGN

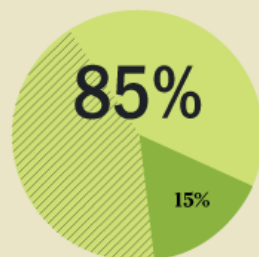
### CHART STYLE

Percentage of infographics with the following charts:



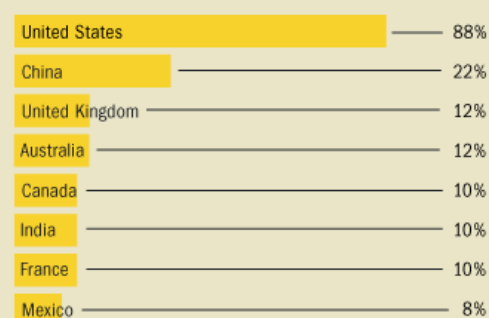
### FONT

■ Sans Serif ■ Condensed Sans Serif ■ Serif



## CONTENT

### COUNTRIES FEATURED



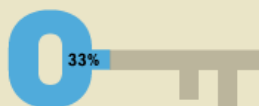
### THEME

Relative popularity of different infographic themes:



### KEY INFO

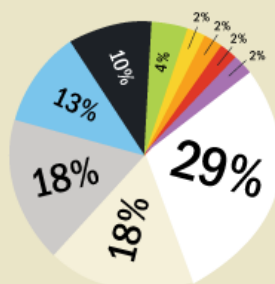
Percentage of infographics with key:



Average number of symbols per key: 5.1

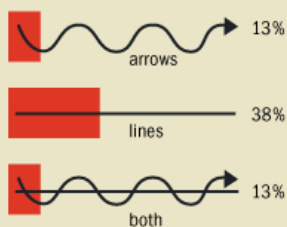


### BASE COLOR



### NAVIGATIONAL ICONOGRAPHY

Frequency of arrows & connecting lines in infographics:



### SECTIONS



### CREDITED SOURCES

Average number of sources per infographic: 2.29



### TITLE

Average number of words per infographic title: 4.36





# Replication, self-documentation, and sharing data

A cautionary tale

Growth in a Time of Debt  
Carmen M. Reinhart and Kenneth S. Rogoff  
NBER Working Paper No. 15639  
January 2010, Revised January 2010  
JEL No. E2,E3,E6,F3,F4,N10

### ABSTRACT

We study economic growth and inflation at different levels of government and external debt. Our analysis is based on new data on forty-four countries spanning about two hundred years. The dataset incorporates over 3,700 annual observations covering a wide range of political systems, institutions, exchange rate arrangements, and historic circumstances. Our main findings are: First, the relationship between government debt and real GDP growth is weak for debt/GDP ratios below a threshold of 90 percent of GDP. Above 90 percent, median growth rates fall by one percent, and average growth falls considerably more. We find that the threshold for public debt is similar in advanced and emerging economies. Second, emerging markets face lower thresholds for external debt (public and private)—which is usually denominated in a foreign currency. When external debt reaches 60 percent of GDP, annual growth declines by about two percent; for higher levels, growth rates are roughly cut in half. Third, there is no apparent contemporaneous link between inflation and public debt levels for the advanced countries as a group (some countries, such as the United States, have experienced higher inflation when debt/GDP is high). The story is entirely different for emerging markets, where inflation rises sharply as debt increases.

**Debt:GDP = 90%+ → -0.1% growth**

# THE PATH TO PROSPERITY

RESTORING AMERICA'S PROMISE

FISCAL YEAR 2012 BUDGET RESOLUTION

House Committee on the Budget  
Chairman Paul Ryan of Wisconsin

[budget.GOP.gov](http://budget.GOP.gov)



Finally, Ms. Reinhart and Mr. Rogoff allowed researchers at the University of Massachusetts to look at their original spreadsheet — and the mystery of the irreproducible results was solved. First, they omitted some data; second, they used unusual and highly questionable statistical procedures; and finally, yes, they made an Excel coding error. Correct these oddities and errors, and you get what other researchers have found: some correlation between high debt and slow growth, with no indication of which is causing which, but no sign at all of that 90 percent “threshold.”

Table 1. Real GDP Growth as the Level of Government Debt Varies:  
Selected Advanced Economies, 1790-2009  
(annual percent change)

| Country                               | Period    | Central (Federal) government debt/ GDP |                  |                  |                      |
|---------------------------------------|-----------|--|------------------|------------------|----------------------|
|                                       |           | Below 30 percent                       | 30 to 60 percent | 60 to 90 percent | 90 percent and above |
| Australia                             | 1902-2009 | 3.1                                    | 4.1              | 2.3              | 4.6                  |
| Austria                               | 1880-2009 | 4.3                                    | 3.0              | 2.3              | n.a.                 |
| Belgium                               | 1835-2009 | 3.0                                    | 2.6              | 2.1              | 3.3                  |
| Canada                                | 1925-2009 | 2.0                                    | 4.5              | 3.0              | 2.2                  |
| Denmark                               | 1880-2009 | 3.1                                    | 1.7              | 2.4              | n.a.                 |
| Finland                               | 1913-2009 | 3.2                                    | 3.0              | 4.3              | 1.9                  |
| France                                | 1880-2009 | 4.9                                    | 2.7              | 2.8              | 2.3                  |
| Germany                               | 1880-2009 | 3.6                                    | 0.9              | n.a.             | n.a.                 |
| Greece                                | 1884-2009 | 4.0                                    | <b>0.3</b>       | <b>4.8</b>       | 2.5                  |
| Ireland                               | 1949-2009 | 4.4                                    | 4.5              | 4.0              | 2.4                  |
| Italy                                 | 1880-2009 | <b>5.4</b>                             | <b>4.9</b>       | 1.9              | 0.7                  |
| Japan                                 | 1885-2009 | 4.9                                    | 3.7              | 3.9              | 0.7                  |
| Netherlands                           | 1880-2009 | 4.0                                    | 2.8              | 2.4              | 2.0                  |
| New Zealand                           | 1932-2009 | 2.5                                    | 2.9              | 3.9              | <b>3.6</b>           |
| Norway                                | 1880-2009 | 2.9                                    | 4.4              | n.a.             | n.a.                 |
| Portugal                              | 1851-2009 | 4.8                                    | 2.5              | 1.4              | n.a.                 |
| Spain                                 | 1850-2009 | <b>1.6</b>                             | 3.3              | <b>1.3</b>       | 2.2                  |
| Sweden                                | 1880-2009 | 2.9                                    | 2.9              | 2.7              | n.a.                 |
| United Kingdom                        | 1830-2009 | 2.5                                    | 2.2              | 2.1              | 1.8                  |
| United States                         | 1790-2009 | 4.0                                    | 3.4              | 3.3              | <b>-1.8</b>          |
| Average                               |           | <b>3.7</b>                             | <b>3.0</b>       | <b>3.4</b>       | <b>1.7</b>           |
| Median                                |           | <b>3.9</b>                             | <b>3.1</b>       | <b>2.8</b>       | <b>1.9</b>           |
| Number of observations = <b>2,317</b> |           | 866                                    | 654              | 445              | 352                  |

**Debt:GDP = 90%+ → 2.2% growth**

**Don't touch the raw data**

But you can use `write_csv()`

**Use self-documenting code**

R Markdown!

**Ensure code is reproducible**

R Markdown!

**Use open formats**

.csv; not .xlsx, .dta, .dat, etc.

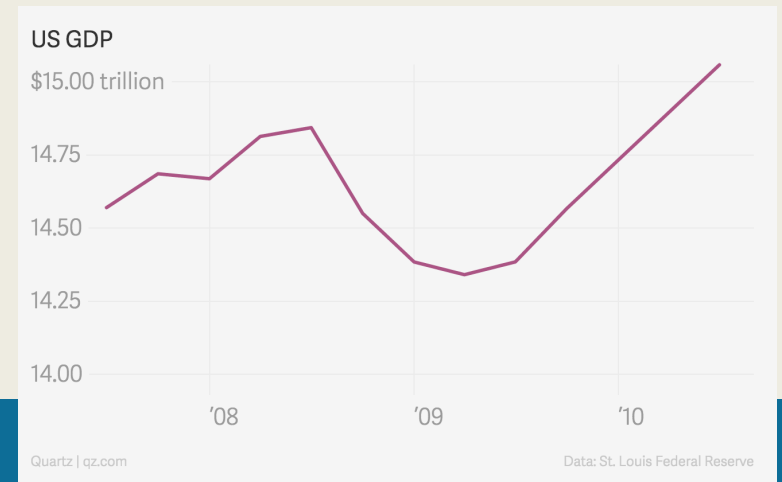
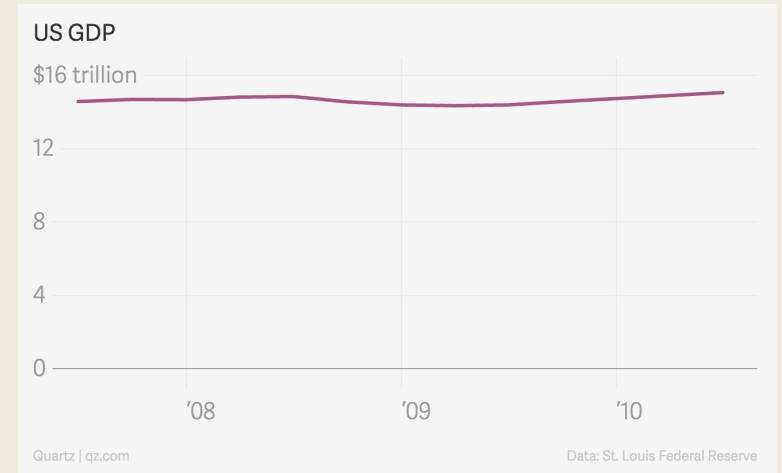
# Change over time





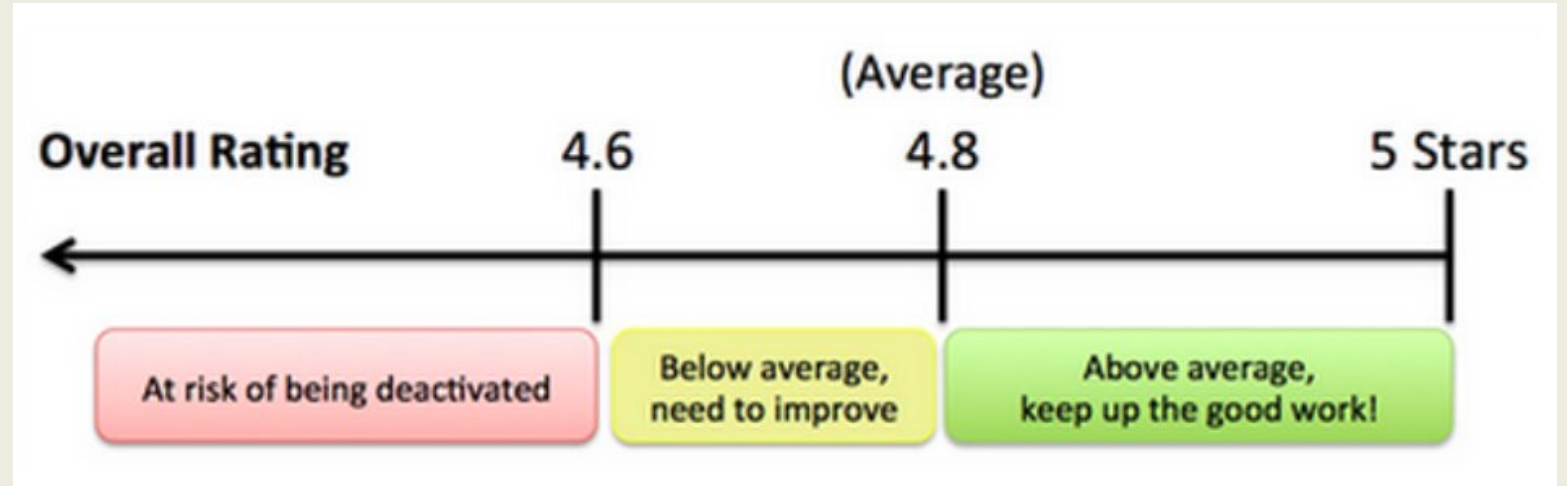
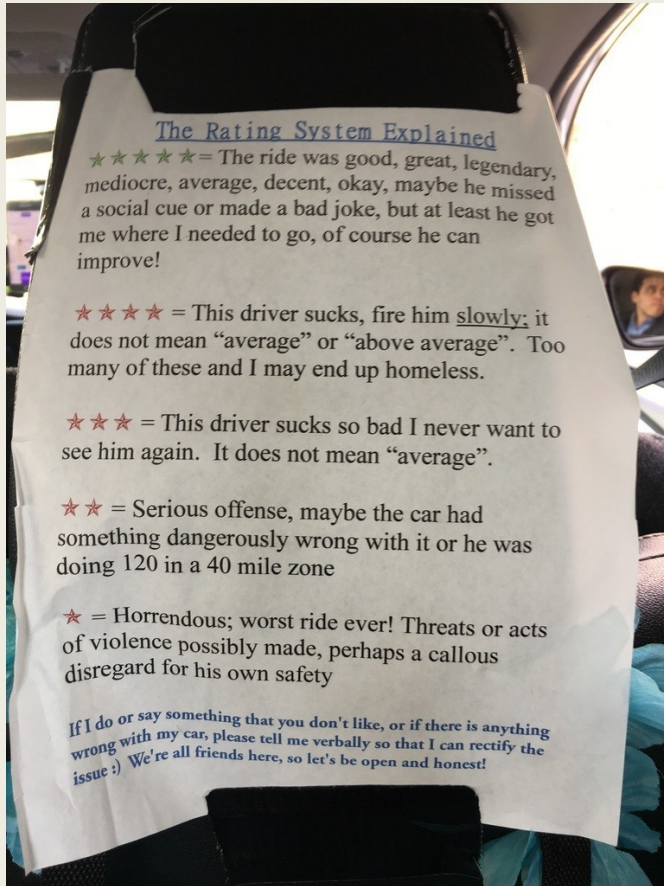
# When is it okay to truncate the y-axis?

**When small movements matter**





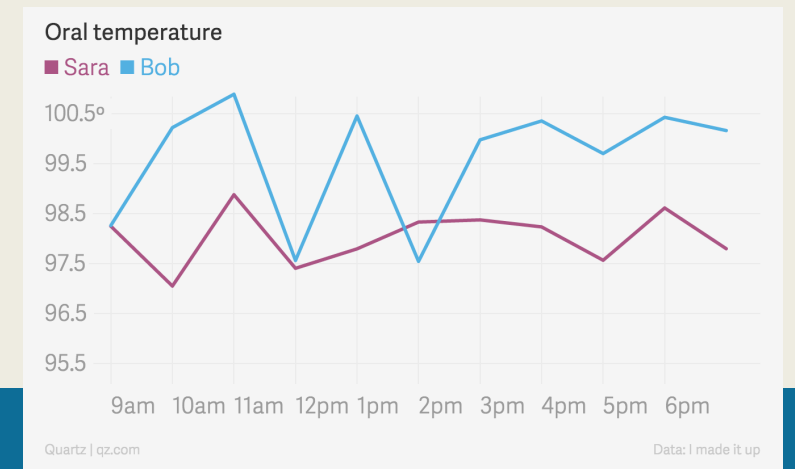
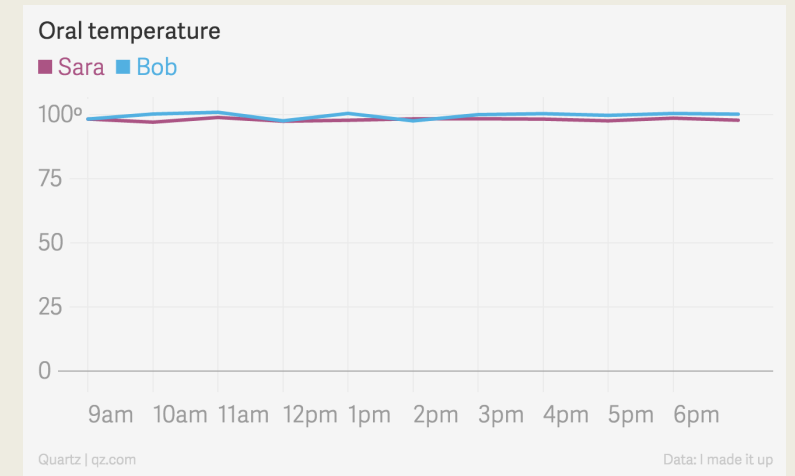
# Scale distortion



# When is it okay to truncate the y-axis?

**When small movements matter**

**When zero values are impossible**

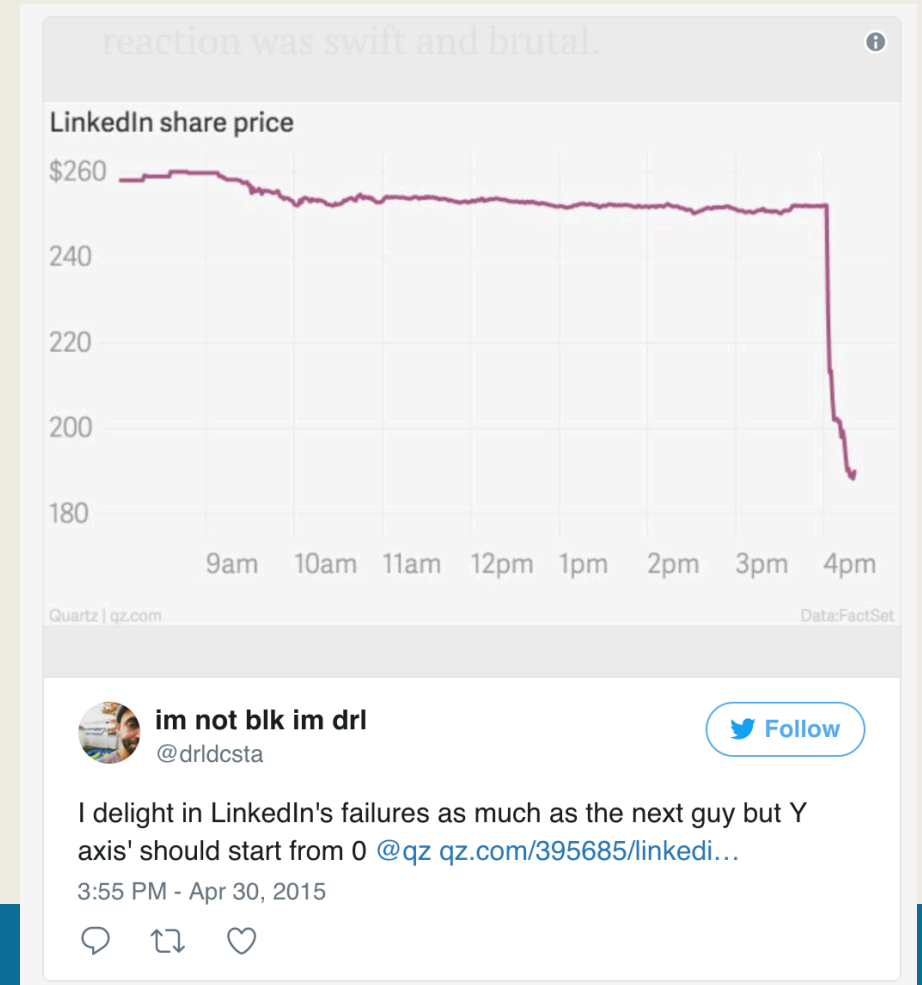


# When is it okay to truncate the y-axis?

When small movements matter

When zero values are impossible

When it's normal



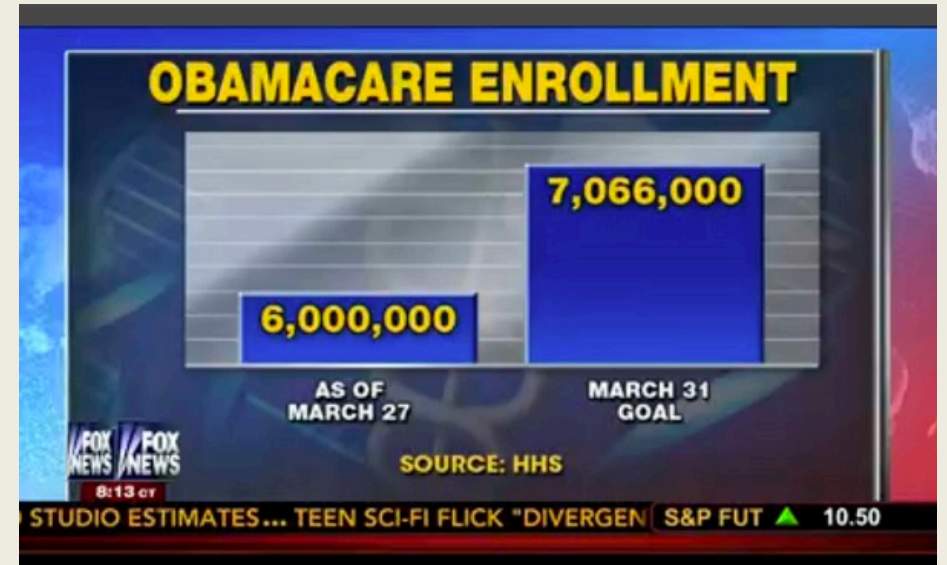
# When is it okay to truncate the y-axis?

When small movements matter

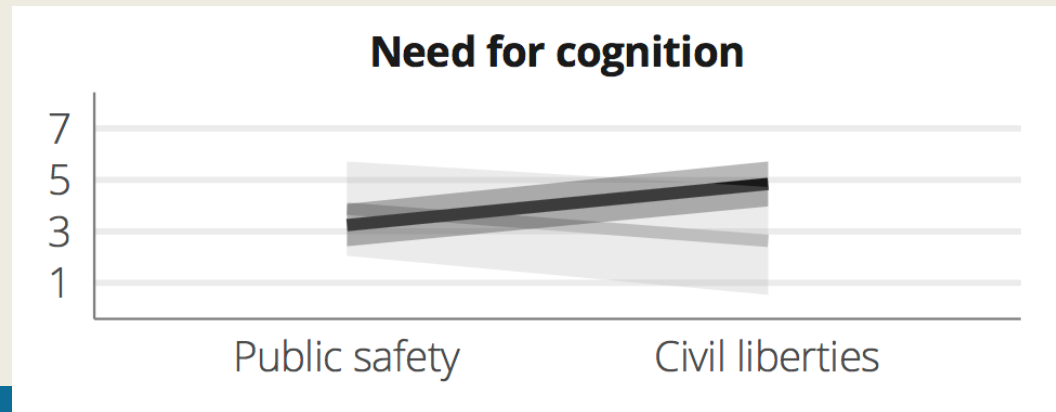
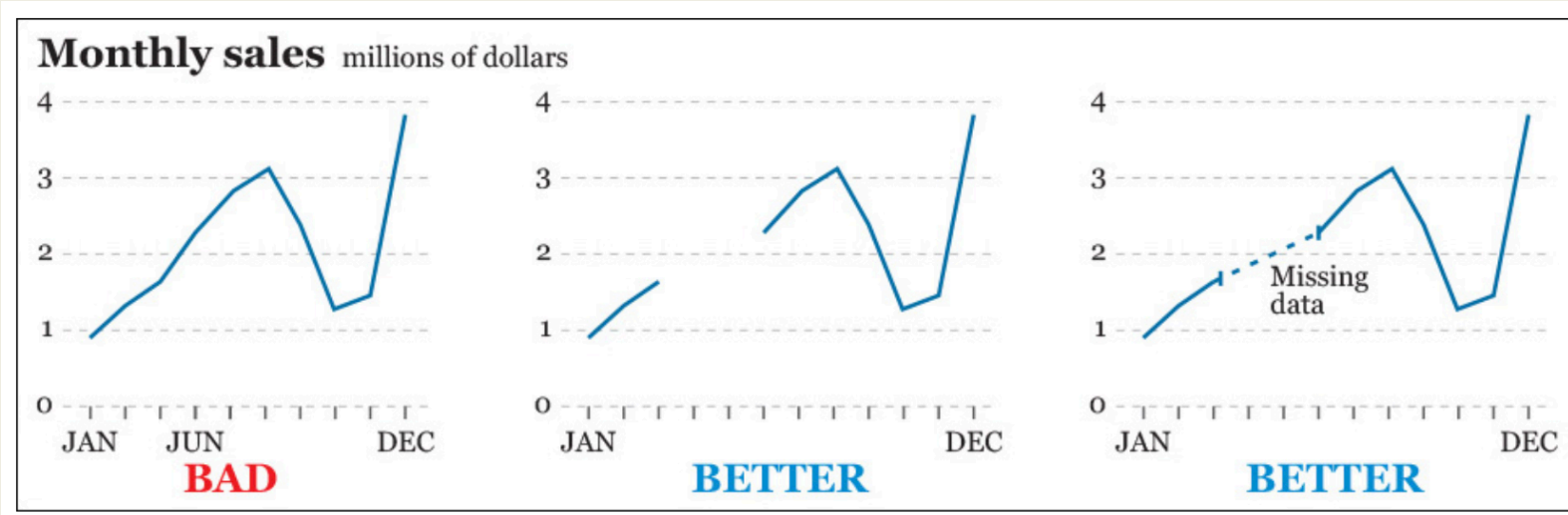
When zero values are impossible

When it's normal

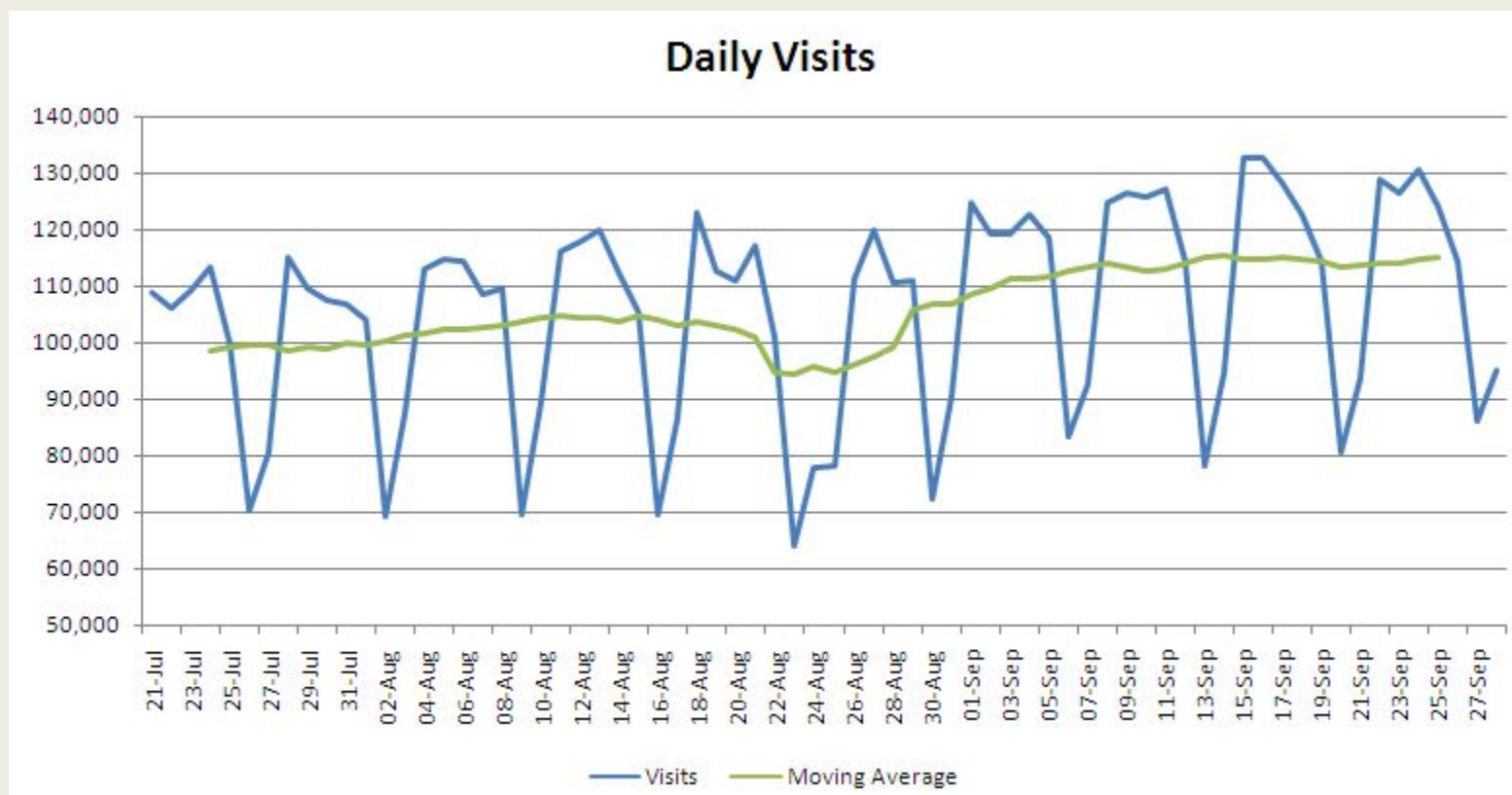
Never on bar charts



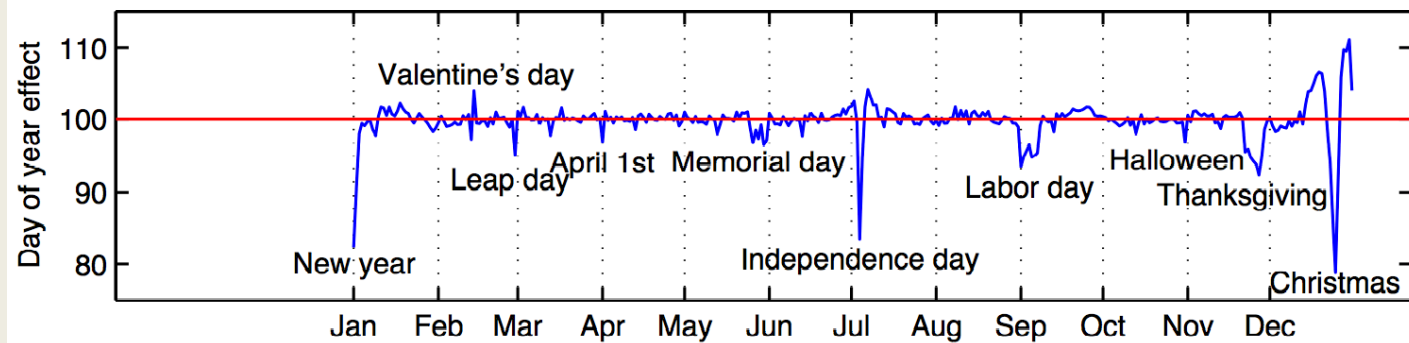
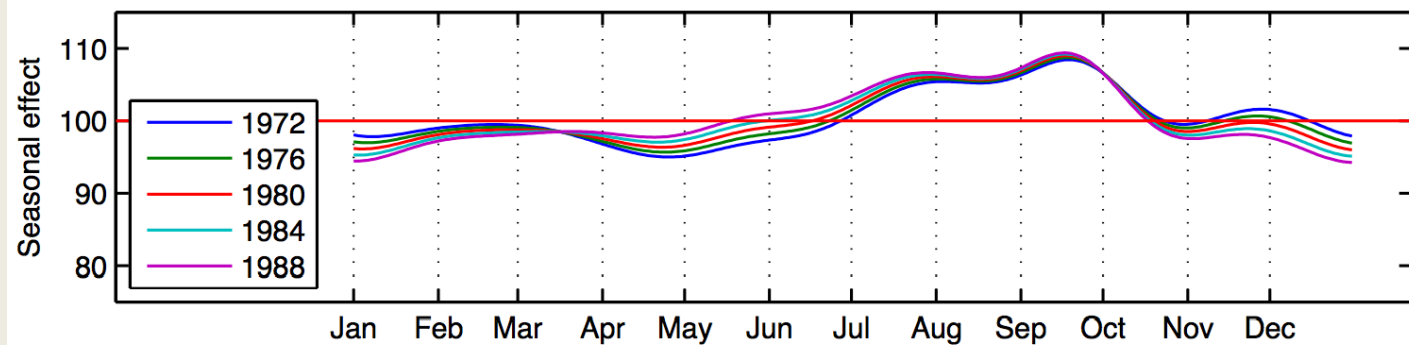
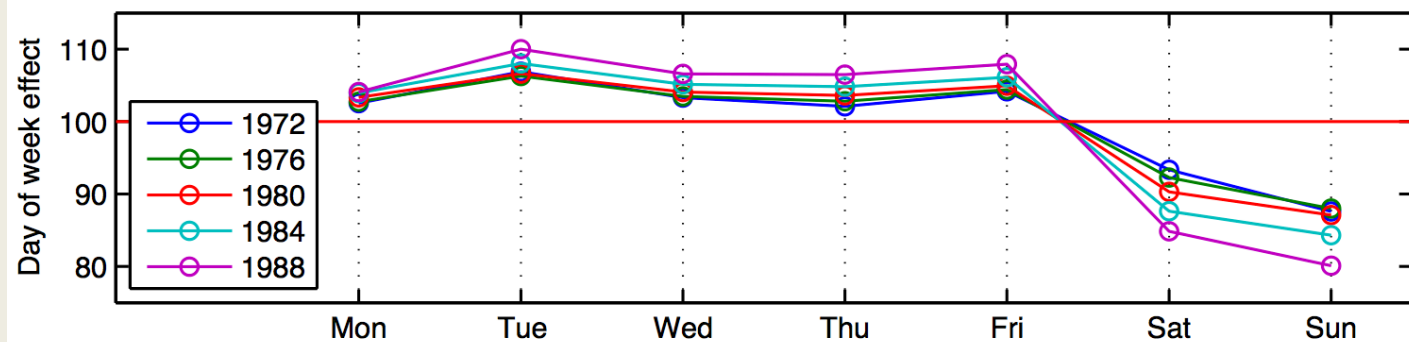
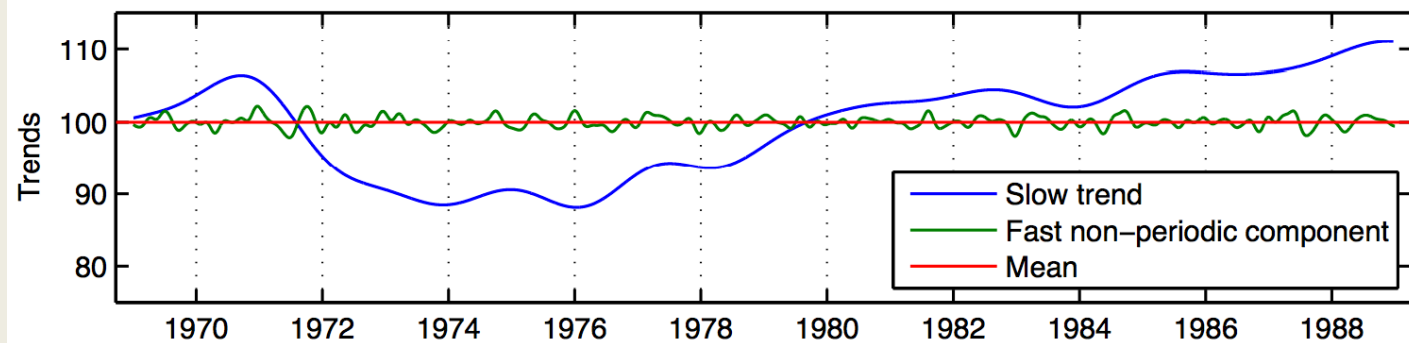
# x-axis issues



# Seasonality



Relative Number of Births

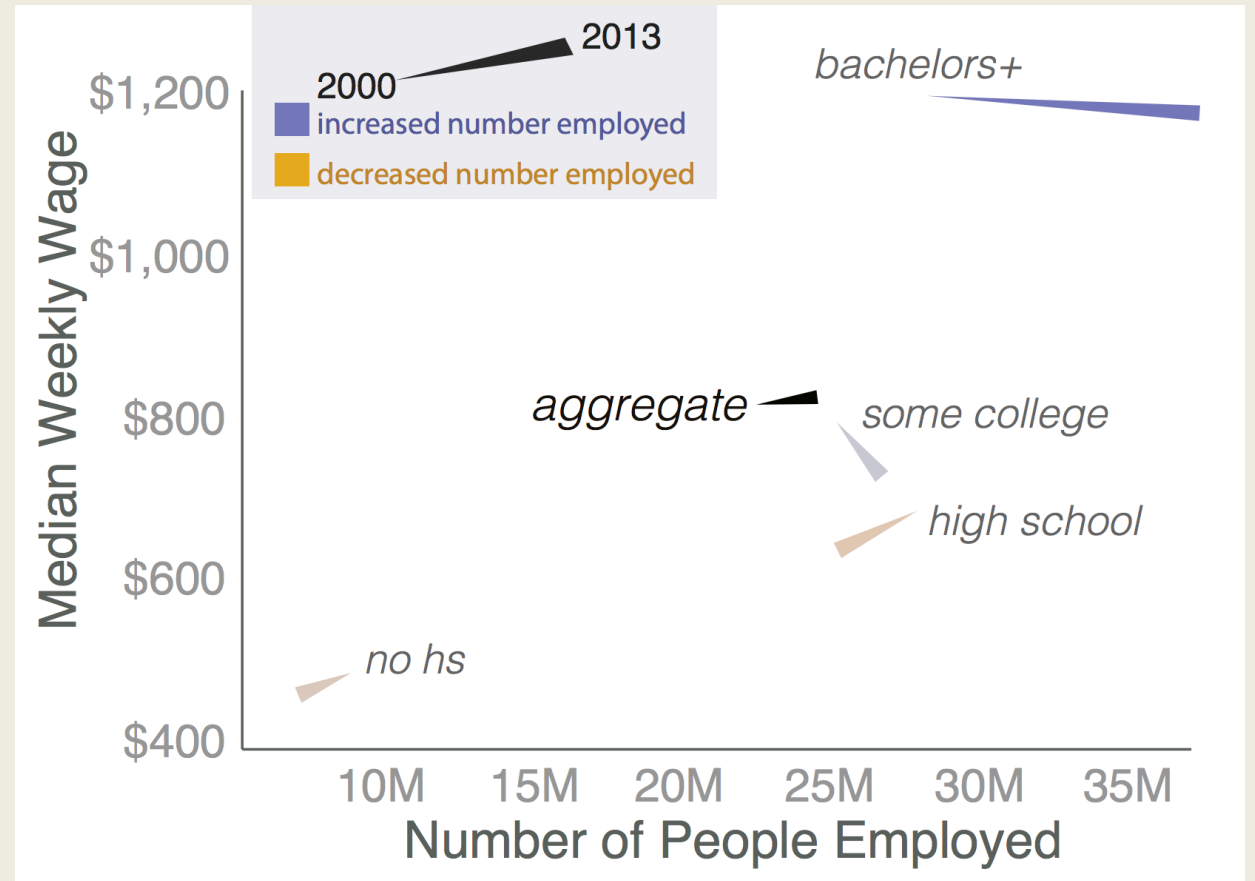




# Simpson's Paradox

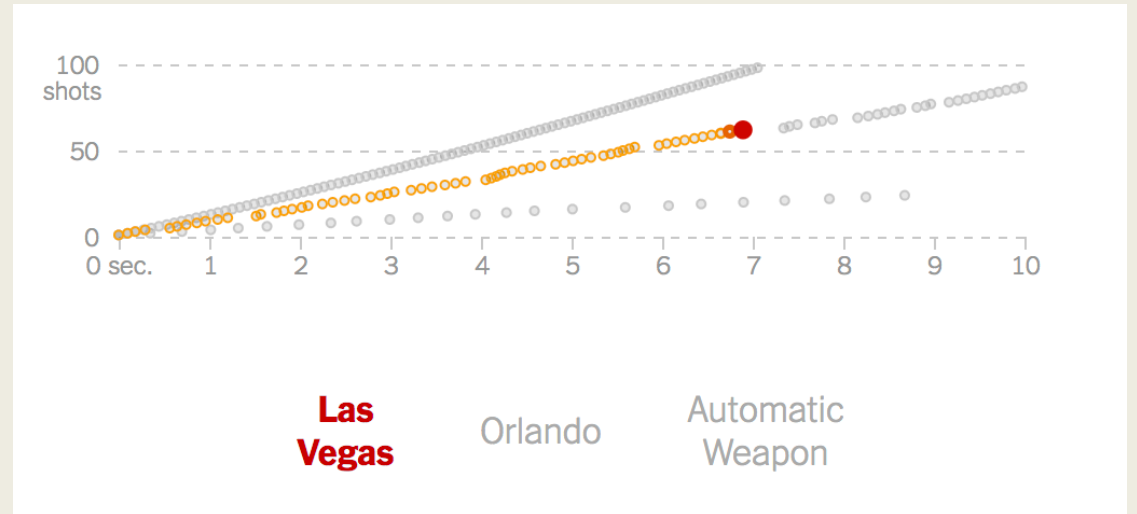
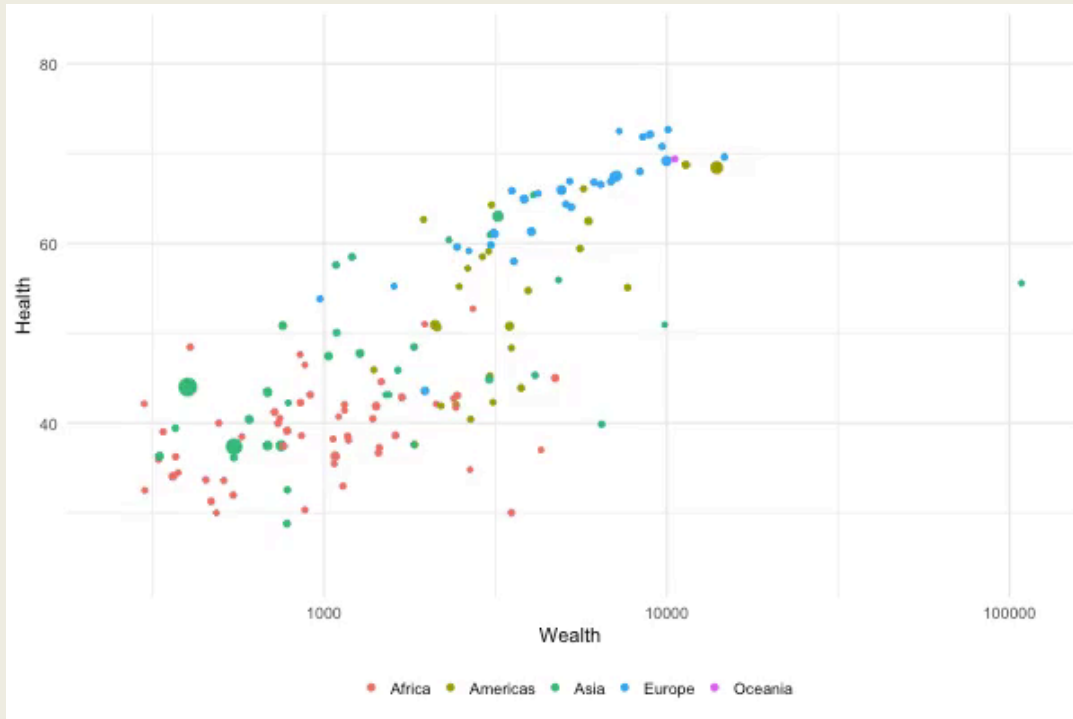


|              | Treatment A              | Treatment B              |
|--------------|--------------------------|--------------------------|
| Small stones | Group 1<br>93% (81/87)   | Group 2<br>87% (234/270) |
| Large stones | Group 3<br>73% (192/263) | Group 4<br>69% (55/80)   |
| Both         | 78% (273/350)            | 83% (289/350)            |





# Extra dimensions



**“Nine Rounds a Second: How the Las Vegas Gunman Outfitted a Rifle to Fire Faster,” *New York Times*, October 5, 2017**

 PaRRRty time! 

**Sarah Bingham**

**Stephanie Dossena**

**Alexander Zeller**

**Christopher Law**

**John Morgan**

**Whitney Royal**

**Natalia Brown**

**Nathan Eyring**

**Dan Sisco**

**Rich Kuchinsky**

**Konner Glick**

**Jordan Hunter**

**Jill Piacitelli**

**Jacob Fullmer**

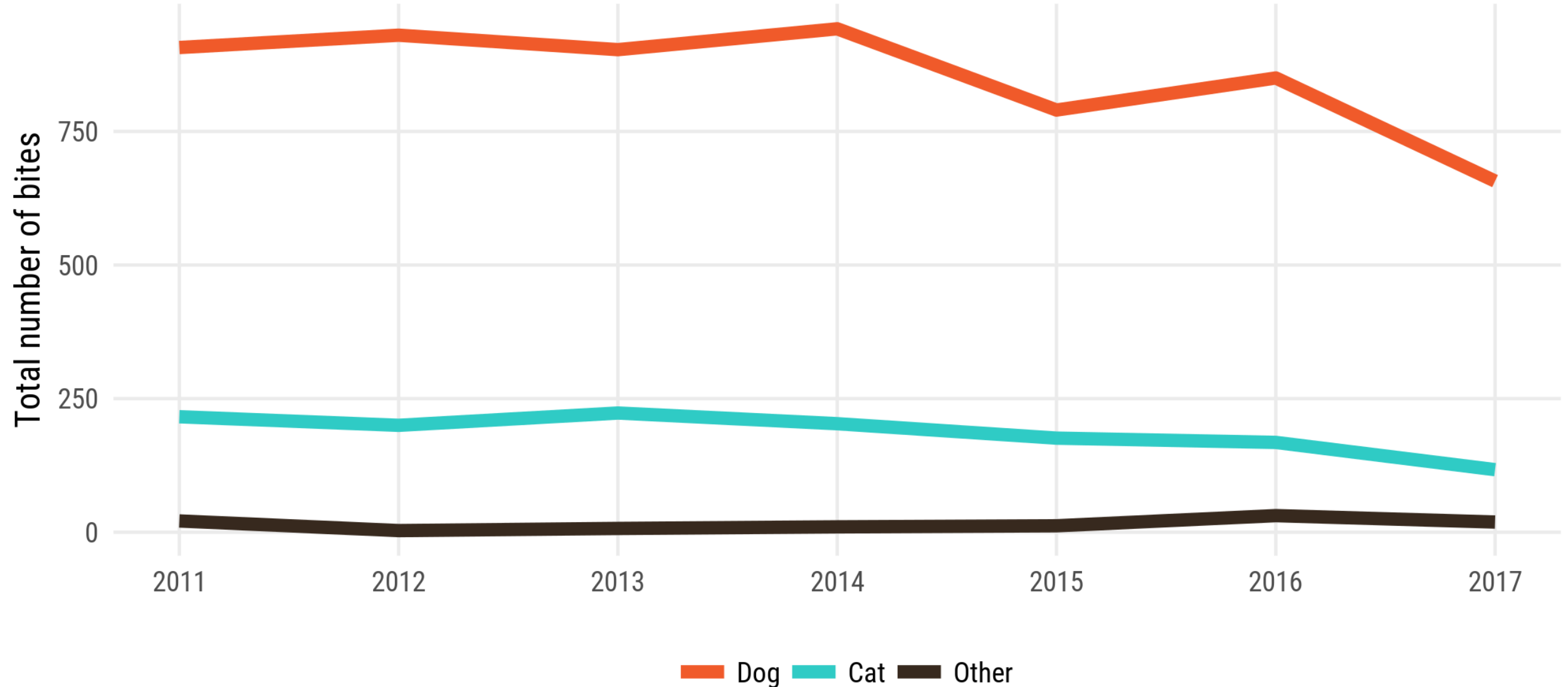
**Peter Hall**

**Victor Obiri**

**James Sinkovic**

# Is the Louisville canine rampage over?

Total number of reported animal bites per year



Source: Louisville Metro Department of Public Health and Wellness