



INTRO TO DATA JOURNALISM

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Athens, 1 December 2023

Founding Donor

ΙΣΝ / SNF

ΙΔΡΥΜΑ ΣΤΑΥΡΟΣ ΝΙΑΡΧΟΣ
STAVROS NIARCHOS FOUNDATION

***Special thanks to my colleague
Thanasis Troboukis for contributing
to this presentation.***

WHAT IS DATA & DATA JOURNALISM

data

noun [U or plural]

UK  /'deɪtə/ US 



information, especially facts or numbers, collected to be examined and considered and used to help with

~~making decisions:~~ → *telling stories*

[Cambridge Dictionary](#)

DATA TYPES & FORMATS

STRUCTURED (.csv, .xlsx files, databases)

Afghanistan	Asia	663	54.863	22850
Albania	Europe	4195	74.200	3070
Algeria	Africa	5098	68.963	30530
Angola	Africa	2446	45.234	13920
Antigua and Barbuda	N. America	12738	73.544	710
Argentina	S. America	10571	73.822	36930
Armenia	Europe	2114	71.494	3070
Australia	Oceania	29241	79.930	19160
Austria	Europe	32008	78.330	8000
Azerbaijan	Europe	2533	66.851	8110
Bahamas	N. America	22728	72.370	290
Bahrain	Asia	22015	74.497	630
Bangladesh	Asia	1075	65.309	12950
Barbados	N. America	14982	73.118	260
Belarus	Europe	5936	68.990	10050
Belgium	Europe	29940	77.910	10170

SEMI-STRUCTURED (.json files, HTML)

```
{  
  "Continent": "Europe",  
  "Country": "Greece",  
  "Population": "11000000",  
  "Region": "Southeast"  
}
```

UNSTRUCTURED (text files, audio, video)



PRINCIPLES OF OPEN DATA

1. PUBLIC
2. MACHINE READABLE
3. LICENSED
4. FREE OF CHARGE

Picture: Marker Wizards, available on [Helsinki Region Infoshare](#)



COMMON CASES OF LOOKING LIKE THEY ARE OPEN. BUT THEY AREN'T.

1

Preprocessed figures found in press releases, emails and/or other documents communicated to journalists

2

Data enclosed in .pdf files uploaded on the Internet

3

Unstructured data found on websites (.html pages), especially when no permission of reuse is given

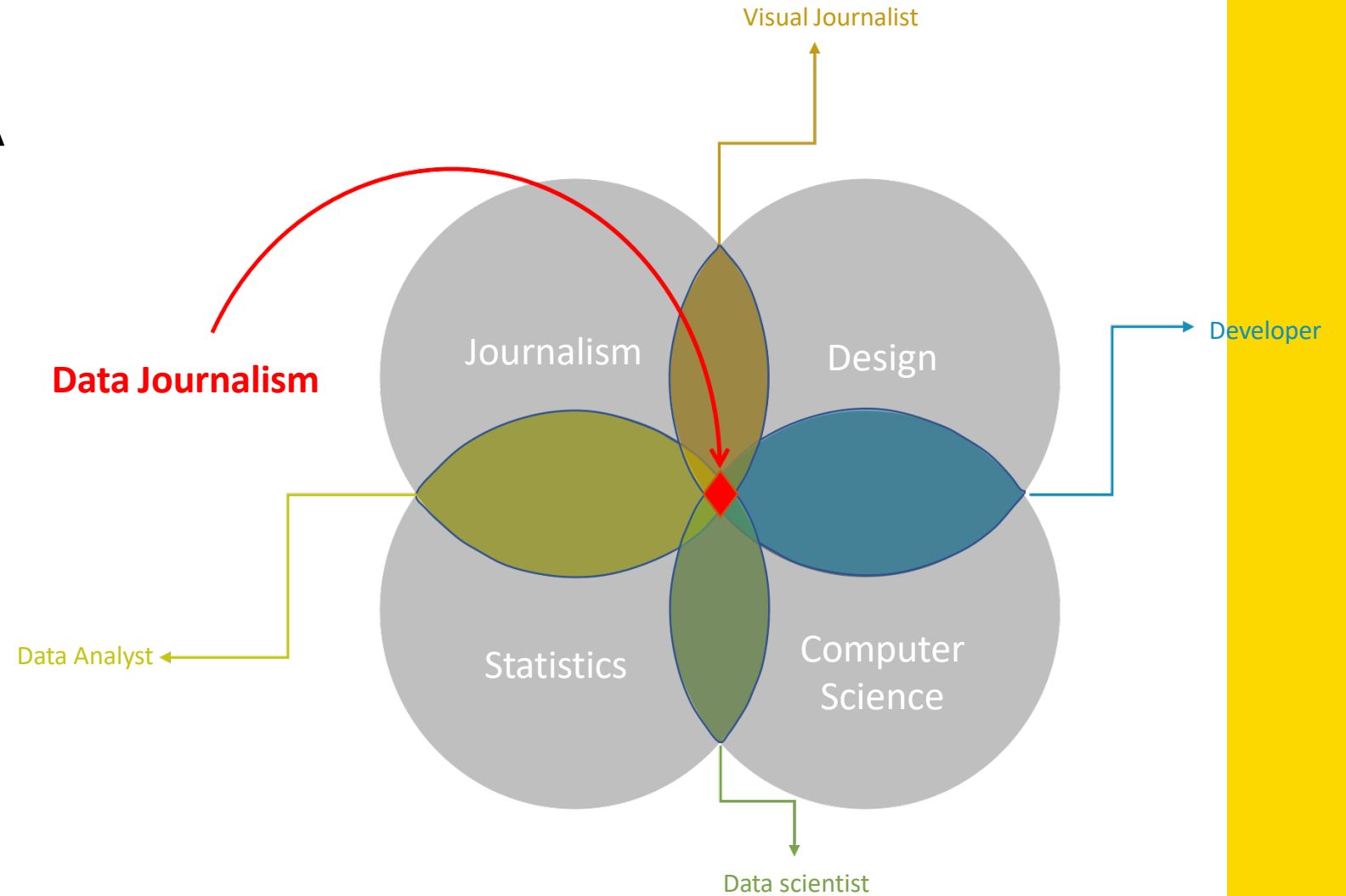
4

Unconsistently maintained and/or undocumented data

WHAT IS DATA JOURNALISM

“ What was once a garage band has now grown big enough to make up an orchestra.

Sarah Cohen (2021),
[Ways of Doing Data Journalism](#)



DATA JOURNALISM IS NOT THAT NEW

1855

One of the most influential urban medical maps of the 19th century, by John Snow. His essay showed the spread of cholera in Soho, London.

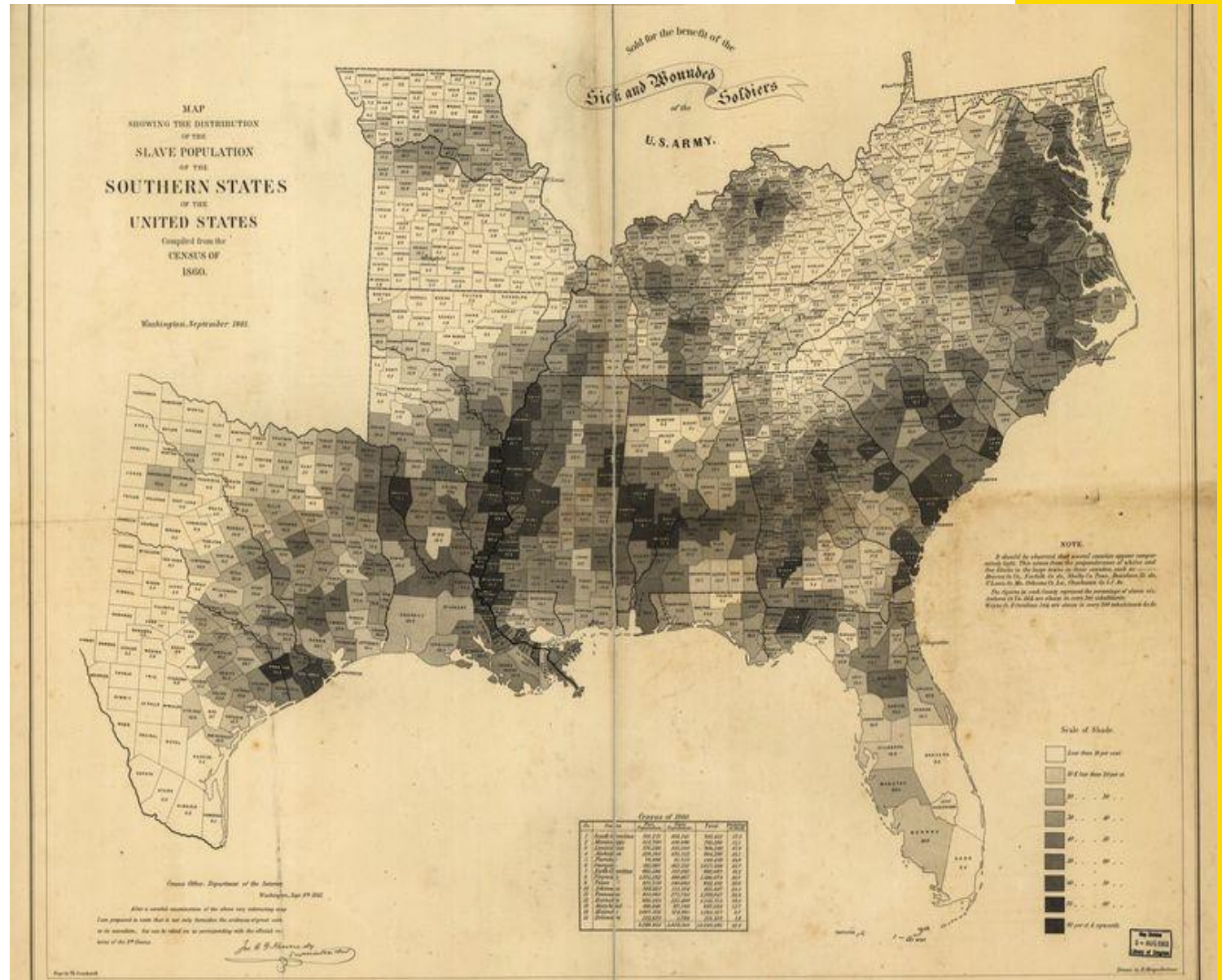


[British Library](#)

DATA JOURNALISM IS NOT THAT NEW

1860

A choropleth map showing the distribution of the slave population in the southern states of the United States of America.



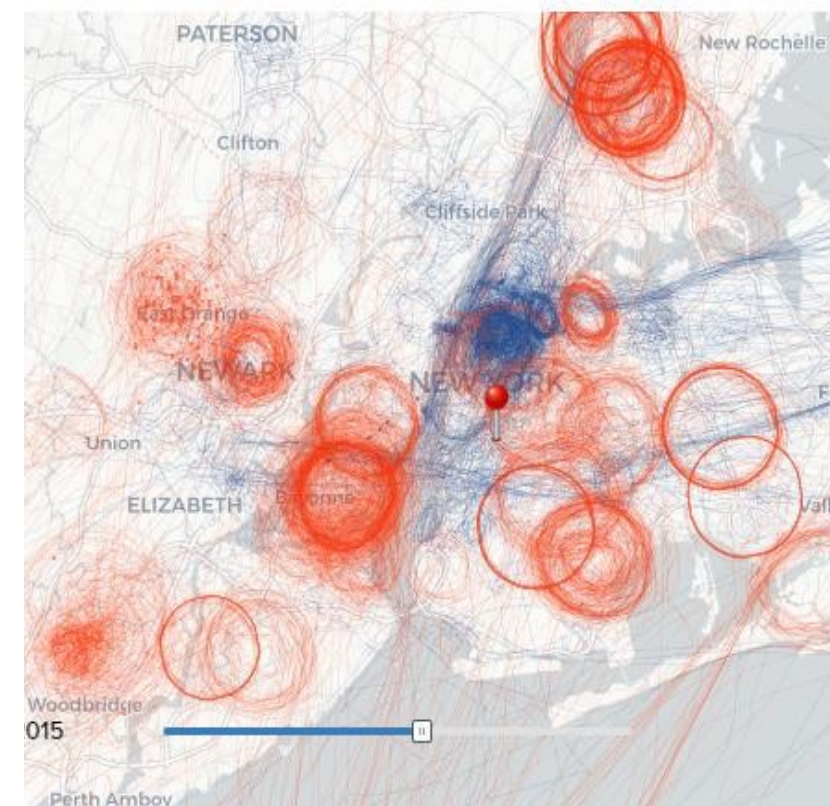
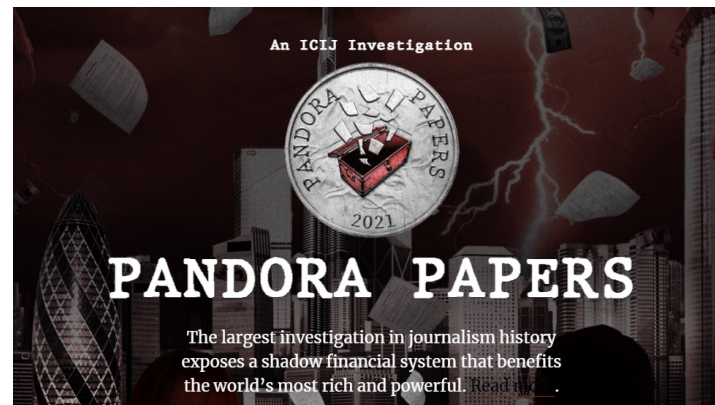
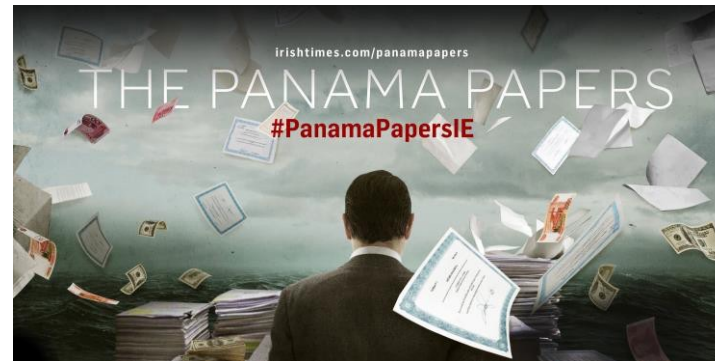
Library of Congress, Geography and Map Division

WHY WE NEED DATA JOURNALISM

“ When information was scarce, most of our efforts were devoted to hunting. Now that information is abundant, processing is more important.

*Philip Meyer, Journalist
datajournalism.com*

Data analysis, processing and visualization can expose patterns hidden beyond what eyes can see. This can lead to important stories for the public interest.



Spies in the Skies, [Buzzfeed News](#)

DATA JOURNALISTS' SKILLSET & WORKFLOW

THE SKILLSET OF A DATA JOURNALIST

Background knowledge

- Fact-checking
- Reporting
- Research/Investigation experience

Tech skills

- Command of spreadsheet-related softwares (Excel, Google Sheets, Open Office etc)
- Coding skills/ Use of a programming language (Python, R etc)
- Basic HTML
- Ability to learn quickly how to use new tools

Math-related skills

- Descriptive & Comparative Statistics
- Understand concepts of Predictive Statistics and Algorithms to collaborate with data-scientists

Interpersonal competencies

- Love for detail
- High frustration tolerance
- Problem solver attitude
- Team player!

THE DATA JOURNALISM WORKFLOW




0. RESEARCH QUESTIONS

- Define the research hypothesis you need to confirm or reject.
- Write down specific questions you need to answer on your way to prove or disapprove your general idea.
- Know exactly what you are looking for, so that you can ask your data the proper questions once you get them.

1. DATA COLLECTION

- Find structured and machine-readable data available to download on online repositories/databases.
- Scrape the web / Extract data from .pdf and other text files published.
- Use an API service available to request data.
- Make a data request to relevant institutions, public bodies and/or third-party partners.

ONLINE OFFICIAL DATA REPOSITORIES



Ελληνική Στατιστική Αρχή

ΕΛΣΤΑΤ | Στατιστικές | Μητρώα και Ταξινομήσεις

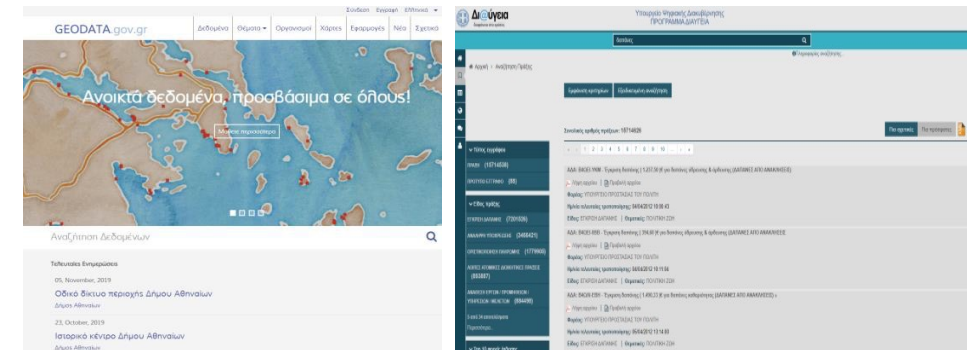
/ Πληθυσμός και Κοινωνικές Συνθήκες /



eurostat
Your key to European statistics

News | Data

European Commission > Eurostat > Data > Database

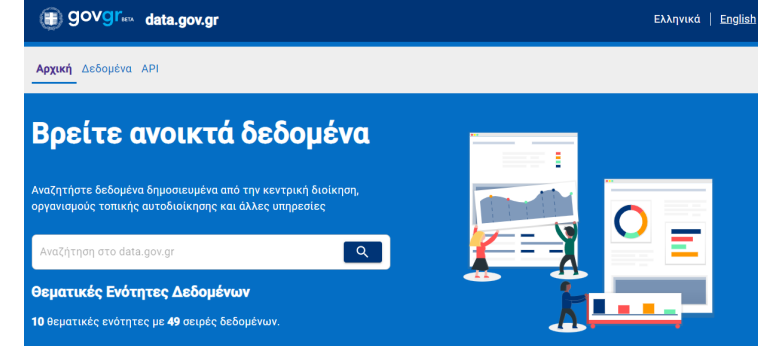


GEODATA.gov.gr

Ανοικτά δεδομένα, προσβάσιμα σε όλους!

Ανεξήγητα Δεδομένα

Τελευταία Ενημερώσεις



govgr data.gov.gr

Ελληνικά | English

Αρχική | Δεδομένα | API

Βρείτε ανοικτά δεδομένα

Αναζητήστε δεδομένα δημοσιευμένα από την κεντρική διοίκηση, οργανισμούς τοπικής αυτοδιοίκησης και άλλες υπηρεσίες

Αναζήτηση στο data.gov.gr

Θεματικές Ενότητες Δεδομένων

10 θεματικές ενότητες με 49 σειρές δεδομένων.



World Bank Open Data

Free and open access to global development data

GDP

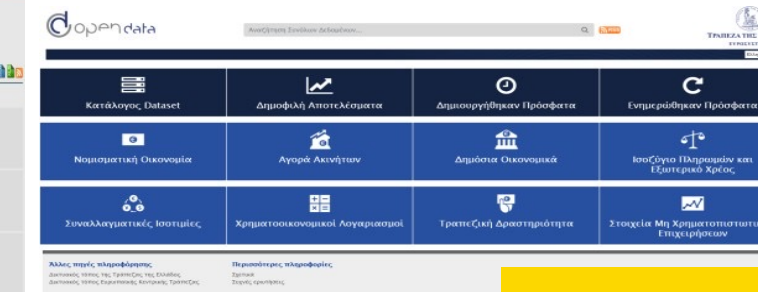
Browse by Country or Indicator

UNdata
A world of information

Datamarts | Update Calendar | Glossary | API | More

energy! Search

32 databases - 60 million records



OpenData

Ανοικτά Δεδομένα

Κατάλογος Datasets | Δημοφιλή Αποτελέσματα | Δημοσιουργήσιμη Πρόσβαση | Ενημερώσιμη Πρόσβαση

Νομισματική Οικονομία | Αγορά Ακινήτων | Δημόσια Οικονομικά | Ισοζύγιο Πληρωμών και Εξωτερικό Χρέος

Συνολογενετικές Ισοτιμίες | Χρηματοοικονομικοί Λογαριασμοί | Τραπεζική Δραστηριότητα | Στοιχεία Μη Χρηματοοικονομικών Επιχειρήσεων

Άλλες πηγές πληροφοριών
Δημόσια, όπως τις Υπηρεσίες της Ελλάδας, Διεθνώς, όπως Ευρωπαϊκούς Καταναλωτή, Τράπεζες

Περαιτέρω πληροφορίες
Επιλογή, Στοιχεία, εργαλεία

2. DATA CLEANING

- Explore your dataset, understand your data, check them out, make methodological decisions and corrections.
- Prepare your data so that you can analyze them: Manipulate the data to end up with a structured quantitative dataset which includes all the variables you wish to study.

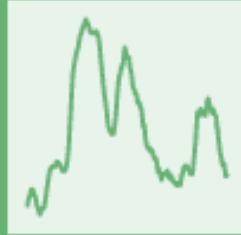
3. DATA ANALYSIS

- Do not rely on absolute numbers.
- Normalize your data in order to compare different populations.
- Mind that outliers might influence your averages.
- Calculate percentage change when looking for growth in a time period compared to another.
- Always remember that correlation does not mean causation.

4. DATA VISUALIZATION

Choose the chart type it fits to what you wish to visualize

line



The standard way to show a changing time series. If data are irregular, consider markers to represent data points

spine-chart



Splits a single value into 2 contrasting components (eg Male/Female)

Bubble



Like a scatterplot, but adds additional detail by sizing the circles according to a third variable

treemap



Use for hierarchical part-to-whole relationships; can be difficult to read when there are many small segments

basic-choropleth



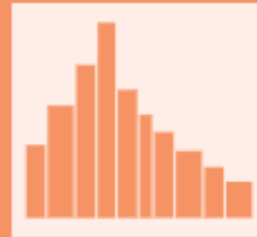
The standard approach for putting data on a map - should always be rates rather than totals and use a sensible base geography.

Column



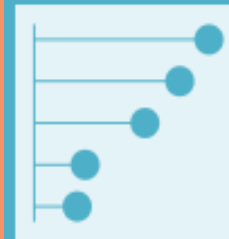
The standard way to compare the size of things. Must always start at 0 on the axis

histogram



The standard way to show a statistical distribution - keep the gaps between columns small to highlight the 'shape' of the data.

lollipop-h



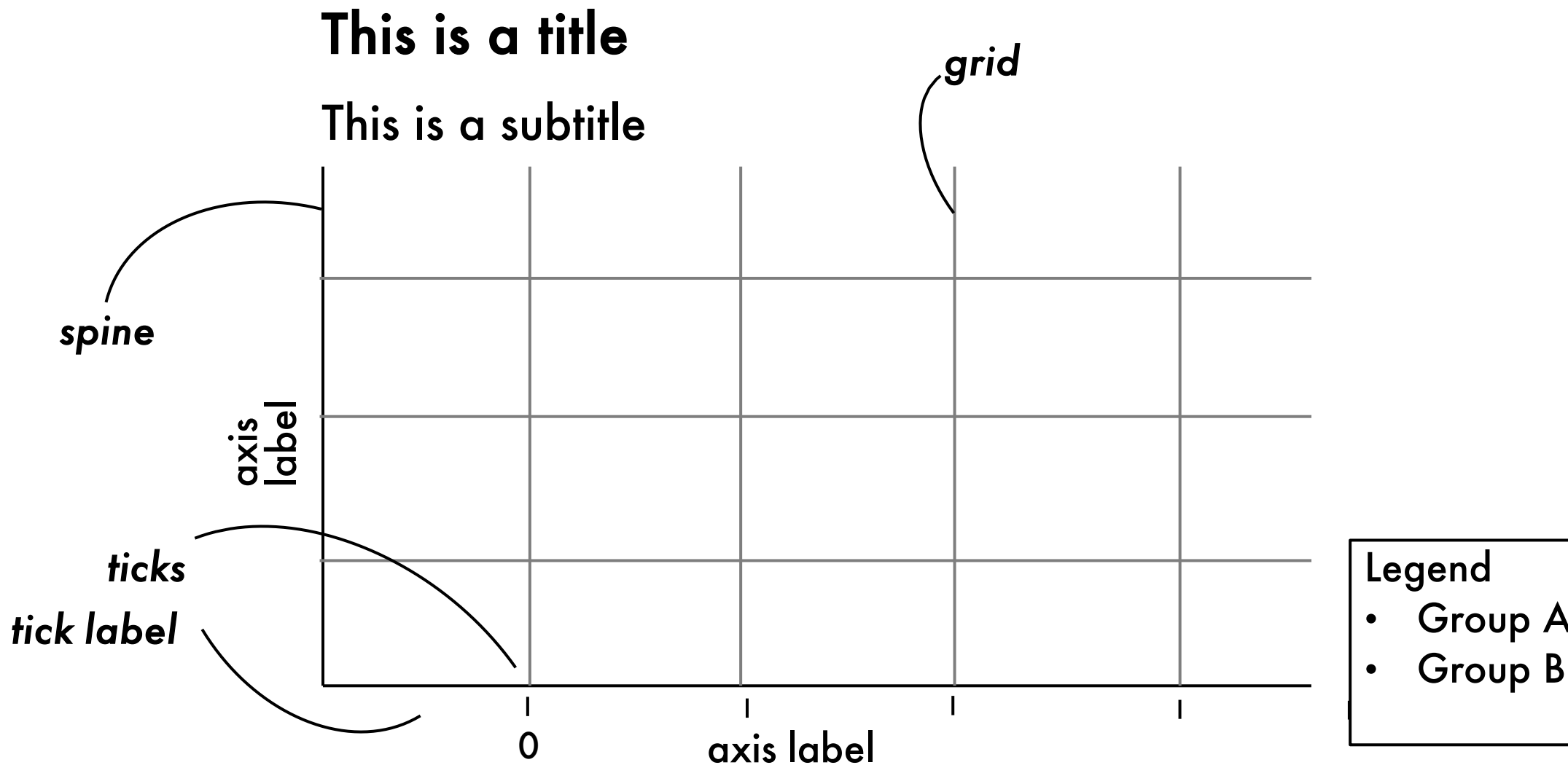
Lollipop charts draw more attention to the data value than standard bar/column and can also show rank effectively

sankey



Shows changes in flows from one condition to at least one other; good for tracing the eventual outcome of a complex process.

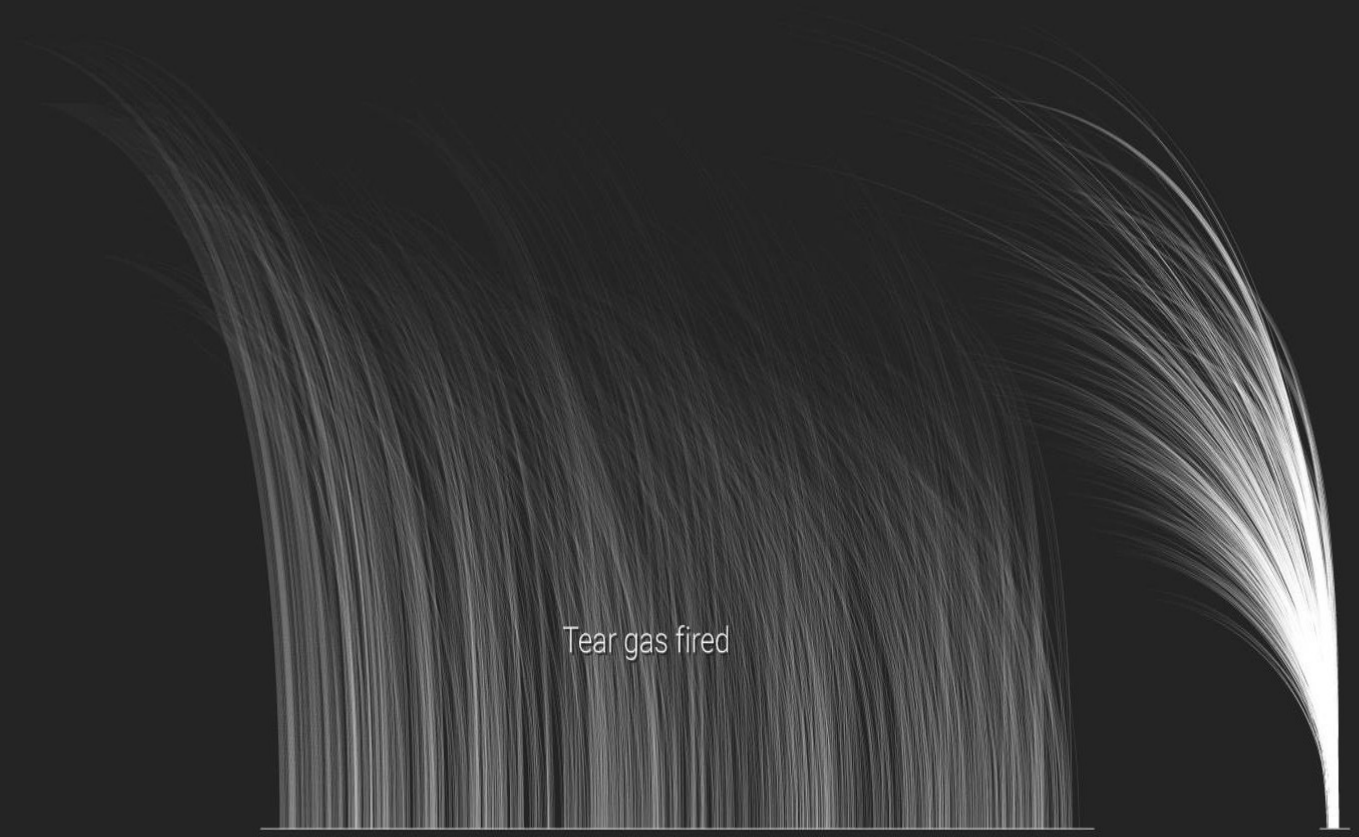
THE ANATOMY OF A CHART



SOURCE: Here is where your hyperlinked data source goes.

Notes: Here is where you underline whatever else your reader needs to know.

THEN, START BEING MINIMAL



Total of 2,414 shots fired from June 6 to September 15

800 shots fired
on August 5 alone

South China Morning Post

5. CONTEXTUALIZE DATA

- Interview a datapoint. Datapoints are usually humans. Talk to humans.
- Talk to experts and ask them to elaborate your findings.
- Combine your data findings with context knowledge coming out of your datasets.

6. PRESENT YOUR STORY

- Tell the story that derives from your data and/or report on a story that your data verify. But do not forget to:
- Be accountable. Along with your story, provide your methodology, open your datasets and your data processing to the public.

HOW A STATISTICIAN CAN BE PART OF A DATA JOURNALISM PROJECT

- **Become a journalist's source:** communicate your research findings, share your data and work with journalists who are interested to report on those for the best understanding of the general public
- **Offer your help:** collaborate and share your expertise to aid data journalists in comprehending the significance of their findings, guiding them on how to enhance their analysis, and alerting them to potential pitfalls they should navigate carefully.
- **Participate actively:** become a member of a team and investigate collaboratively; please note that if you plan to work or contribute as a data journalist, you will be expected to do more than analyze already collected and cleaned data neatly delivered to you.

**IN THE RECENT YEARS,
DATA HAS BEEN THE NEWS**

Coronavirus Research Center, JHU

Developed by the Center for Systems Science and Engineering (CSSE) at Johns Hopkins University (JHU)

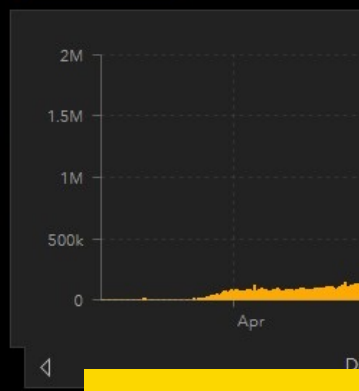


Global Deaths

1,654,461

308,098 deaths
US
183,735 deaths
Brazil
144,451 deaths
India
115,769 deaths
Mexico
67,220 deaths
Italy
65,618 deaths
United Kingdom

Global Deaths Global Recovered



Cumulative Cases Active Cases Incidence Rate Case-Fatality Ratio Testing Rate

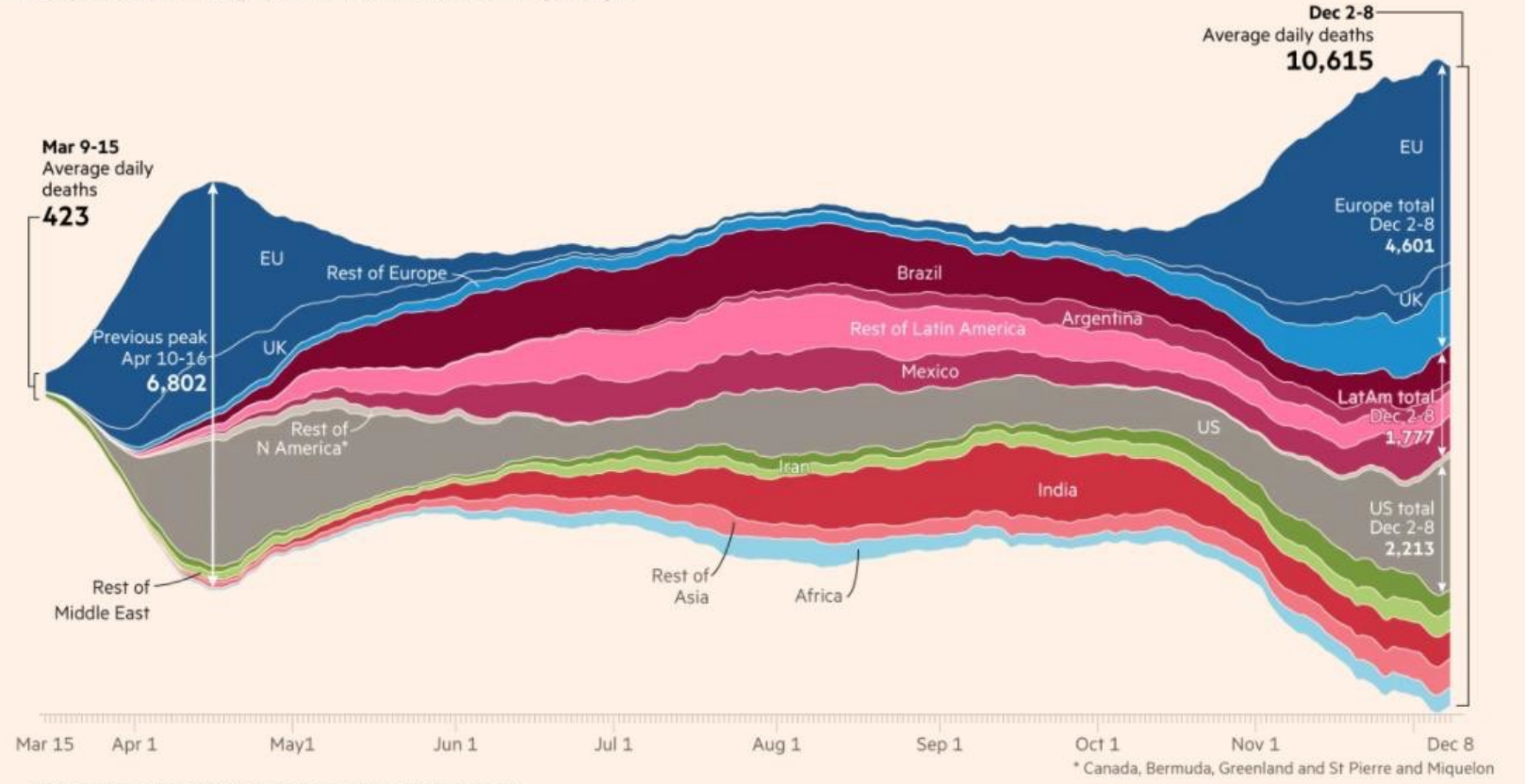
191
countries/regions

Lancet Inf Dis Article: [Here](#). Mobile Version: [Here](#). Data sources: [Full list](#). Downloadable database: [Github](#), [Feature Layer](#).
Lead by JHU CSSE. Technical Support: [Esri Living Atlas team](#) and [JHU APL](#). Financial Support: [JHU](#), [NSF](#), [Bloomberg Philanthropies](#) and [Stavros Niarchos Foundation](#). Resource support: [Slack](#), [Github](#) and [AWS](#). Click [here](#) to **donate** to the CSSE dashboard team, and other JHU COVID-19 Research Efforts. [FAQ](#). Read more in this [blog](#). [Contact US](#).

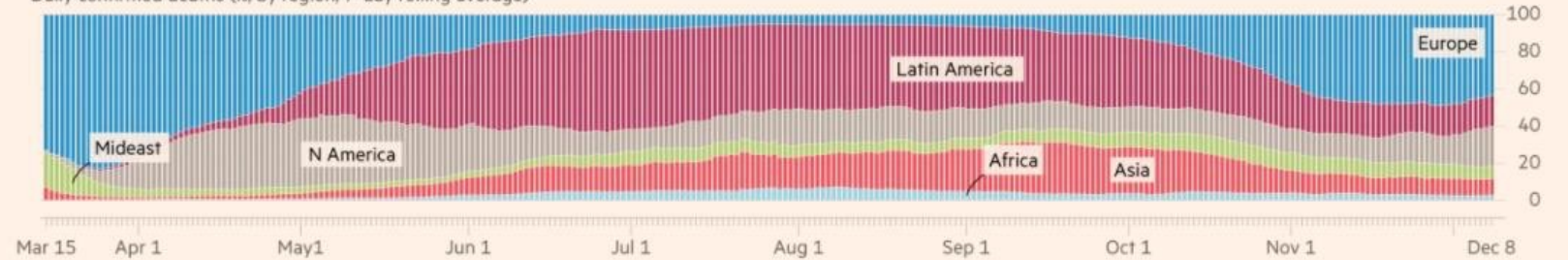
FT Coronavirus Tracker

Europe's Covid-19 resurgence pushes daily death toll higher than April peak

Daily deaths of patients diagnosed with coronavirus (7-day rolling average)



Daily confirmed deaths (% by region, 7-day rolling average)



FT graphic: Steven Bernard / @sdbernard

Source: FT analysis of data from the ECDC, the Covid Tracking Project, UK government Covid-19 dashboard and the Spanish Ministry of Health

© FT

FT Coronavirus Tracker

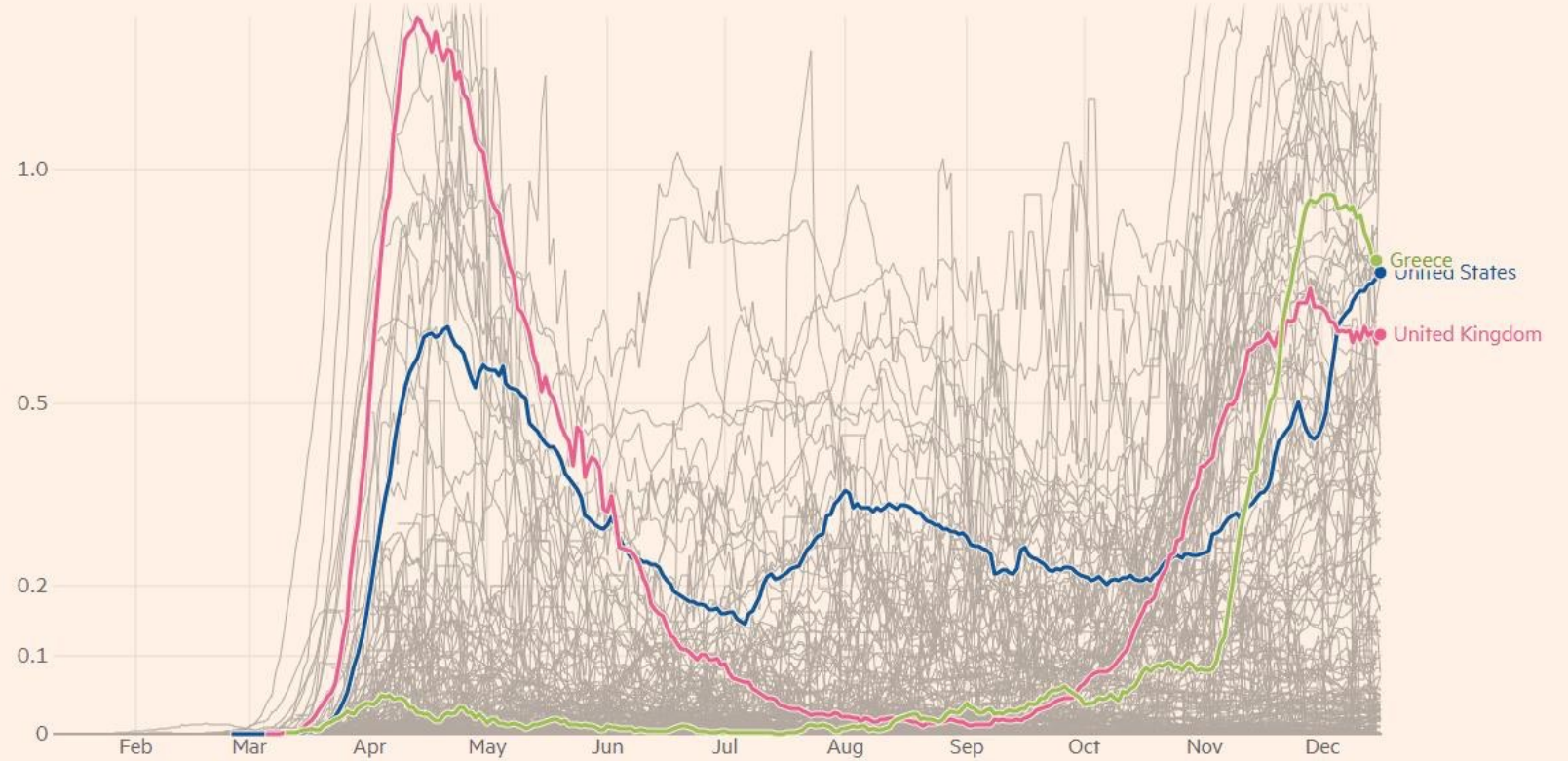
Choose country/bloc or select up to six to compare

United States X United Kingdom X Greece X Search...

Deaths Cases New Cumulative More options

New deaths attributed to Covid-19 in United States, United Kingdom and Greece

Seven-day rolling average of new deaths (per 100k)



Source: Financial Times analysis of data from the World Health Organization, the Covid Tracking Project, the Johns Hopkins CSSE, the UK Government coronavirus dashboard, the Spanish Ministry of Health and the Swedish Public Health Agency.
Data updated December 17 2020 2.06pm GMT. Interactive version: ft.com/covid19

FINANCIAL TIMES

74,467,541

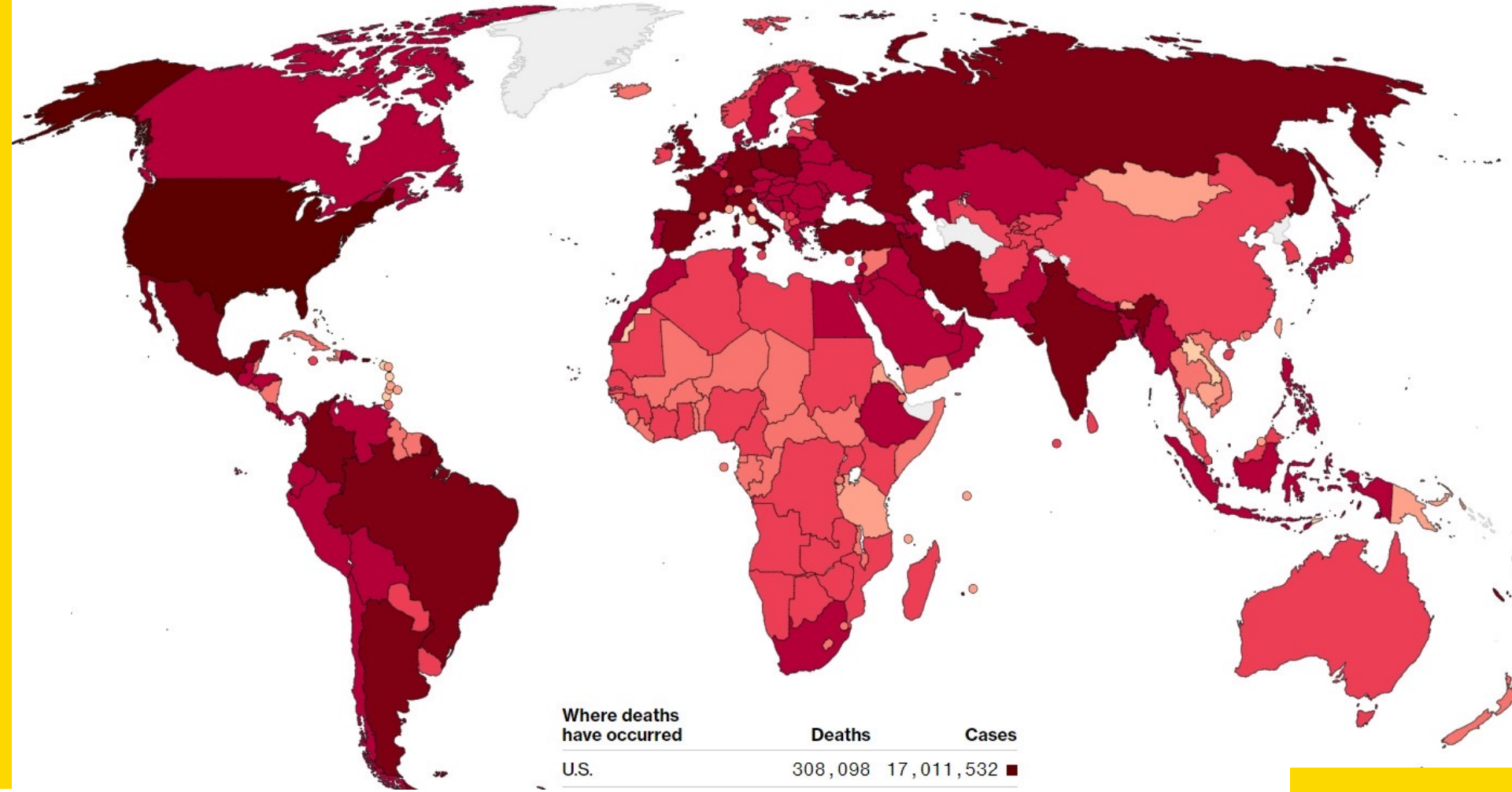
Confirmed cases worldwide

1,654,462

Deaths worldwide

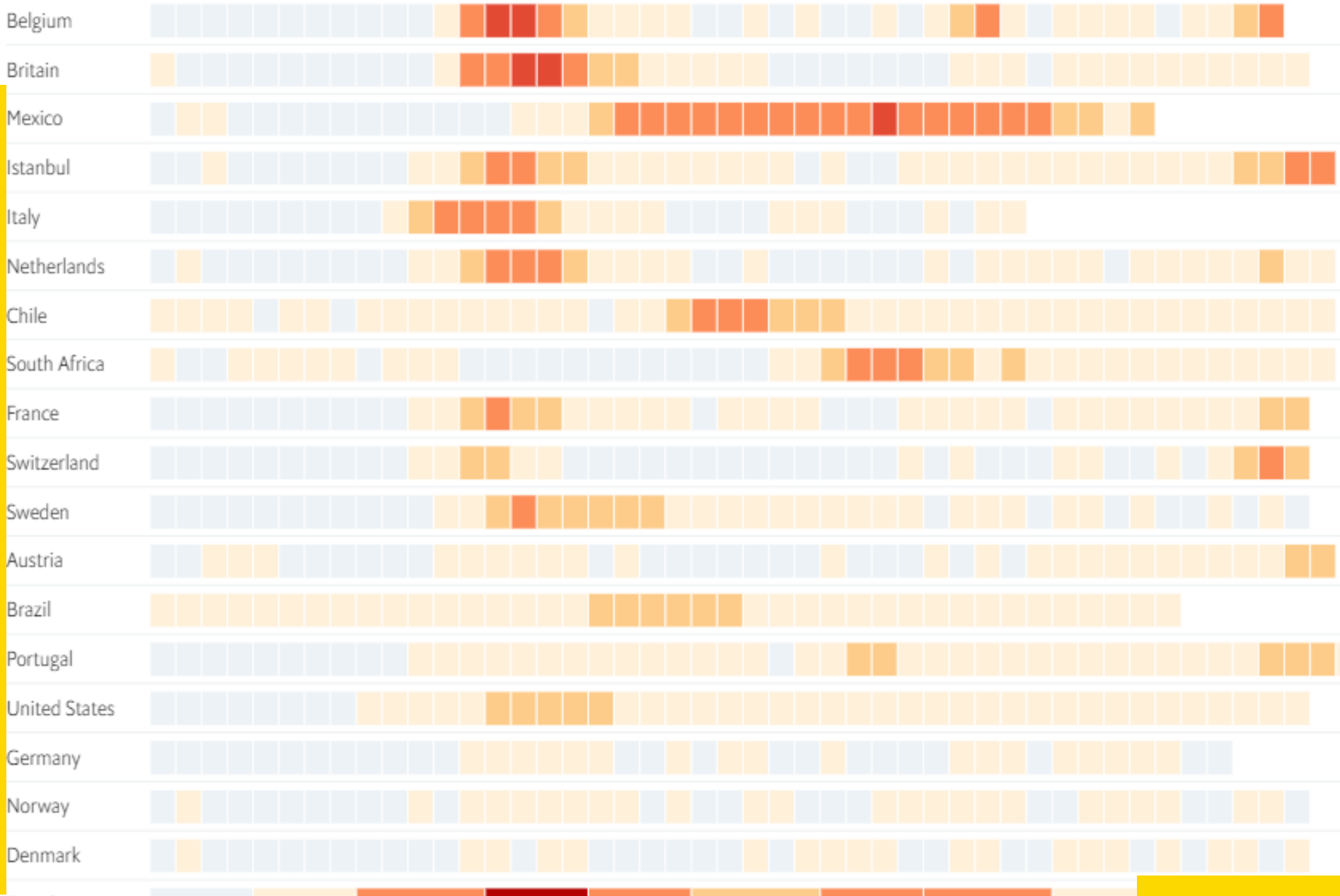
Jurisdictions with cases confirmed as of December 17, 2020, 6:28 PM GMT+2

1-99 100-999 1,000-9,999 10,000-99,999 100,000-999,999 1,000,000-9,999,999 10 million or more

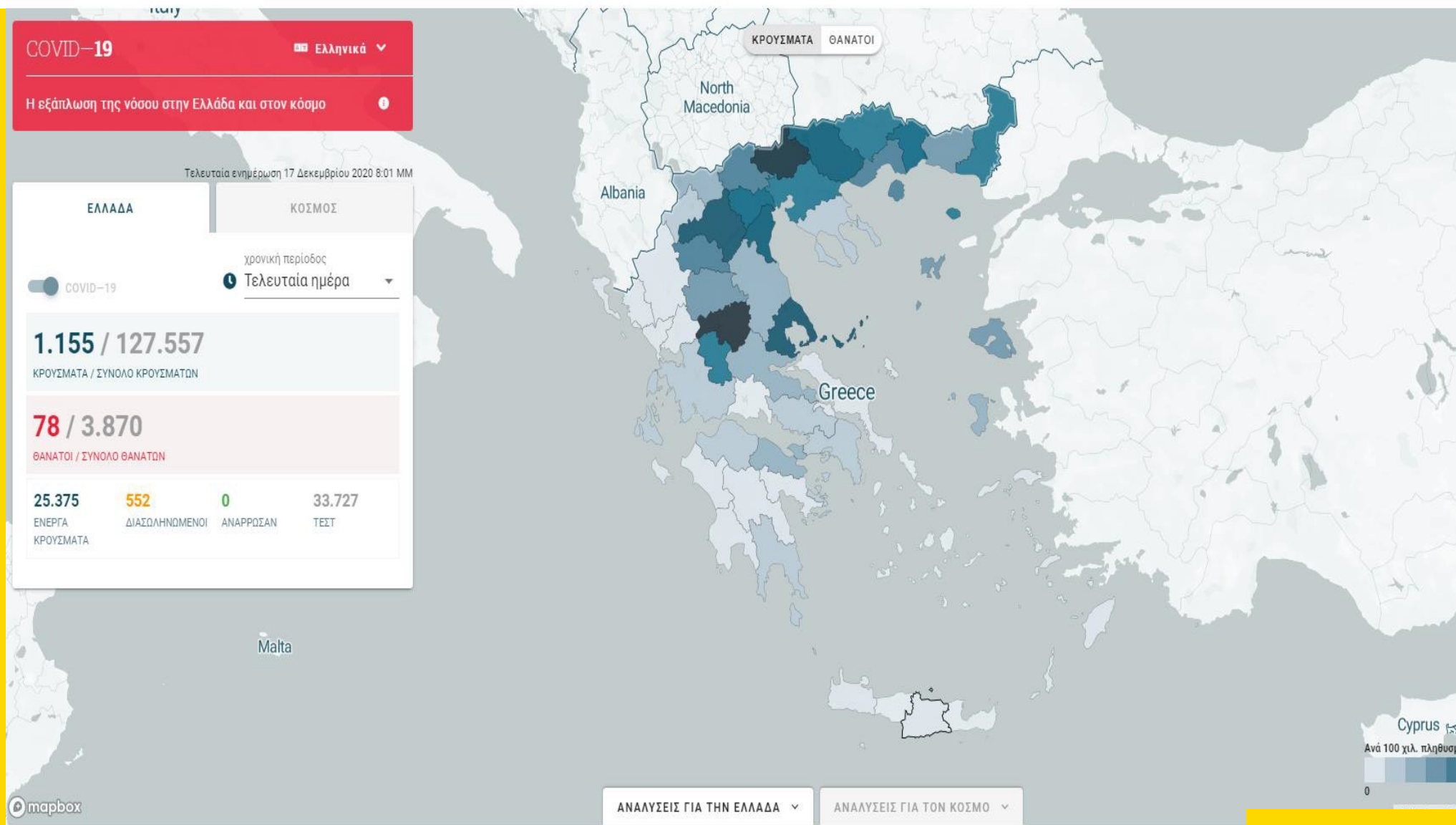


Bloomberg,
Tracking
COVID-19

Economist,
Tracking excess
deaths across
countries



iMEDD Lab, COVID-19: The spread of the disease in Greece and worldwide



BEFORE AND BEYOND COVID-19

Why the
superrich are
inevitable,
The Pudding



Cities for Rent, Arena for Journalism in Europe

Browse our data catalogue

Show me data from

--- any country ---

country

--- any city ---

city

Show me data about

--- all categories ---

category

Filter by availability

--- everything ---

status

[Reset all filters](#)

Oslo

rental markets

Evolution of rental prices

[data available: go to source](#)

Boligbygg

[machine readable](#)

Milan

rental markets

Evolution of household income

[data available: go to source](#)

Local statistics office: SISI. Click on "REDDITI" (behind PREZZI E CONSUMI) and you can download different spreadsheets regarding the household income in Milan.

[machine readable](#)

Madrid

rental markets

Evolution of household income

[data available: go to source](#)

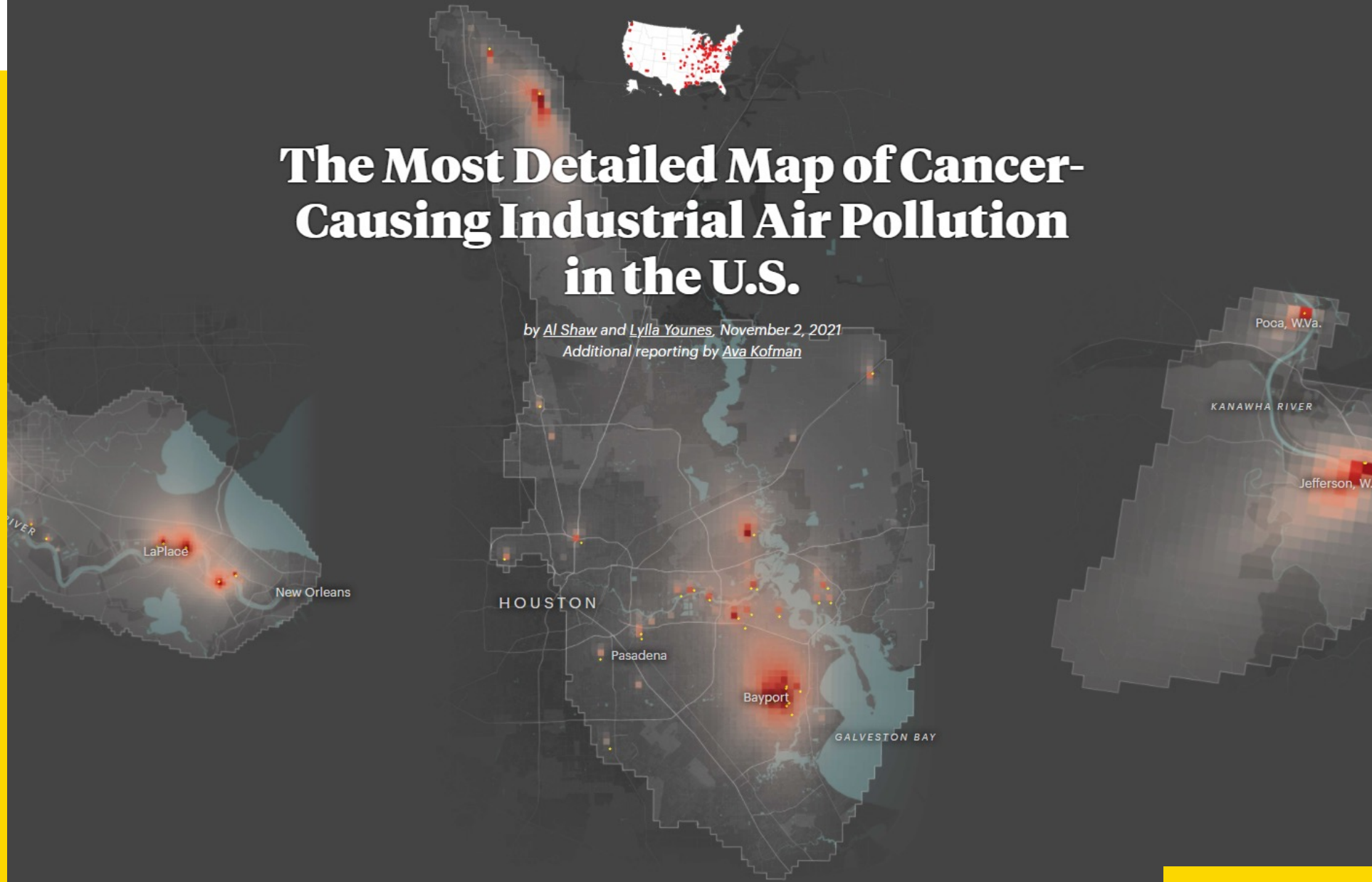
Local statistic office: Madrid

[machine readable](#)

The Most Detailed
Map of Cancer,
ProPublica

The Most Detailed Map of Cancer-Causing Industrial Air Pollution in the U.S.

by *Al Shaw and Lylla Younes*, November 2, 2021
Additional reporting by *Ava Kofman*



Dollars for Docs

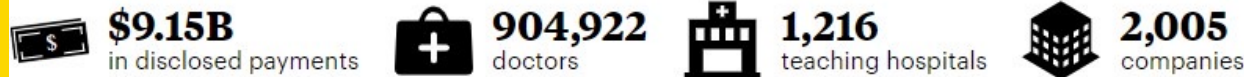
By Mike Tigas, Ryann Grochowski Jones, Charles Ornstein, and Lena Groeger, ProPublica. Updated June 28, 2018

[Dollars for Docs](#), ProPublica News Apps

Pharmaceutical and medical device companies are required by law to release details of their payments to a variety of doctors and U.S. teaching hospitals for promotional talks, research and consulting, among other categories. Use this tool to search for general payments (excluding research and ownership interests) made from August 2013 to December 2016. [\[Related Story: Opioid Makers, Blamed for Overdose Epidemic, Cut Back on Marketing Payments to Doctors →\]](#)

Has Your Doctor Received Drug or Device Company Money?

For example: [Andrew Jones, Boston, 10013](#)



Totals listed below account for all payments from August 2013 to December 2016.

Top 50 Companies

Click on a company to see how its payments break down by drug, device or doctor. Or, [see all companies »](#)

COMPANY PAYMENTS

Highest-Earning Doctors

NAME	PAYMENTS
STEPHEN BURKHART Orthopaedic Surgery	\$65.3M

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This site is protected by reCAPTCHA and the Google [Privacy Policy](#) and [Terms of Service](#) apply.

About the Dollars for Docs Data

Details behind our drug company money database.

Download the Data

The entire data set is available for purchase in the [ProPublica Data Store](#)

[Life in the camps,](#)
Reuters
Graphics

THE ROHINGYA CRISIS

Life in the camps

Makeshift huts crammed onto muddy hillsides. Water wells fouled by nearby latrines. Rapidly-spreading diseases. Health experts say overcrowding, poor sanitation and limited health care in the Rohingya refugee areas of Bangladesh is a “recipe for disaster”. This is a closer look at life in the camps.

DECEMBER 4, 2017

Spies in the
Skies,
BuzzFeed
News

SPIES
IN THE
SKIES

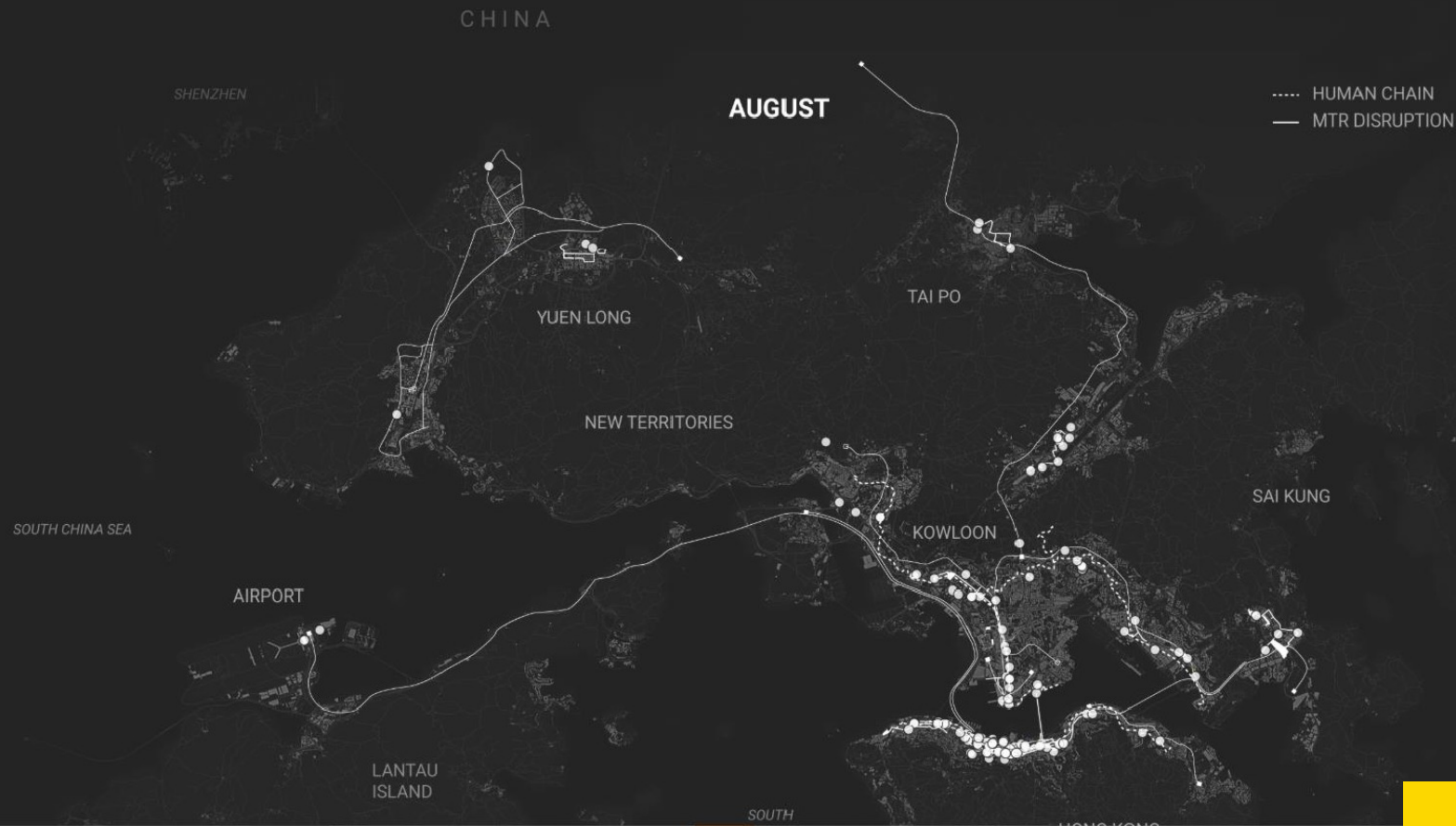


Mark Perrine for BuzzFeed News

100 days of protests rock Hong Kong
South China Morning Post

HONG KONG PROTESTS

100 days of protests rock Hong Kong



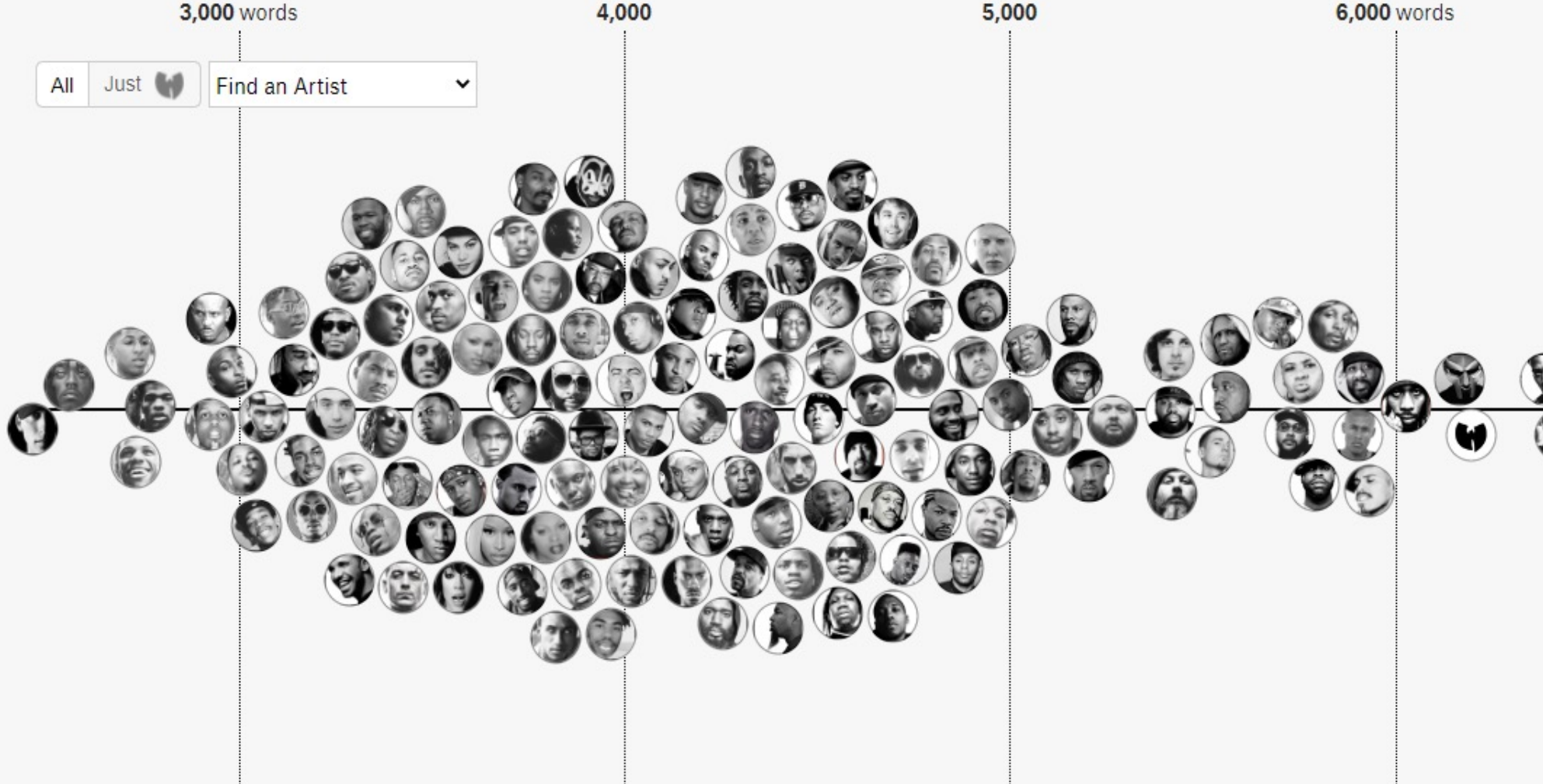
Colorism
in High
Fashion,
The
Pudding



Colorism
in High
Fashion

of Unique Words Used Within Artist's First 35,000 Lyrics

The Largest Vocabulary In Hip Hop, The Pudding



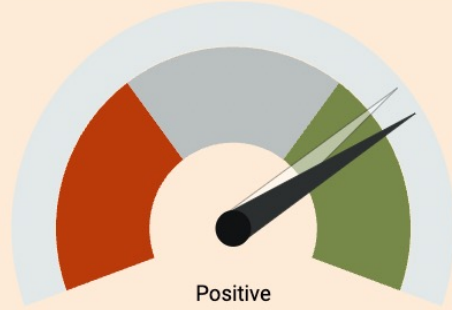
The Greek
wiretapping
scandal on
Twitter,
iMEdD Lab
in partnership
with Datalab



Analyzing the Greek political discourse: a collaboration between humans and AI, iMEdD Lab

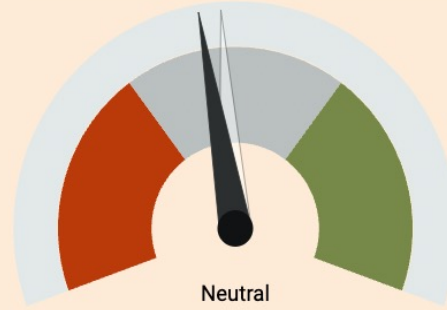
Kyriakos Mitsotakis

All Speeches



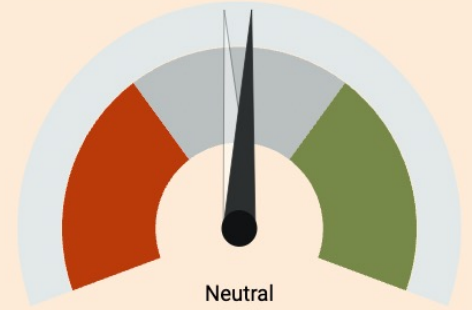
Alexis Tsipras

All Speeches



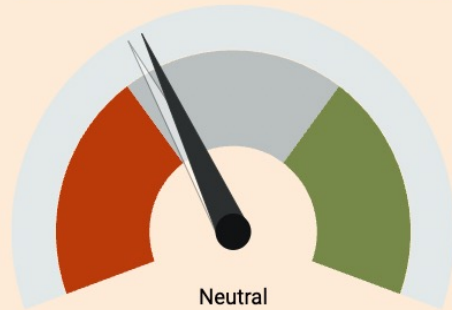
Nikos Androulakis

All Speeches



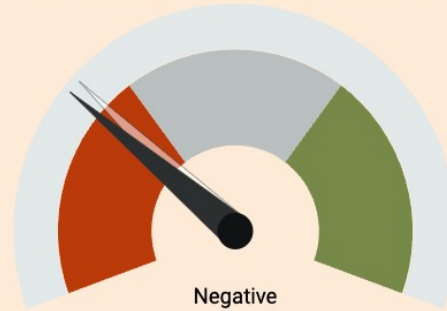
Dimitris Koutsoumpas

All Speeches



Kyriakos Velopoulos*

All Speeches



■ Negative ■ Neutral ■ Positive
□ Average speech sentiment in the previous election period ■ Selected speech sentiment in the current election period

Note: The analysis refers to the sentiment detectable in the political speeches themselves and is not at all related to audience emotions.

BOOKMARKS' LIST

READINGS & TOOLS

- Bounegru, L. & Gray, J. (2021). *The Data Journalism Handbook: Towards a Critical Data Practice*. Amsterdam: Amsterdam University Press. Openly available by EJC, datajournalism.com & Google News Initiative: <https://datajournalism.com/read/handbook/two> (Accessed: February 12, 2023). Openly available in Greek by iMEDD Lab: <https://datahandbook.lab.imedd.org/el/>
- Soma, J. (n.d) "Python's Not (Just) For Unicorns", *Little Columns*. Available: <http://littlecolumns.com/learn/python/>
- DataCamp.com, <https://www.datacamp.com/>
- DataJournalism.com, <https://datajournalism.com/>
- Datawrapper, <https://www.datawrapper.de/>
- Flourish, <https://flourish.studio/>
- FT Vocabulary, <ft.com/vocabulary>
- QJIS, <https://www.qgis.org/en/site/> & QJIS Tutorial, <http://www.qgistutorials.com/el/>

THANK YOU!