

$$\mathbf{x} = \mathbf{x}_f - \mathbf{x}_i \quad \Delta \mathbf{v} = \mathbf{v}_f - \mathbf{v}_i$$

$$= \frac{\Delta \vec{r}}{\Delta t} \quad \vec{a} = \frac{\Delta \vec{v}}{\Delta t}$$

$$v = |\mathbf{v}| = \sqrt{v_x^2 + v_y^2}$$

$$\theta = \tan^{-1}\left(\frac{v_y}{v_x}\right)$$



$$\omega = \frac{\Delta \theta}{\Delta t} \quad \alpha = \frac{\Delta \omega}{\Delta t}$$

$$= \mathbf{v}_0 + \mathbf{a}t$$

$$= \mathbf{x}_0 + \mathbf{v}_0 t + \frac{1}{2} \mathbf{a} t^2$$

$$-v_o^2 = 2a(x - x_0)$$

$$= \frac{v_f^2 + v_i^2}{2}$$

Data Visualization

$$\omega = 2\pi f \quad f = \frac{1}{T}$$

$$\omega = \omega_0 + \alpha t$$

$$\theta = \theta_0 + \omega_0 t + \frac{1}{2} \alpha t^2$$

$$\omega_0^2 = 2\alpha(\theta - \theta_0)$$

Curvefit Rankings for 0.5% SEV CO₂

Rank	F-statistic
1	7.962883557
2	7.8601110639
3	7.5283512645
4	7.3357010958
5	6.3801158367
6	3.8079206858
7	3.742891358
8	3.5727028219
9	3.5546937052
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11	2.7408796673
12	2.6986270263
13	2.5801276758
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 Germany

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 Fax: +49 8551 91764 69

$$x = A \cos(\omega t + \phi) \quad v = -A \omega \sin(\omega t + \phi)$$



Part 1: Introduction to data Visualization

Our objectives

1. Learn the main reasons and applications
2. Identify data visualization as a tool
3. Learn the basic concepts of visualization
4. Introduction to data visualization in R
5. Generation of scientific reports

In other words:

Learn to choose which graphics for which situations
How to generate high quality graphs

Materials



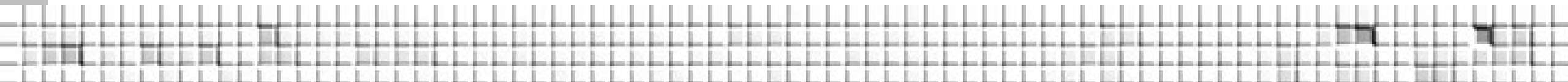
Information



Knowledge



Practice



An extensive comparative study of cluster validity indices

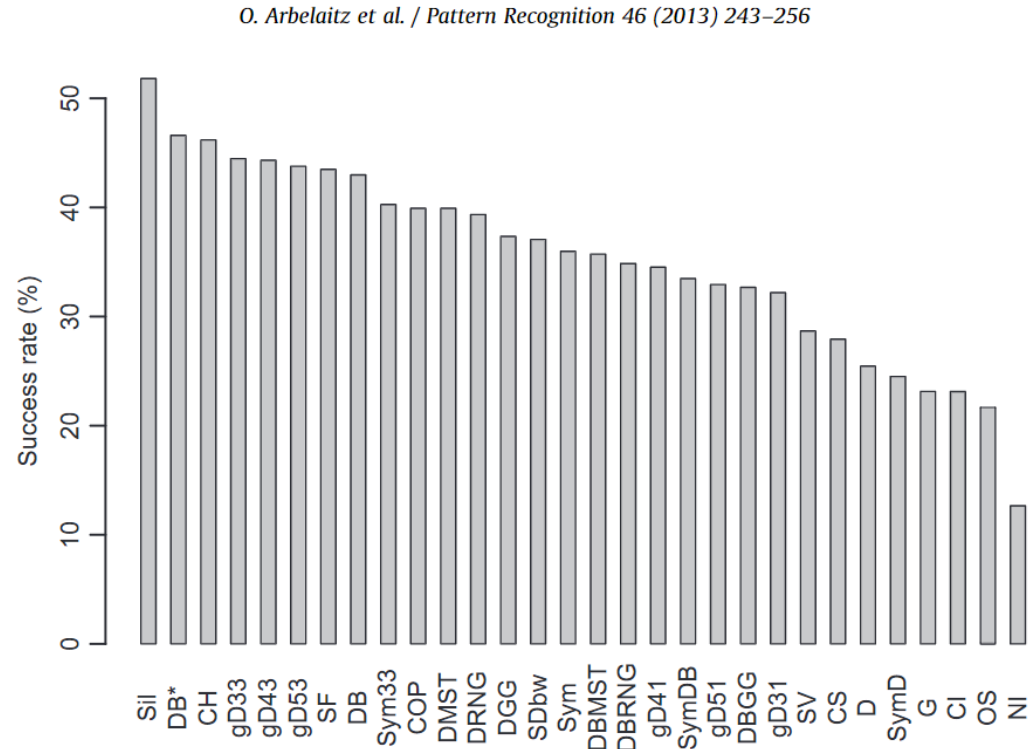


Fig. 2. Overall results for the experiment with synthetic datasets.

Arbelaitz, Olatz, et al. "An extensive comparative study of cluster validity indices." *Pattern Recognition* 46.1 (2013): 243-256.

An extensive comparative study of cluster validity indices



O. Arbelaitz et al. / Pattern Recognition 46 (2013) 243–256

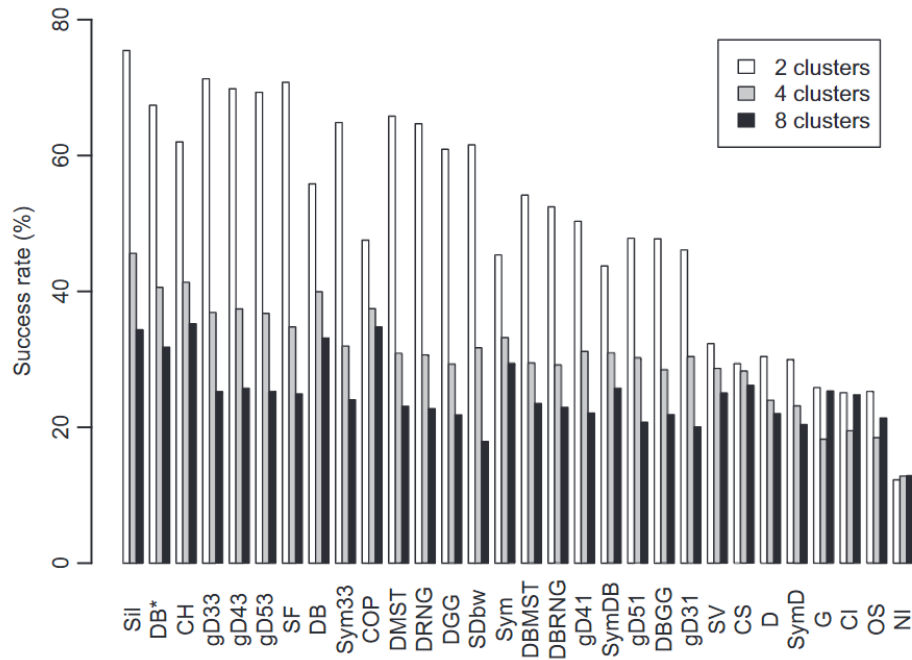


Fig. 4. Results for synthetic datasets broken down by number of clusters.

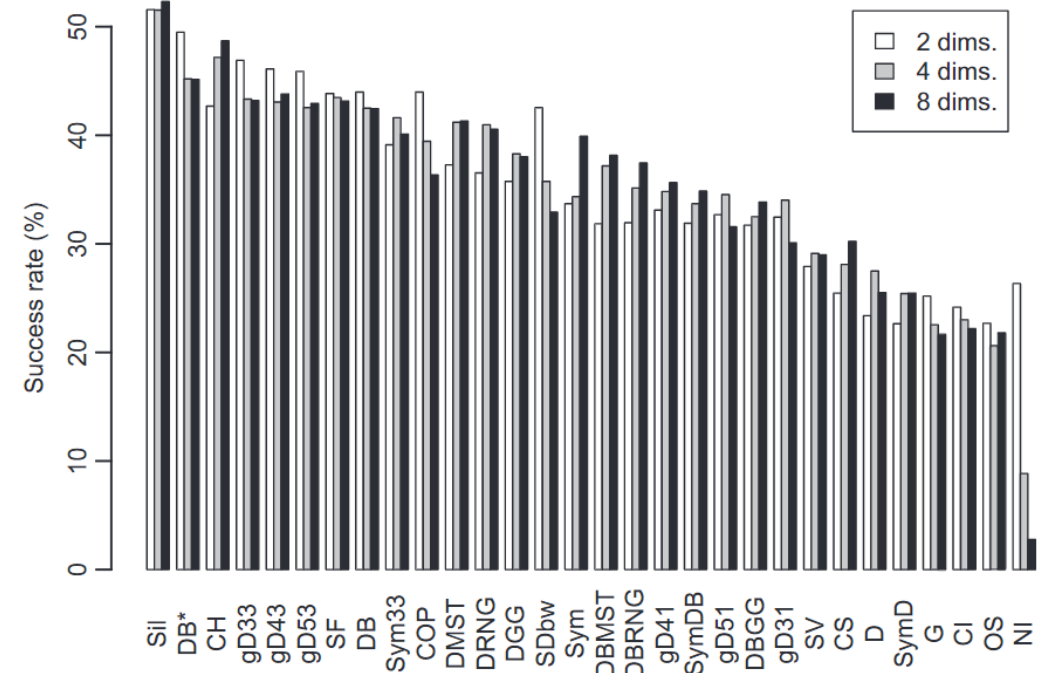
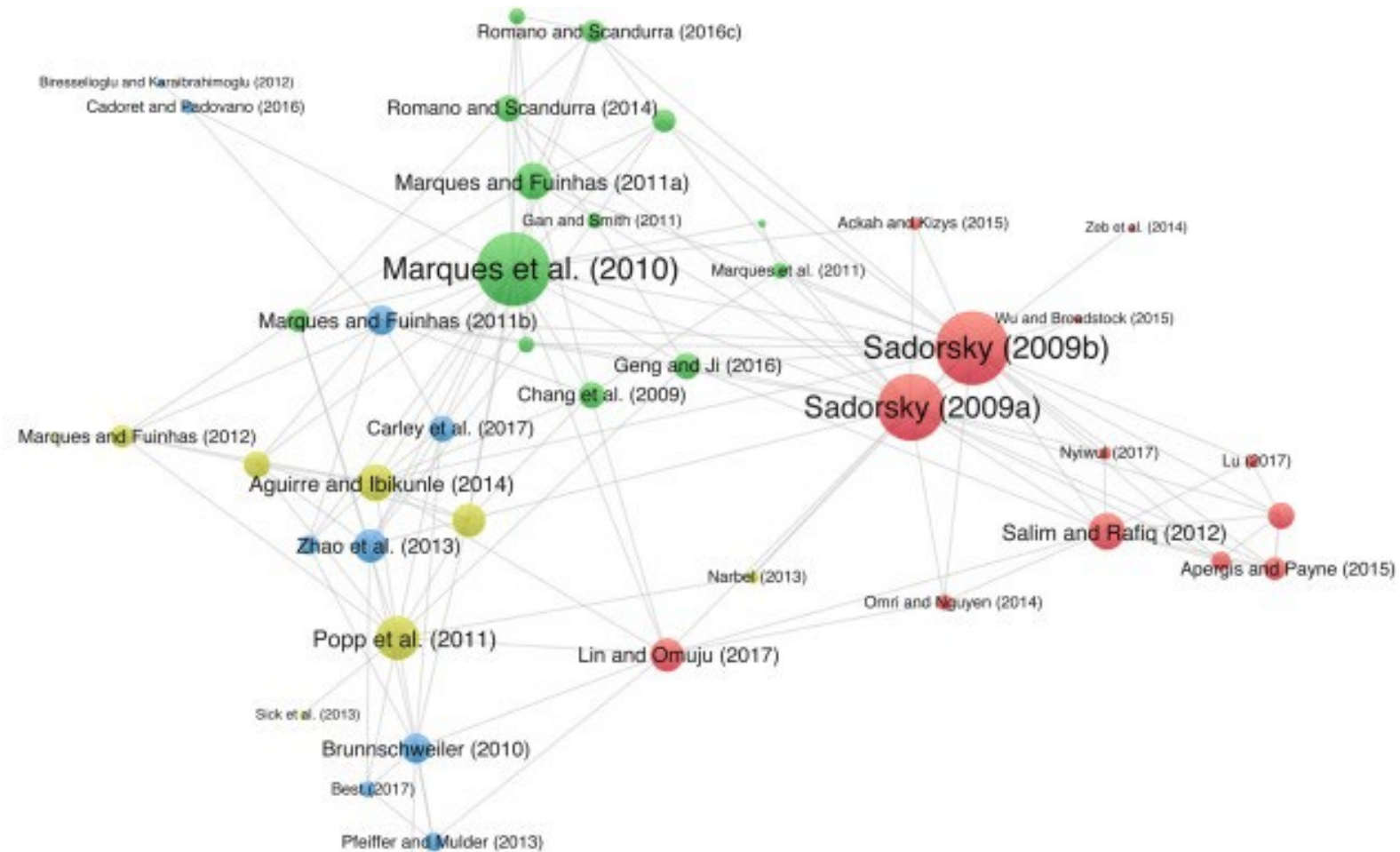


Fig. 5. Results for synthetic datasets broken down by dimensionality.

Arbelaitz, Olatz, et al. "An extensive comparative study of cluster validity indices." *Pattern Recognition* 46.1 (2013): 243-256.

Empirical determinants of renewable energy deployment: A systematic literature review



Bourcet, Clémence. "Empirical determinants of renewable energy deployment: a systematic literature review." *Energy Economics* (2019): 104563.

LEARNING R



OBTAINING R



- Comprehensive R Archive Network:

<http://cran.r-project.org>

- Courses:

<https://www.datacamp.com/>

- Videos:



R Tutorial: Introduction to R



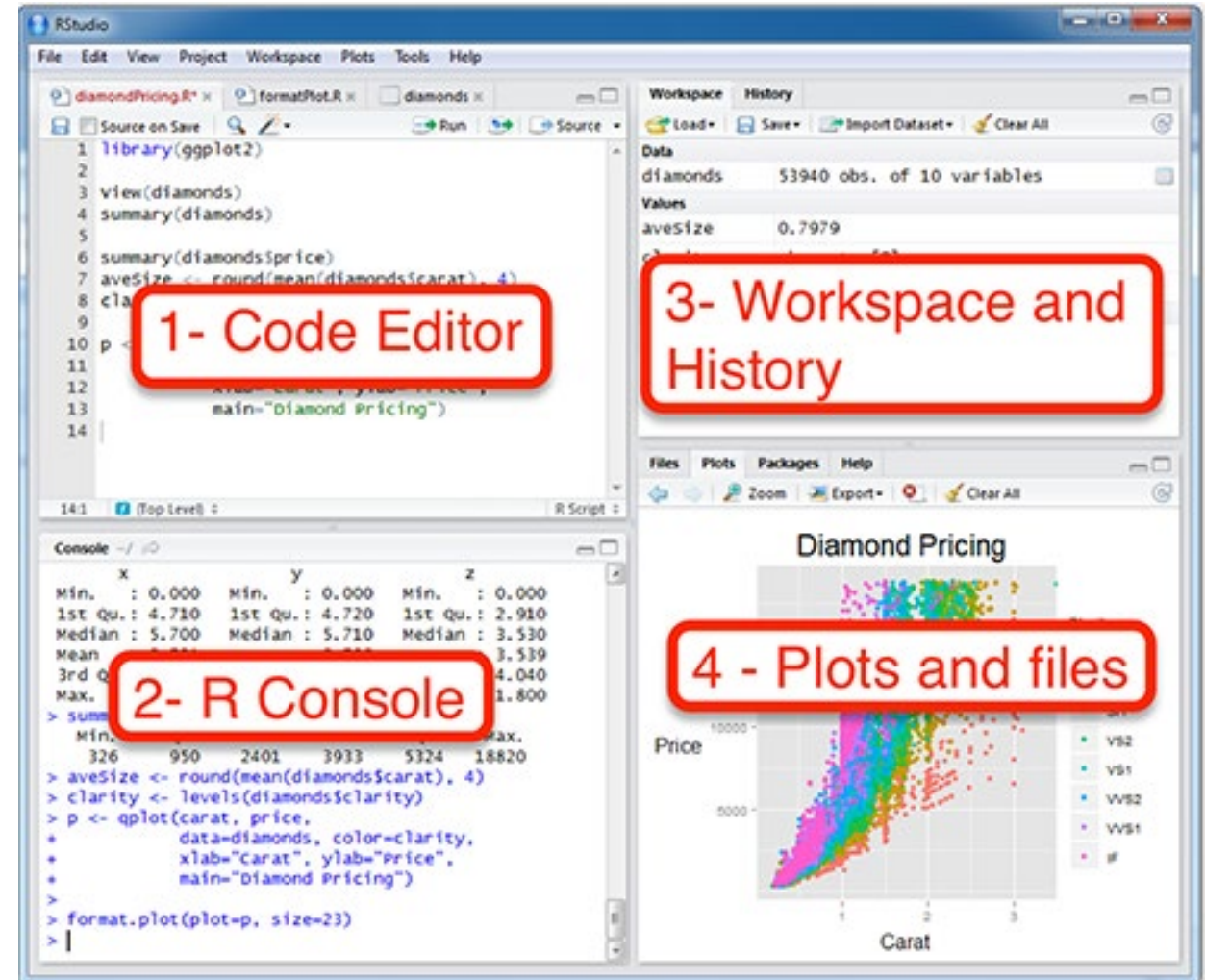
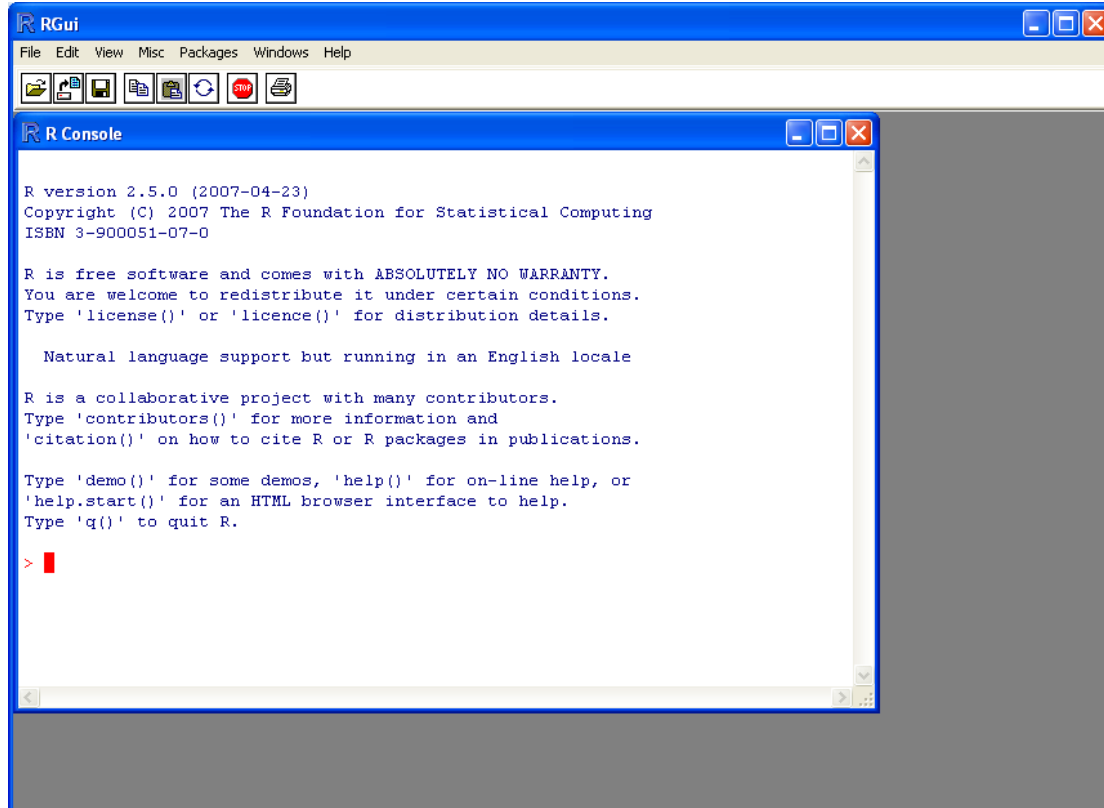
Introduction to R Programming | What is R Programming - Imarticus



Introduction to Data Science with R - Data Analysis Part 1



R vs. Rstudio





**KEEP
CALM
AND
LOVE
STATISTICS**

© 2018 KeepCalmStudio.com

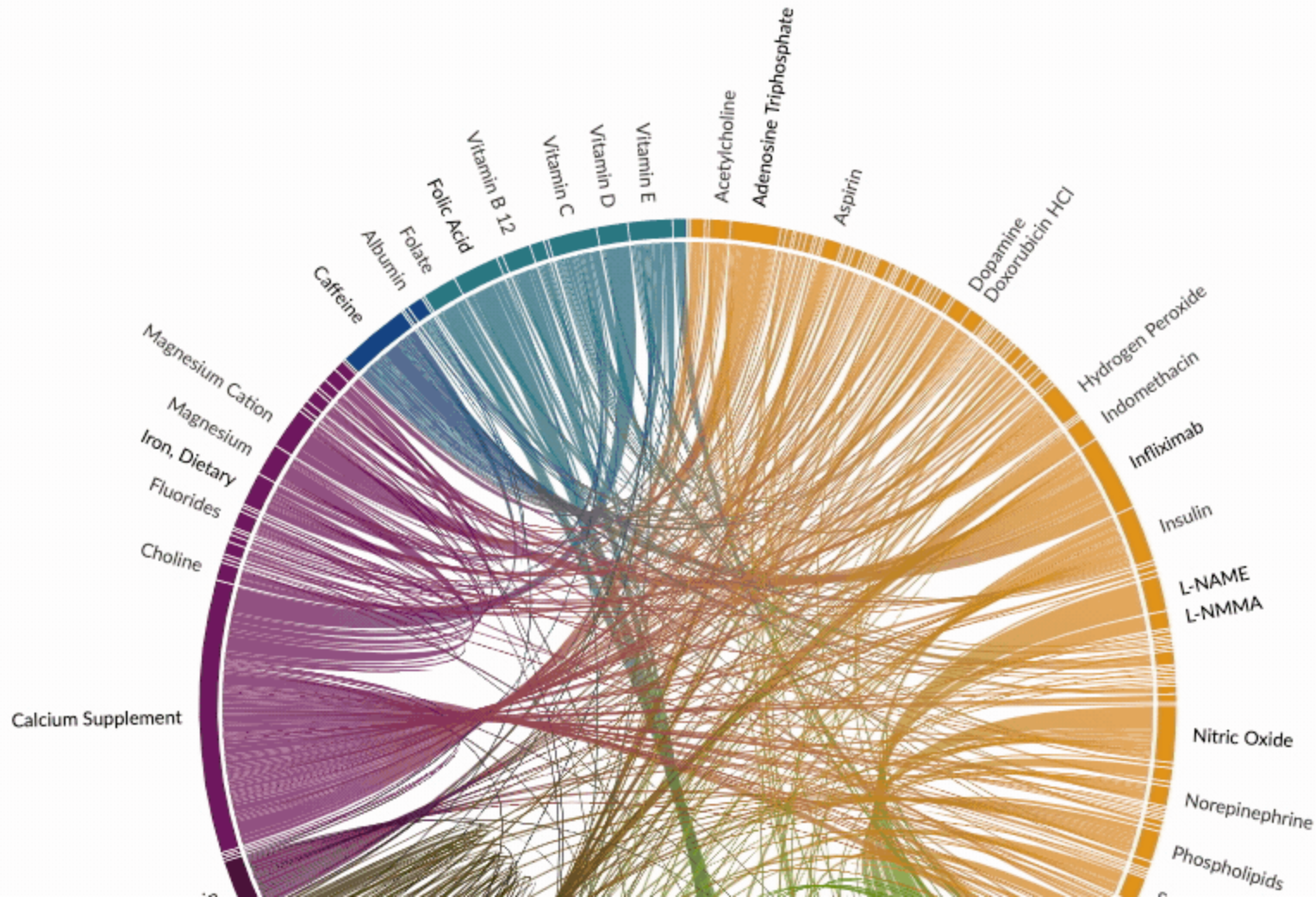


EAT
BE BEEF
SLEEP
WELL
NEATLY
REPEAT

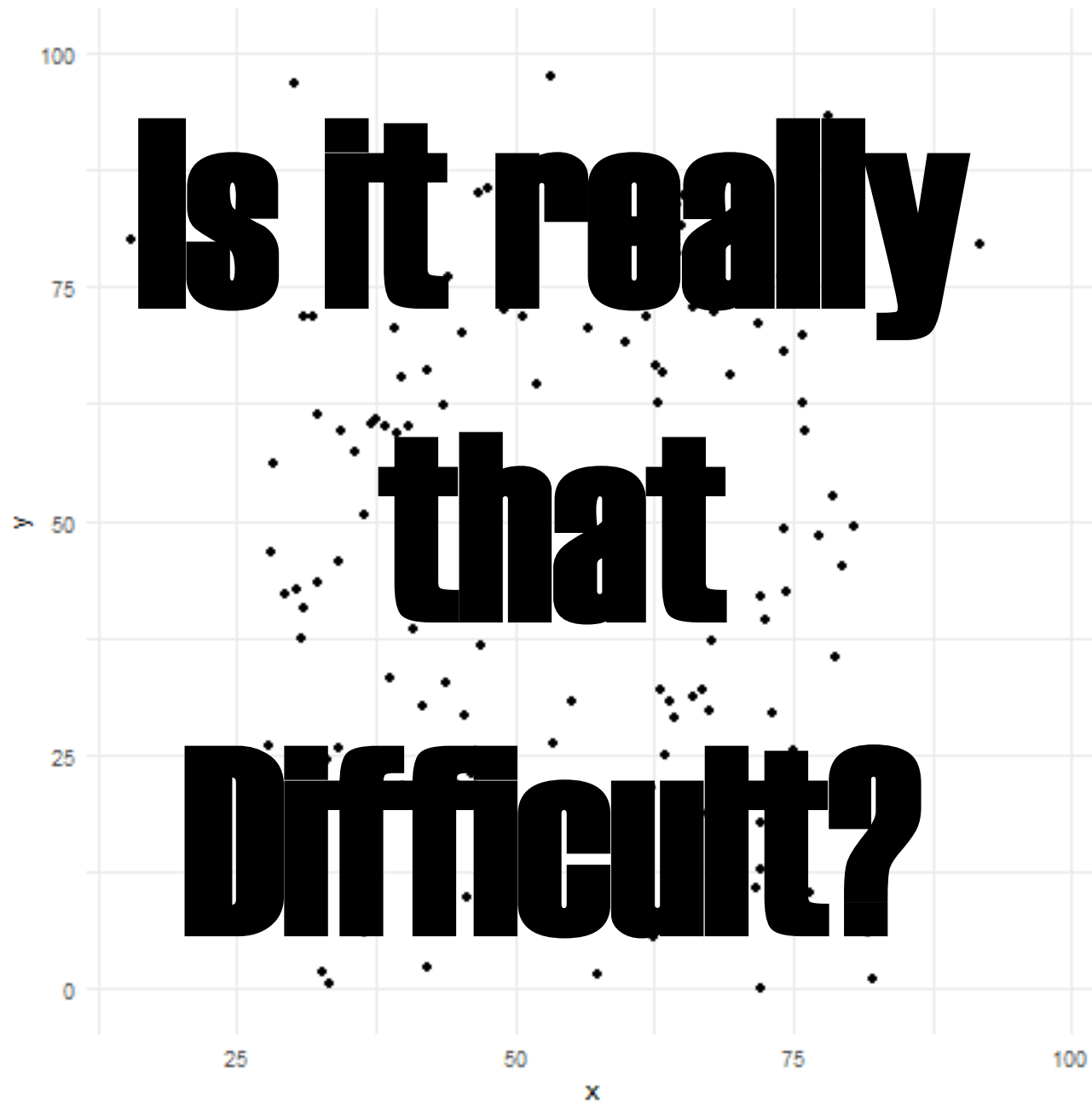
VISUALIZING SUPPLEMENT-DRUG INTERACTIONS

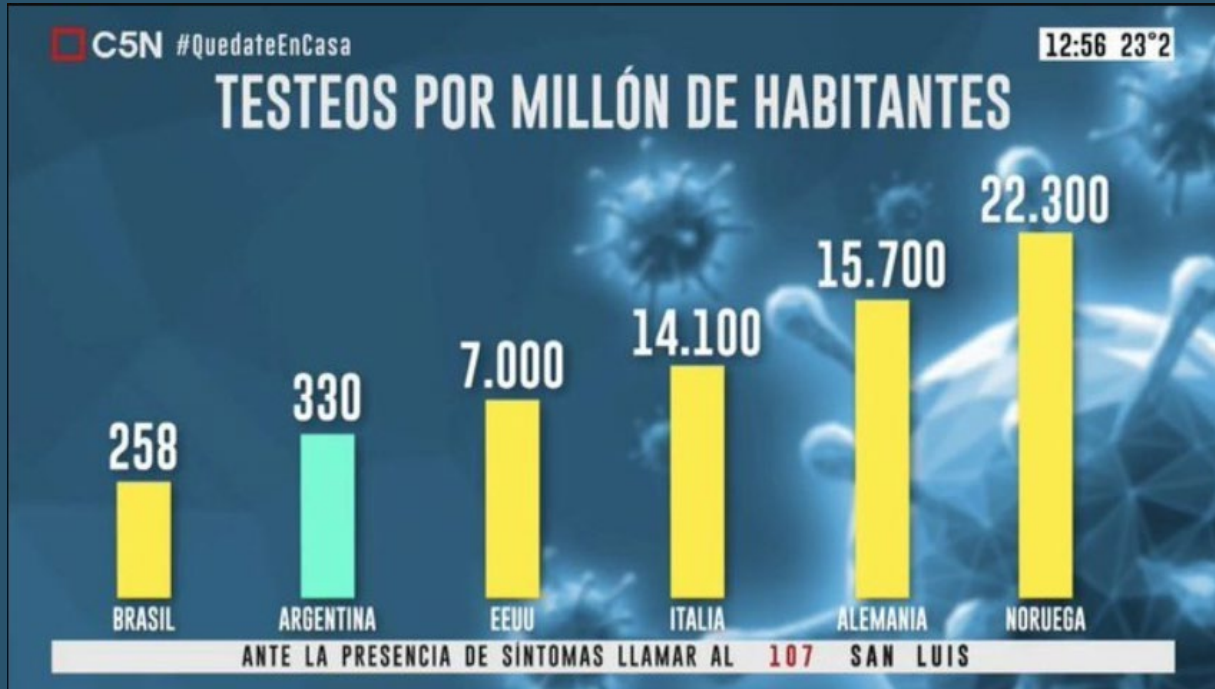
reported in the scientific literature

This chord diagram shows interactions reported in the scientific literature between a list of supplements and drugs curated by the [Allen Institute for AI](#). The algorithm automatically extracts evidence from publications and allows users to explore the resulting database via text-based searchers [here](#). I created this chord diagram to facilitate visual exploration of the various interactions. Supplements are grouped quasi-functionally (e.g., minerals, vitamins, fatty acids) and shown as distinct colors. Clicking on the name or outer band of any supplement or drug will link to the relevant Supp.AI webpage with additional information about the agent and its interactions.

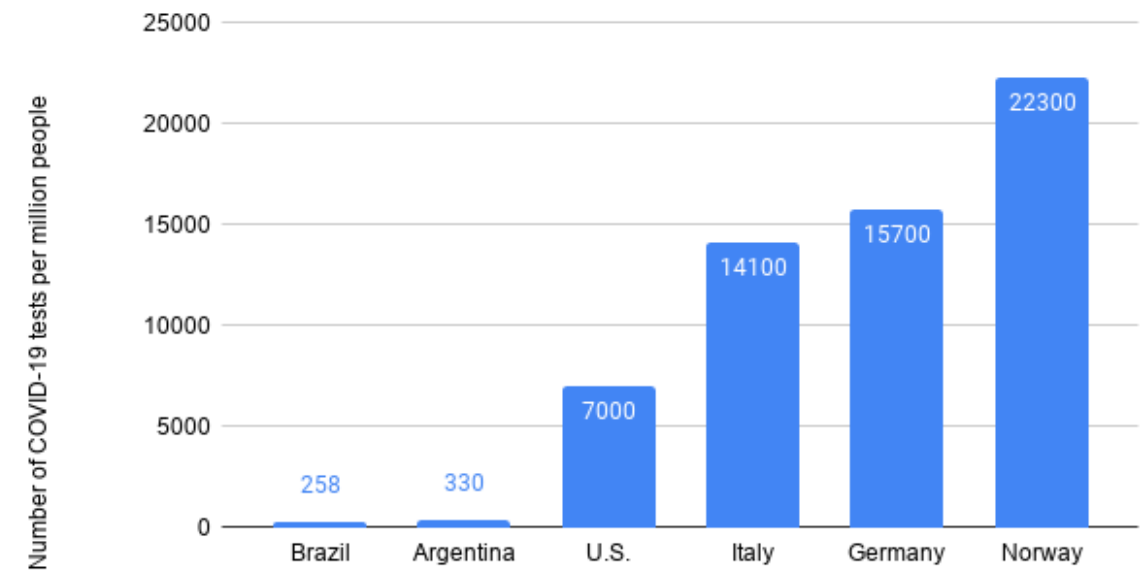


**Is it really
that
difficult?**





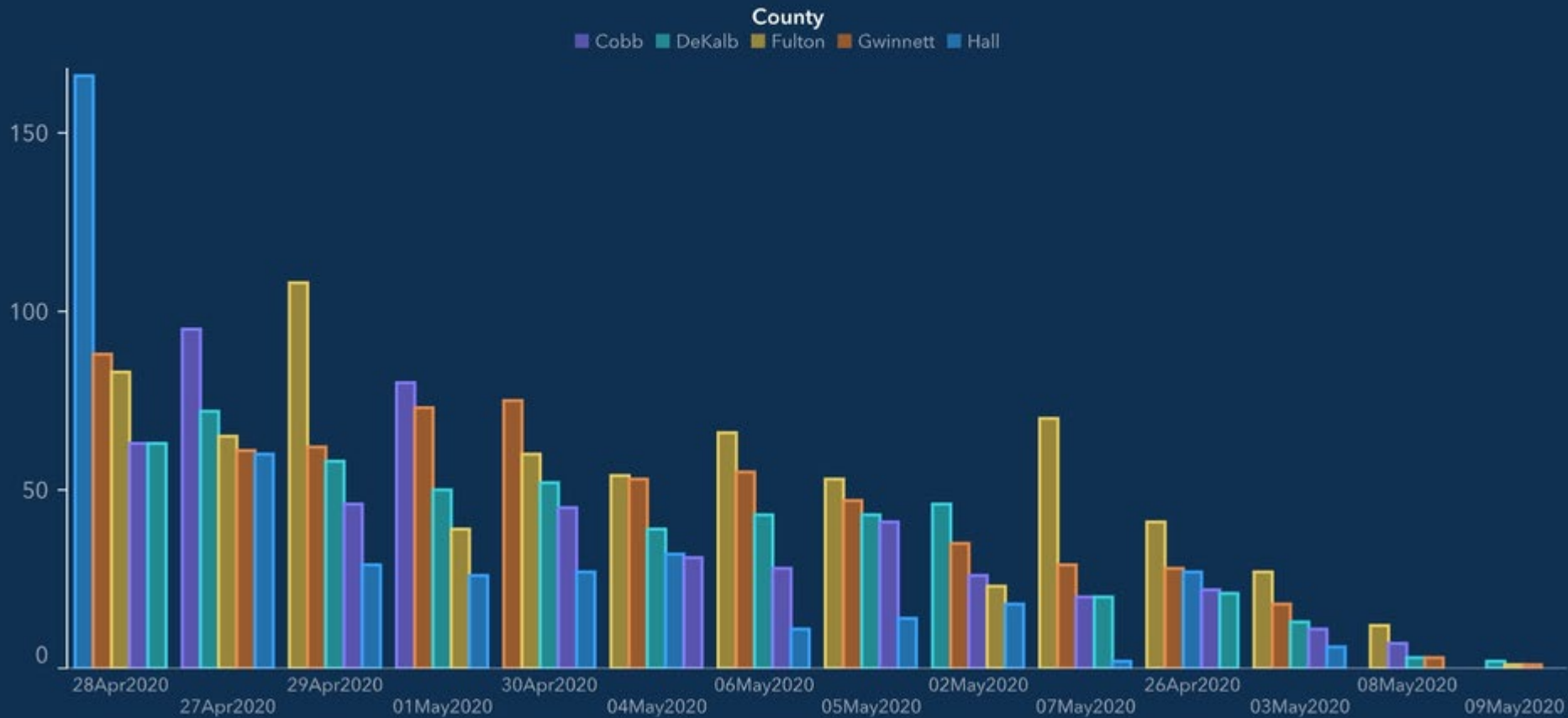
Number of COVID-19 tests per million of people



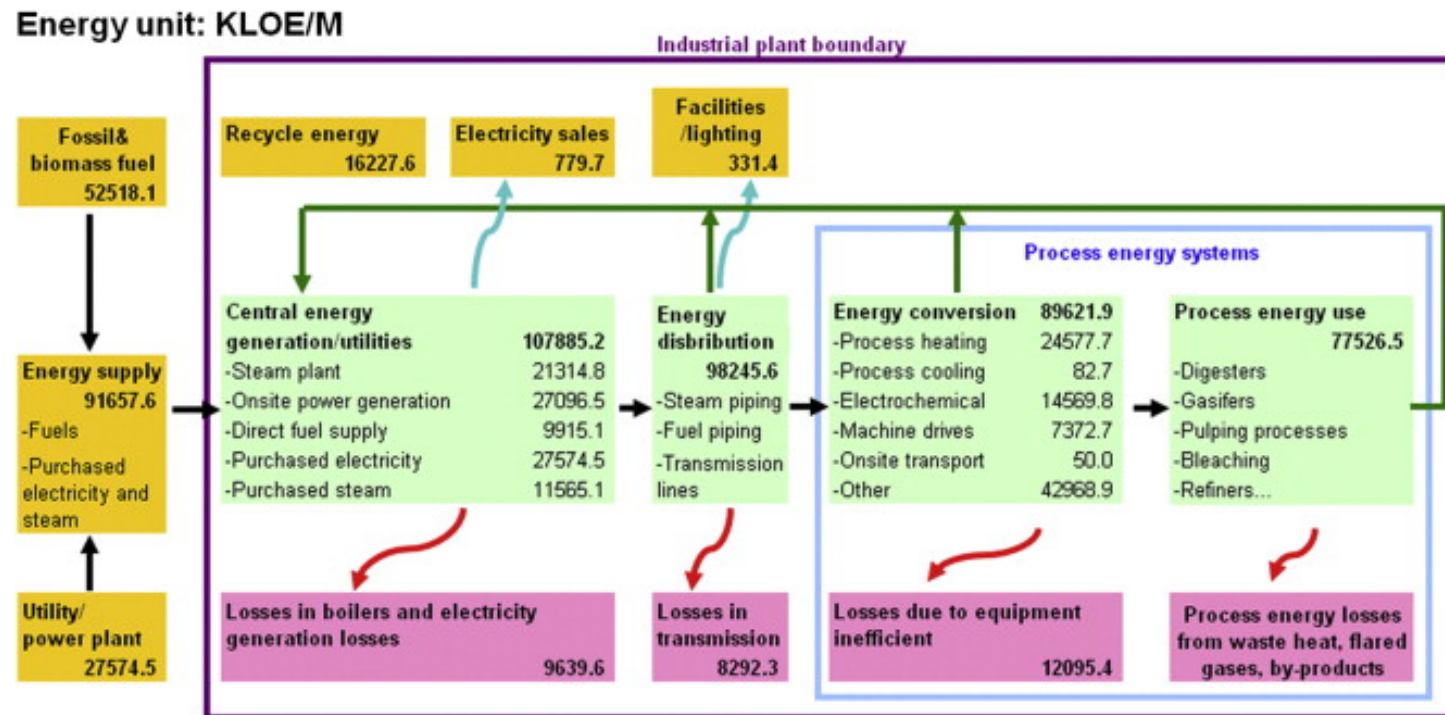
Top 5 Counties with the Greatest Number of Confirmed COVID-19 Cases



The chart below represents the most impacted counties over the past 15 days and the number of cases over time. The table below also represents the number of deaths and hospitalizations in each of those impacted counties.



Energy flow analysis in pulp and paper industry



Hong, Gui-Bing, et al. "Energy flow analysis in pulp and paper industry." *Energy* 36.5 (2011): 3063-3068.

Energy flow analysis in pulp and paper industry

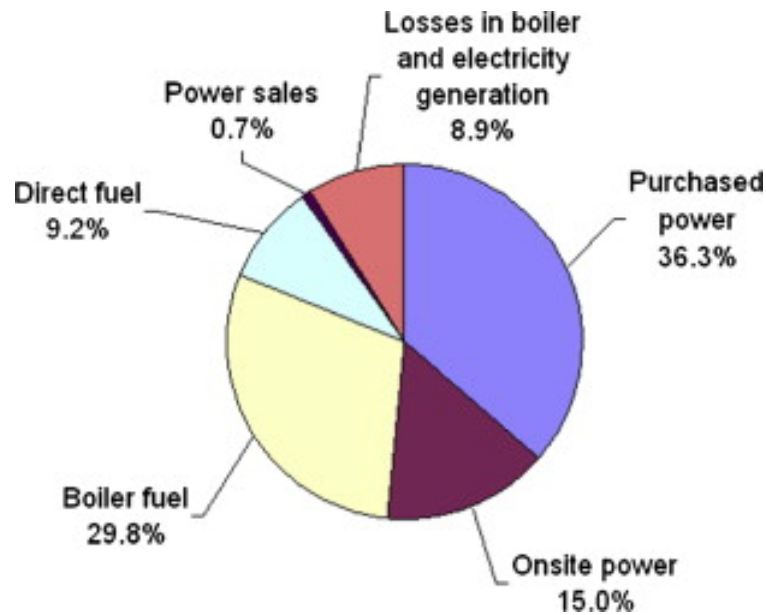


Fig. 3. Primary energy use distribution of Taiwanese pulp and paper industry

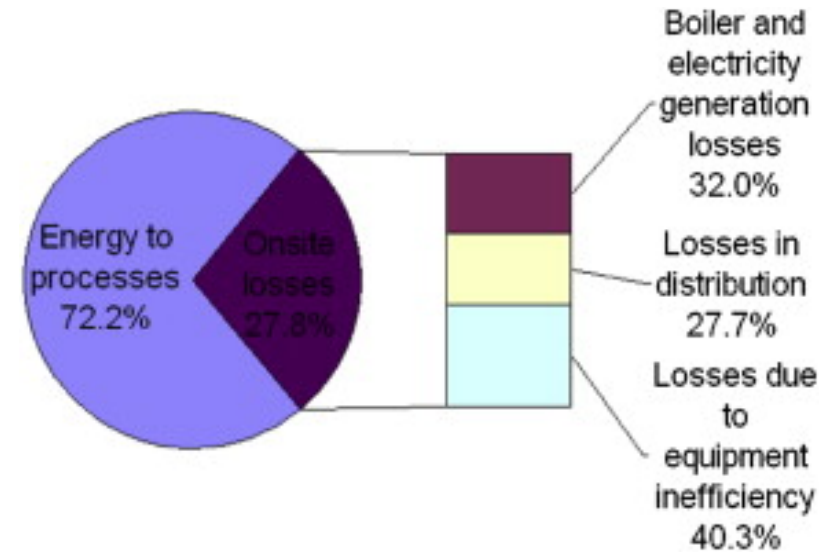
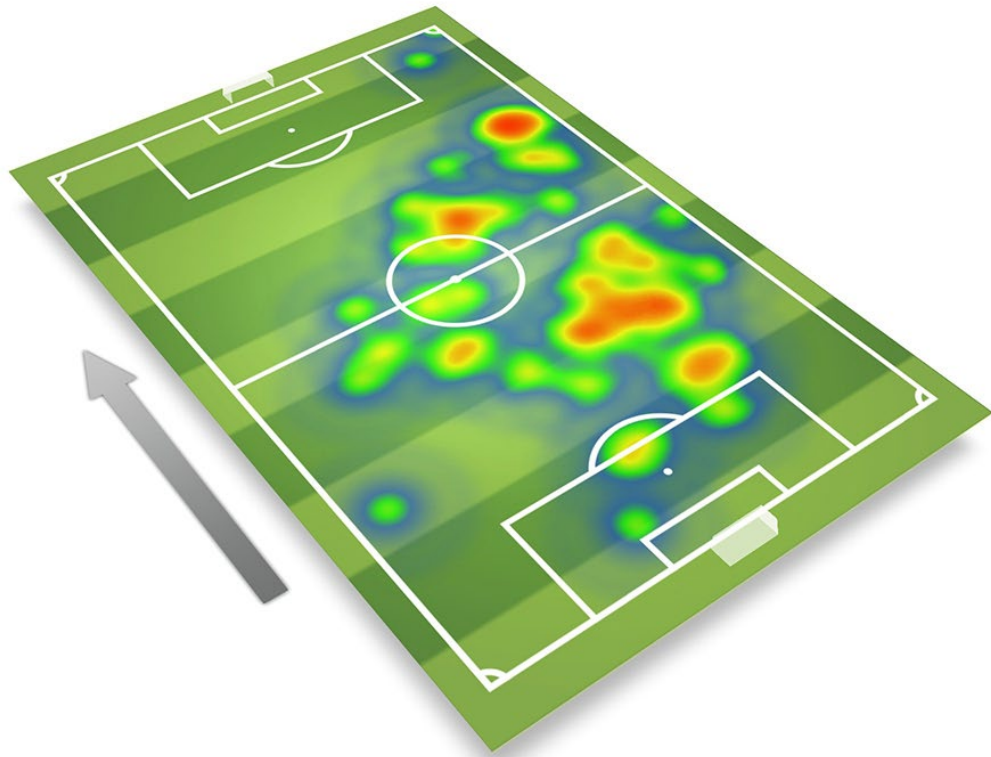


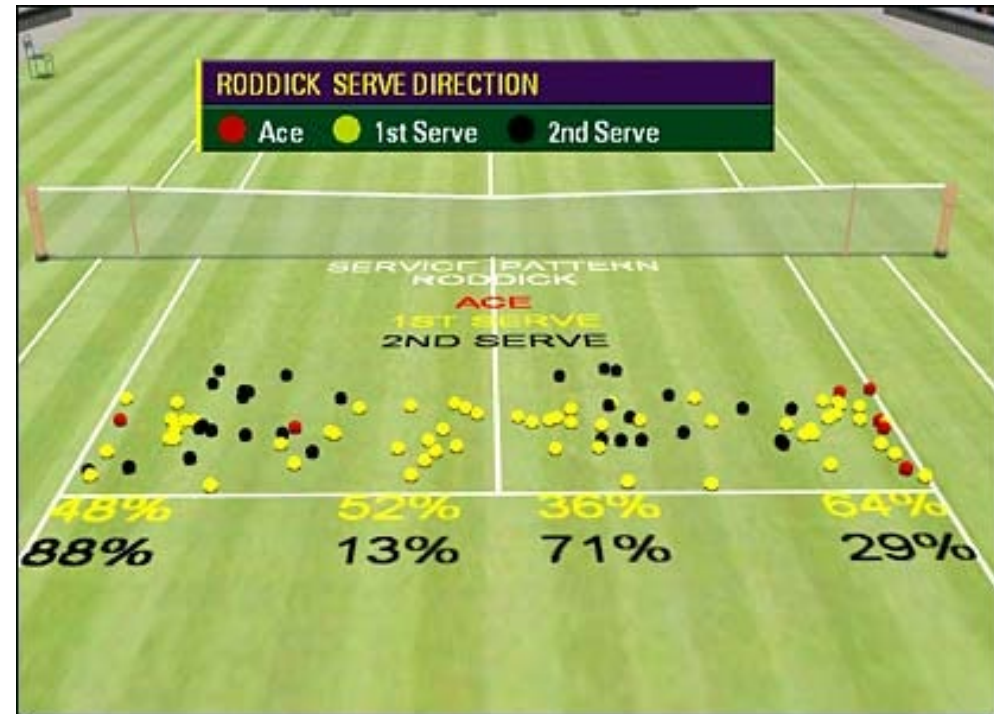
Fig. 4. Onsite energy loss profile of Taiwanese pulp and paper industry.

Hong, Gui-Bing, et al. "Energy flow analysis in pulp and paper industry." *Energy* 36.5 (2011): 3063-3068.



Raul Meireles
Deutschland - Portugal

<http://www.optasports.de/media/299686/spiegel-meireles-heatmap.jpg>



http://newsimg.bbc.co.uk/media/images/41263000/jpg/_41263791_roddickserve_stats416.jpg



Ways Writers Use Misleading Graphs

What are the main errors that we can make when generating a graph?

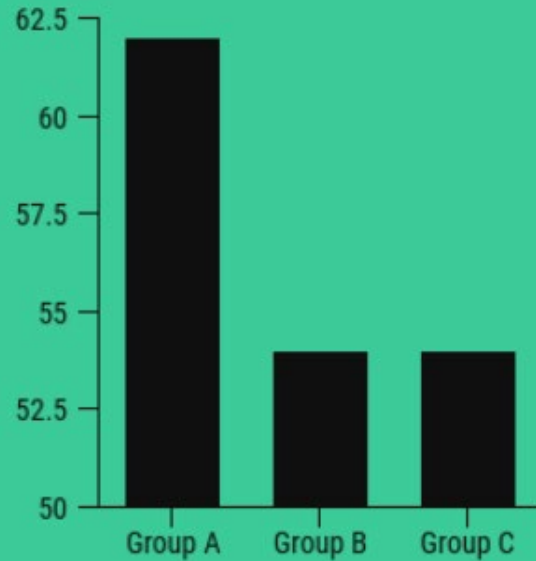
Discuss as a group which errors are most typical and list the results on the Etherpad by degree of severity.

Time: 5 min

1

OMITTING THE BASELINE

In most cases, the baseline for a graph is 0. But writers can skew how data is perceived by making the baseline a different number. This is known as a “truncated graph”.



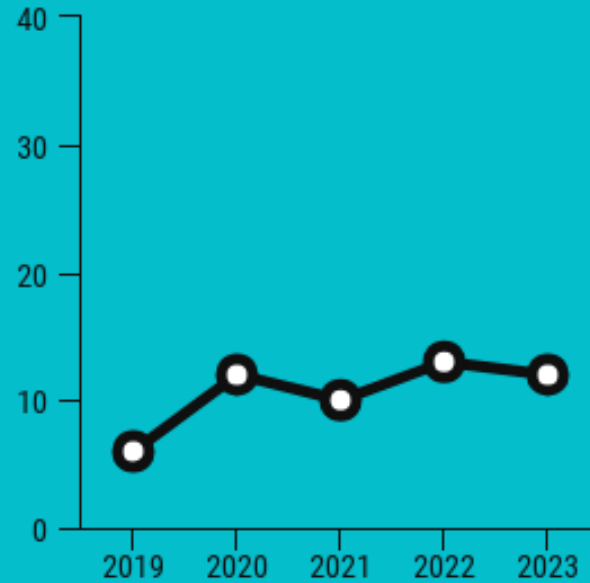
MISLEADING

- Starting the vertical axis at 50 makes a small difference between groups seem massive
- Group A looks much larger than Groups B and C

2

MANIPULATING THE Y-AXIS

Expanding or compressing the scale on a graph can make changes in data seem more or less significant than they actually are.



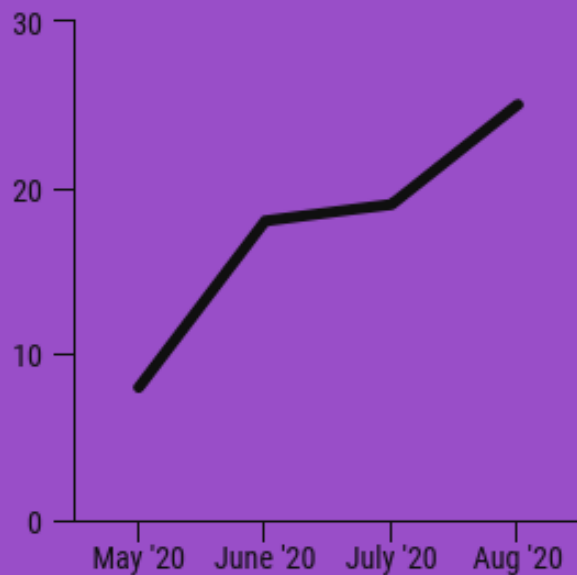
MISLEADING

- The scale is disproportionate to the data, making the change over time seem small

3

CHERRY PICKING DATA

Writers may only include certain data points on their graphs to reinforce their narratives. This can create a false impression of the data.



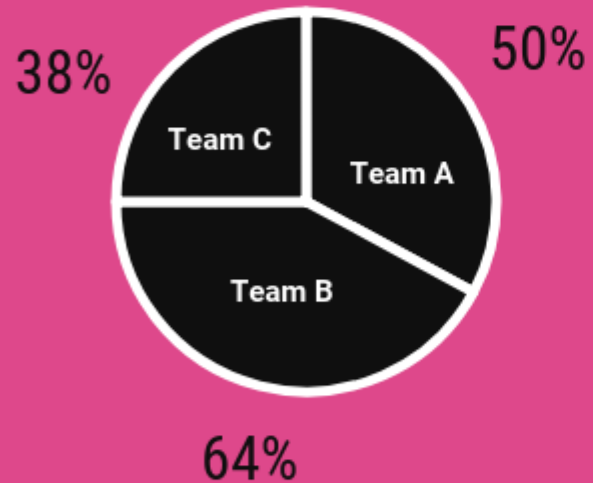
MISLEADING

- Only a few months out of the year are graphed, depicting an upward trends

4

USING THE WRONG GRAPH

The type of graph you use should depend on the type of data you want to visualize. Using the wrong type of graph can skew the data. Writers will sometimes use the wrong type of graph on purpose.



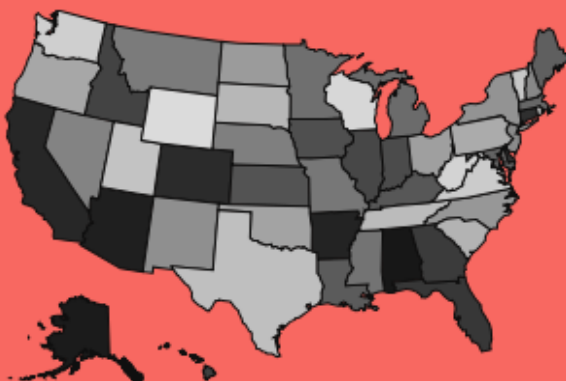
MISLEADING

- Pie charts are used to compare parts of a whole, not the difference between groups
- A different type of graph should be used to compare the three teams

5

GOING AGAINST CONVENTIONS

Over time, we have developed standards for how data is visualized. Flipping those conventions can make a graph confusing or misleading to readers.



Individuals per km

**MISLEADING**

- Normally, darker shades are associated with density on a map but here, dark has been used to depict lower population density
- This graph can confuse and mislead readers, who expect dark to represent a higher population density

$$\mathbf{x} = \mathbf{x}_f - \mathbf{x}_i \quad \Delta \mathbf{v} = \mathbf{v}_f - \mathbf{v}_i$$

$$= \frac{\Delta \vec{r}}{\Delta t} \quad \vec{a} = \frac{\Delta \vec{v}}{\Delta t}$$

$$v = |\mathbf{v}| = \sqrt{v_x^2 + v_y^2}$$

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$$= \mathbf{v}_0 + \mathbf{a}t$$

$$= \mathbf{x}_0 + \mathbf{v}_0 t + \frac{1}{2} \mathbf{a}t^2$$

$$-v_o^2 = 2a(x - x_o)$$

$$= \frac{v_f + v_i}{2} \Delta x$$

A Brief History of Data Visualization

$$\omega = \omega_0 + \alpha t$$

$$\theta = \theta_0 + \omega_0 t + \frac{1}{2} \alpha t^2$$

$$\omega_o^2 = 2\alpha(\theta - \theta_o)$$

Curvefit Rankings for 0.5% SEV CO₂

Rank	F-statistic
1	7.962883557
2	7.8601110639
3	7.5283512645
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 Fax: +49 8551 91764 69

$$x = A \cos(\omega t + \phi) \quad v = -A \omega \sin(\omega t + \phi)$$

NUMERICAL ORDER

Topic occurrences per page (drag to select interval)



CHRONOLOGICAL ORDER

Pages per year (drag to select interval)



Show **all pages** active pages in **numerical** chronological order

Reset selection



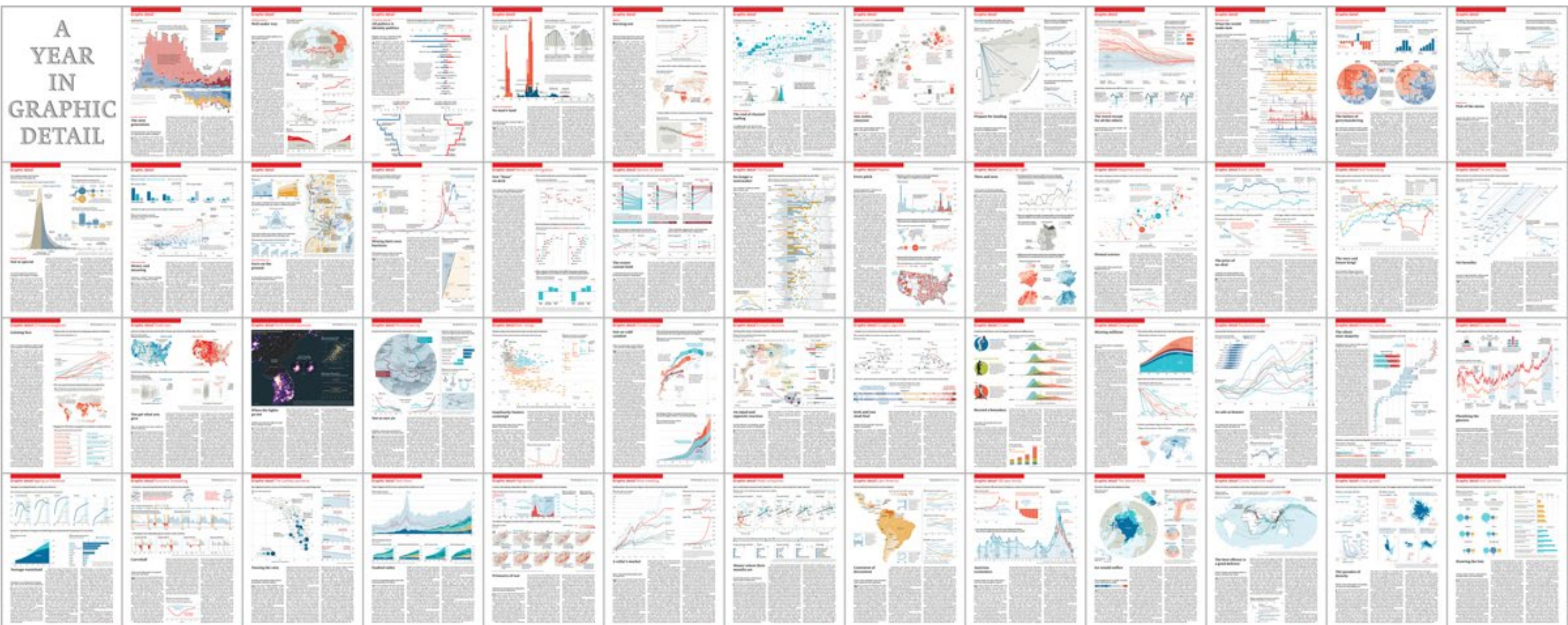
SUBJECTS

Click to select one or more subjects

Geometry and Algebra	1,341 Occurrences
Physics and Natural Sciences	1,004 Occurrences
Tools and Machines	904 Occurrences
Architecture and Applied Arts	496 Occurrences
Human Sciences	429 Occurrences

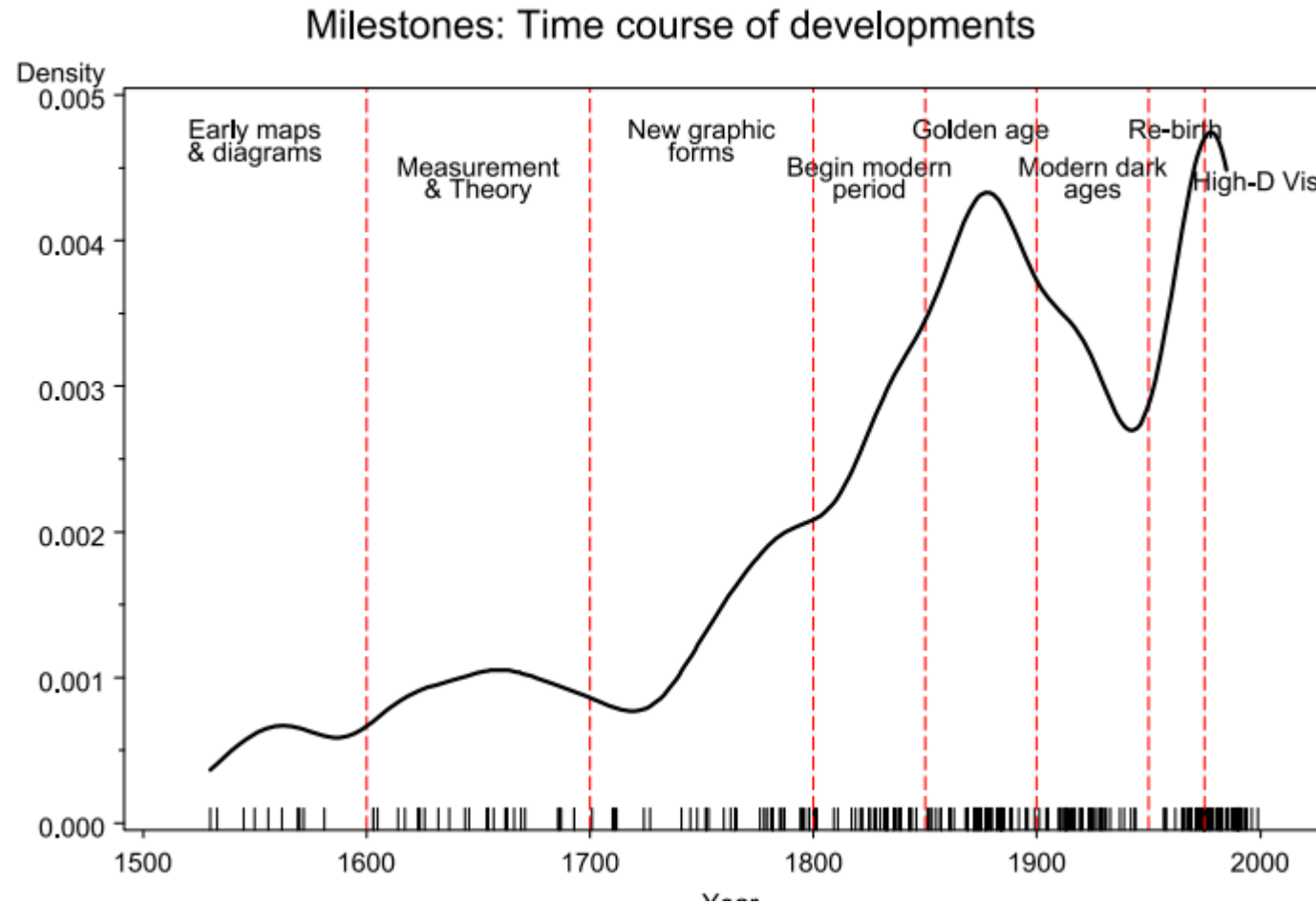
The Codex Atlanticus won the 2019 Gold Kantar Information is Beautiful Award in the Art and Entertainment category

1,119 SELECTED PAGES



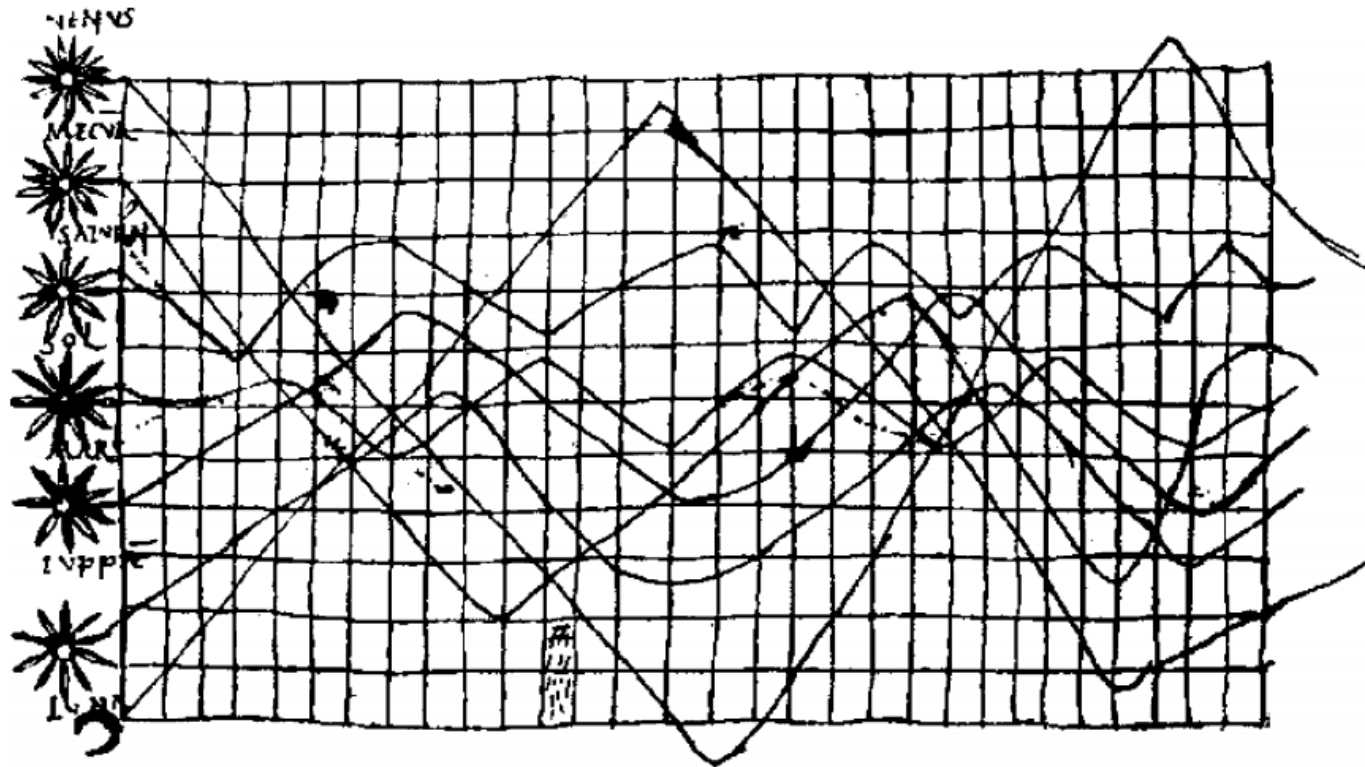
The Economist print version started a new section for their Graphic Detail series in 2018

A Brief History of Data Visualization



Michael Friendly, 2008. A Brief History of Data Visualization, in: Handbook of Data Visualization, Springer

Pre-17th Century: Early Maps and Diagrams



- Positions of stars: Diagrams, geometric diagrams
- Notion of a coordinate system
- Graph paper
- Proto-bar graph
- Trigonometric tables
- Modern cartographic atlas

Figure 1.2. Planetary movements shown as cyclic inclinations over time, by an unknown astronomer, appearing in a 10th-century appendix to commentaries by A.T. Macrobius on Cicero's *In Somnium Sciponis*. Source: Funkhouser (1936, p. 261)



Exercise

Divide into seven groups and read together the section on the evolution of data visualization.

List the most important points as a table on the Etherpad dedicated to your section.

Time: 25 min



Exercise

Generate a glossary of all terms referring to data visualization techniques. To do this

1. Start by selecting a list of terms that appear in your section.
2. look for those terms that are repeated in several sections.
3. Find definitions that satisfy the views of all the groups that identified that term.

Time: 15 min

The objective is not to copy and paste definitions from the Internet, but to write the text in their own words. Be creative!!!

Data Visualization & Statistics

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$$= \frac{\Delta \vec{r}}{\Delta t} \quad \vec{a} = \frac{\Delta \vec{v}}{\Delta t}$$

$$v = |\mathbf{v}| = \sqrt{v_x^2 + v_y^2}$$

$$\theta = \tan^{-1}\left(\frac{v_y}{v_x}\right)$$



$$\omega = \frac{\Delta \theta}{\Delta t} \quad \alpha = \frac{\Delta \omega}{\Delta t}$$

$$= \mathbf{v}_0 + \mathbf{a}t$$

$$= \mathbf{x}_0 + \mathbf{v}_0 t + \frac{1}{2} \mathbf{a} t^2$$

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$$= \frac{v_f^2 + v_i^2}{2}$$

$$\omega = 2\pi f \quad f = \frac{1}{T}$$

$$\omega = \omega_0 + \alpha t$$

$$\theta = \theta_0 + \omega_0 t + \frac{1}{2} \alpha t^2$$

$$\omega_0^2 = 2\alpha(\theta - \theta_0)$$

Curvefit Rankings for 0.5% SEV CO₂

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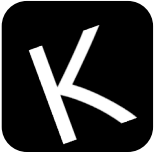
WHY STATISTICS?



1. Statistics is defined as a branch of mathematics or science that deals with the collection, analysis and interpretation of numerical information.
2. Statistics changes numbers into information...
3. Statistics is the art and science of deciding:
 1. What is the appropriate data to collect,
 2. Deciding how to collect them efficiently
 3. and then using them to give information (answer questions and make decisions)
4. Statistics is making decisions when there is **uncertainty**

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An Introduction to Statistic Analysis and Data visualization



Uses of dataviz in Stats

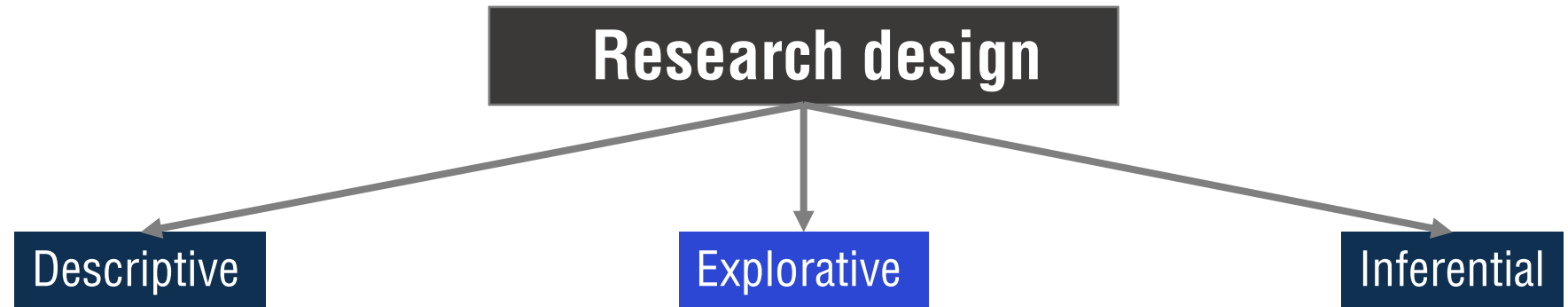
- I do not understand the data!
- How do I choose my dependent and explanatory variables?
- What statistical tools should I use?
- How can I compare different methods/models?
- How do I show my results?

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WHY STATISTICS?



Procedure for the determination of the study design



Explorative

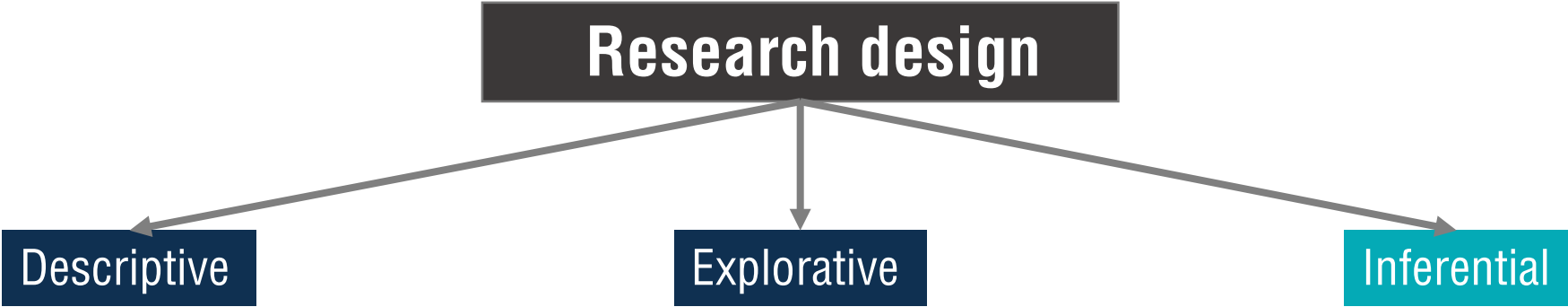
"An exploratory investigation serves to first understand and structure the (usually still relatively unexplored) topic of investigation in detail. Relationships among the variables under consideration may be explored, and the exploratory nature of the investigation is manifested in the fact that no hypotheses about such relationships are formulated before the data analysis is conducted."

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WHY STATISTICS?



Procedure for the determination of the study design



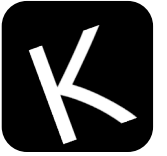
Inferential

"In the context of an explicative investigation, the focus is on causes of observed phenomena. Accordingly, it is concerned with relationships between variables, but here they are considered on the basis of hypotheses formulated in advance."

Homburg & Krohmer 2009, S. 250

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Basic Statistics Concepts



- Mean (average)
- Median
- Mode
- Covariance
- Variance
- Standard deviation
- z-value
- Percentiles
- Probability distribution
- Sampling



Scales - Overview

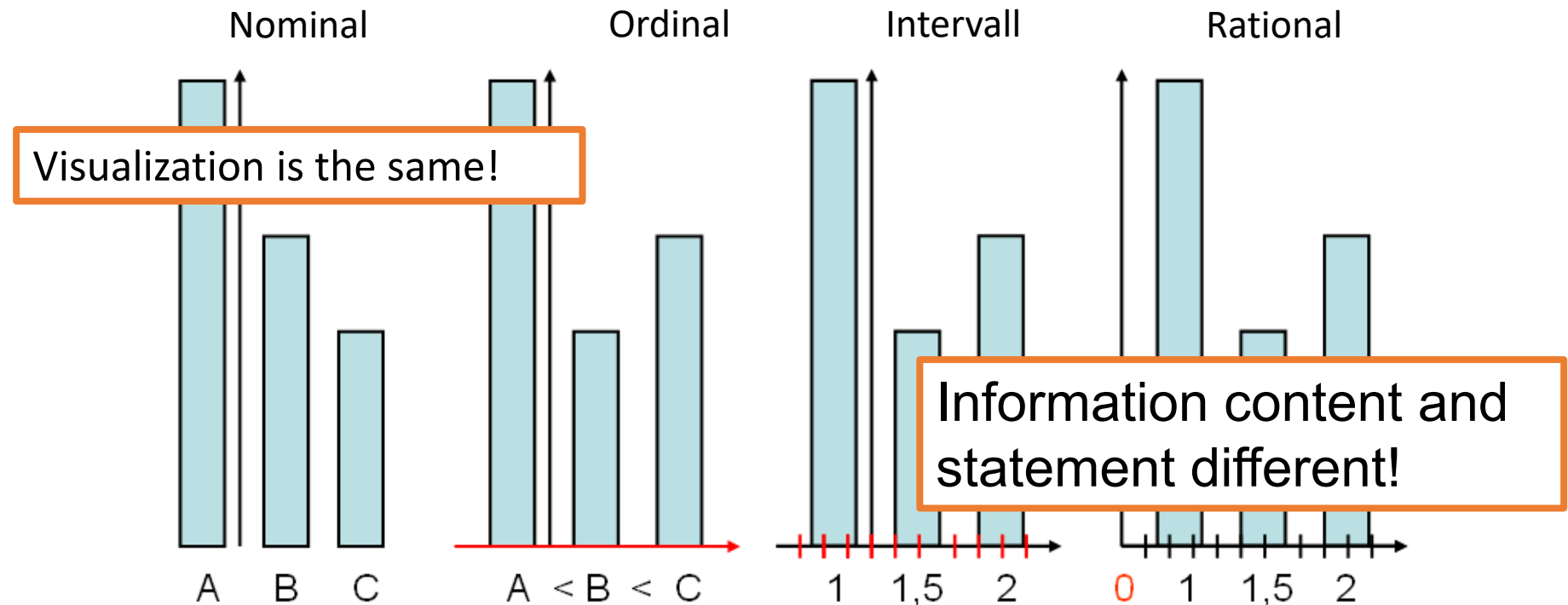
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Scales	Information	Description	Delimitation	Central tendency	dispersion	Example
Nominal	$A = B$ und $A \neq B$	Classification / codification of qualitative characteristics -> Real numbers are possible (code)	Designation of qualitative characteristics, the expression of which is not subject to ranking	Frequency Density		Sex job Name Postal code ...
Ordinal	$A = B$ und $A \neq B$ $A > B > C$	Ordered values / ranking -> Real numbers are possible	Ranking of qualitative characteristics, the expression of which is subject to natural ranking	Frequency Density Median Quartiles Percentile	Median- Deviation Range Interquartile range	School marks Efficiency levels Sport ...
Intervall	$A = B$ und $A \neq B$ $A > B > C$ $d = A + B$ $d = B - A$ Gleichheit von Intervallen	Scale with constant distances and arbitrary zero point	Measurement of quantitative characteristics with constant distances and arbitrary zero point	Frequency Density Median Quartiles Percentile Arithm. Mean	Additionally: Standard deviation Variance	Day of the month IQ ...
Rational	$A = B$ und $A \neq B$ $A > B > C$ $d = A + B$ $d = B - A$ $c = A * B$ $c = A / B$ Equality of ratios	Scale with true zero point -> Exactly comparable measuring ratios	Measurement of quantitative characteristics with natural zero point	Frequency Density Median Quartiles Percentile Arithm. Mean Geom. Mean Harmon. Mean	Additionally: Coefficient of variation	Length Area Weight Volume ...



Scales - Summary

In addition to the evaluation and interpretation, the visualisation of the data must also be considered





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Exercises



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Basic Statistics

Exercise 1

Indicate the scale level for the following examples!

Indicate the scale level for the following examples!

	Nominal	Ordinal	Interval	Ratio
Sex				
Social class				
Income tax				
Temperature in C				
Wind speed m/s				
Body weight				
School grades				
Exam points				
Time				
Eye colour				
Duration of treatment at the doctor				
Preferences				





Indicate the scale level for the following examples!

	Nominal	Ordinal	Interval	Ratio
Sex	X			
Social class		X		
Income tax				X
Temperature in C			X	
Wind speed m/s				X
Body weight				X
School grades		X		
Exam points				X
Time			X	
Eye colour	X			
Duration of treatment at the doctor				X
Preferences		X		



Exercise 2

Consider methods of empirical measurement for the following variables or empirical observations!



Consider methods of empirical measurement for the following variables or empirical observations!

	Method(e)n	Skala(en)
Internet Speed		
Cognitive stress		
Precipitation		
Volume		
Sportiness		



Consider methods of empirical measurement for the following variables or empirical observations!

	Method (s)	Scale(s)
Internet Speed	Measuring the Down- und Upload rate	Ratio scale
Cognitive stress	Survey Brain activity measurement (EEG)	Ordinal- or Interval scale Ratio scale
Precipitation	Measure (precipitation sensor)	Ratio scale
Volume	Measure (microphone)	Ratio scale
Sportiness	Competition Measure (time) Observation	Ordinal scale Ratio scale Ordinal scale

$$\mathbf{x} = \mathbf{x}_f - \mathbf{x}_i \quad \Delta \mathbf{v} = \mathbf{v}_f - \mathbf{v}_i$$

$$= \frac{\Delta \vec{r}}{\Delta t} \quad \vec{a} = \frac{\Delta \vec{v}}{\Delta t}$$

$$v = |\mathbf{v}| = \sqrt{v_x^2 + v_y^2}$$

$$\theta = \tan^{-1}\left(\frac{v_y}{v_x}\right)$$



$$\omega = \frac{\Delta \theta}{\Delta t} \quad \alpha = \frac{\Delta \omega}{\Delta t}$$

$$= v_0 + at$$

$$= x_0 + v_0 t + \frac{1}{2} a t^2$$

$$-v_0^2 = 2a(x - x_0)$$

$$= \frac{v_f^2 - v_i^2}{2a}$$

Assignment

$$\omega = 2\pi f \quad f = \frac{1}{T}$$

$$\omega = \omega_0 + \alpha t$$

$$\theta = \theta_0 + \omega_0 t + \frac{1}{2} \alpha t^2$$

$$\omega_0^2 = 2\alpha(\theta - \theta_0)$$

Curvefit Rankings for 0.5% SEV CO₂

Rank	F-statistic
1	7.962883557
2	7.8601110639
3	7.5283512645
4	7.3357010958
5	6.3801158367
6	3.8079206858
7	3.742891358
8	3.5727028219
9	3.5546937052
10	3.0133372321
11	2.7408796673
12	2.6986270263
13	2.5801276758
14	2.5622800357
15	2.1798855221

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$$x = A \cos(\omega t + \phi) \quad v = -A \omega \sin(\omega t + \phi)$$

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Recommended
PivotTables

Table



Illustrations



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Charts

Charts



PivotChart

3D
Map
Tours

Sparklines



Filters



Hyperlink



Text

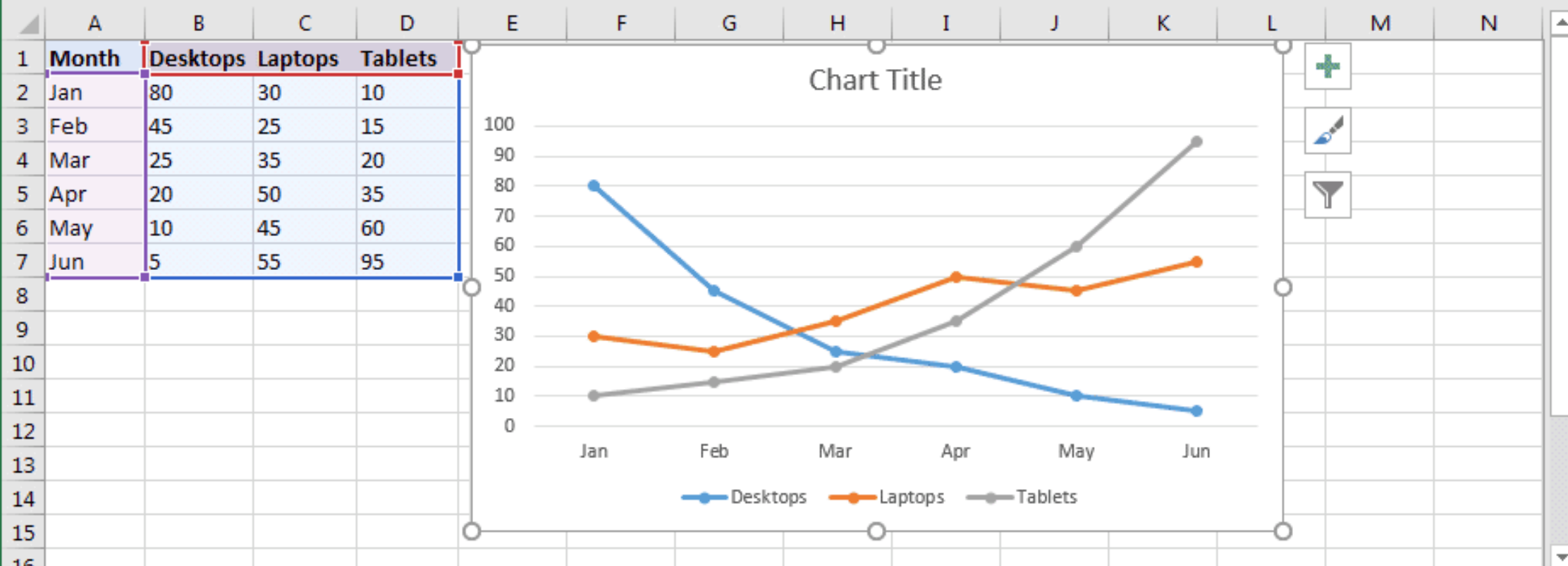


Symbols

Chart 1



fx



Sheet1

Ready

Average: 36.66666667

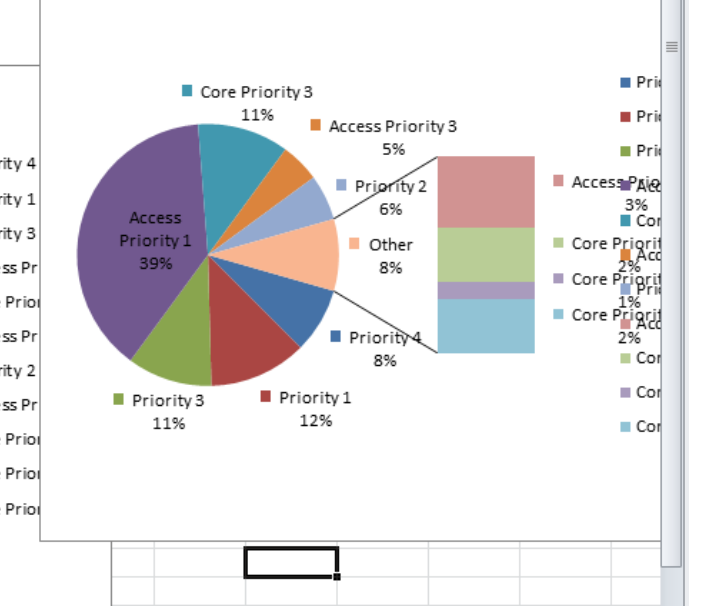
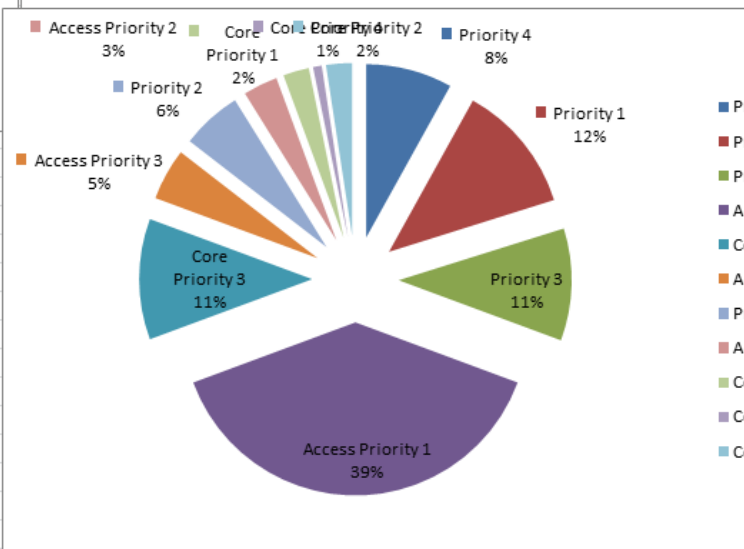
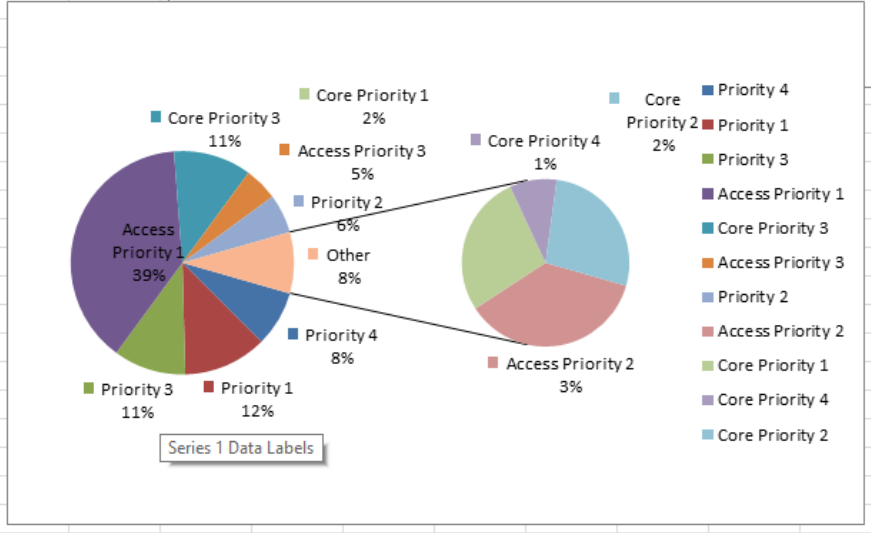
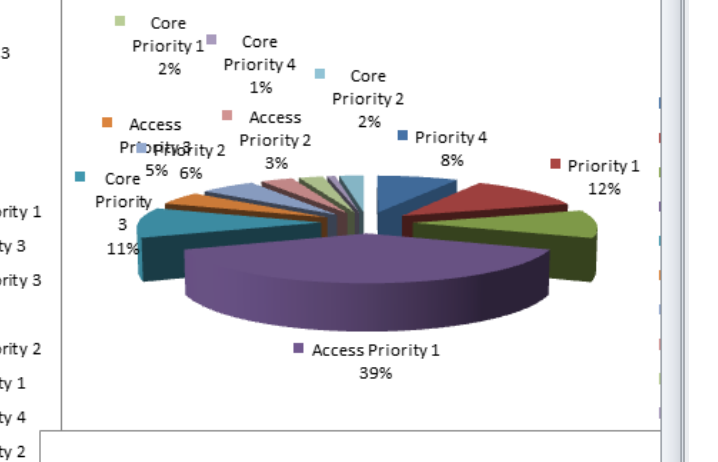
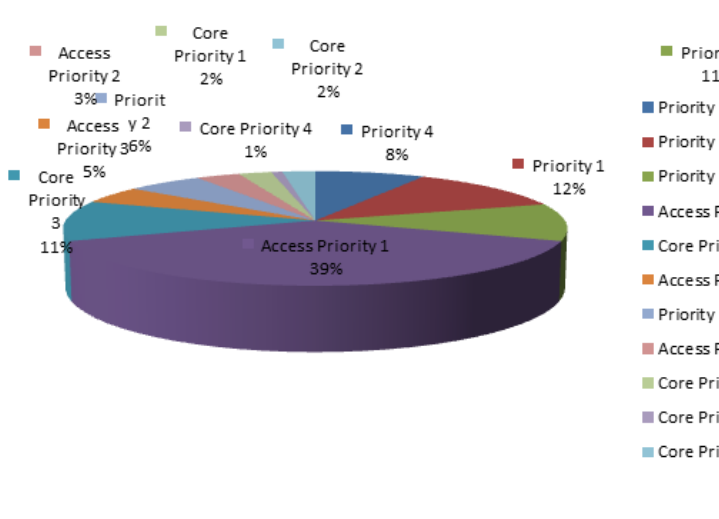
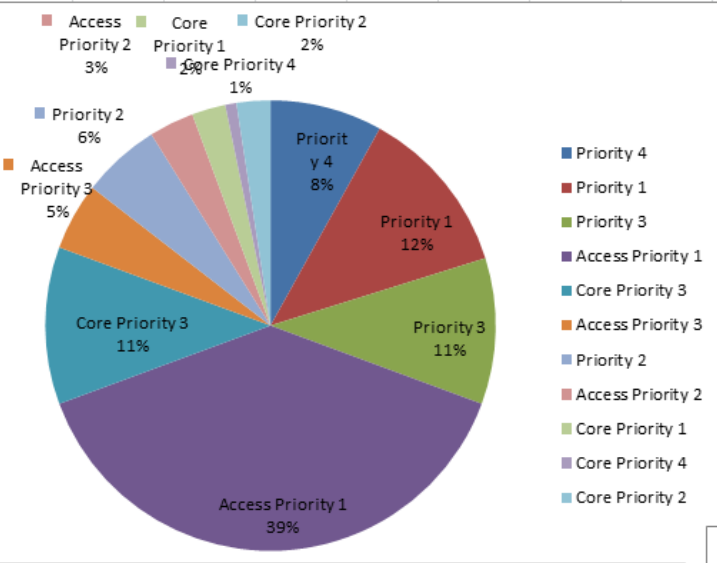
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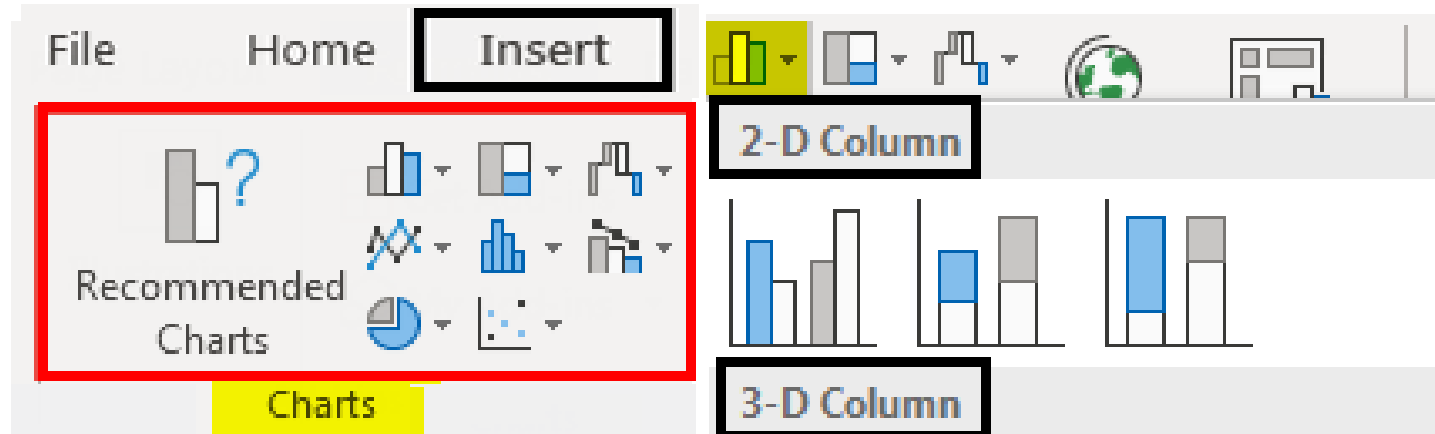


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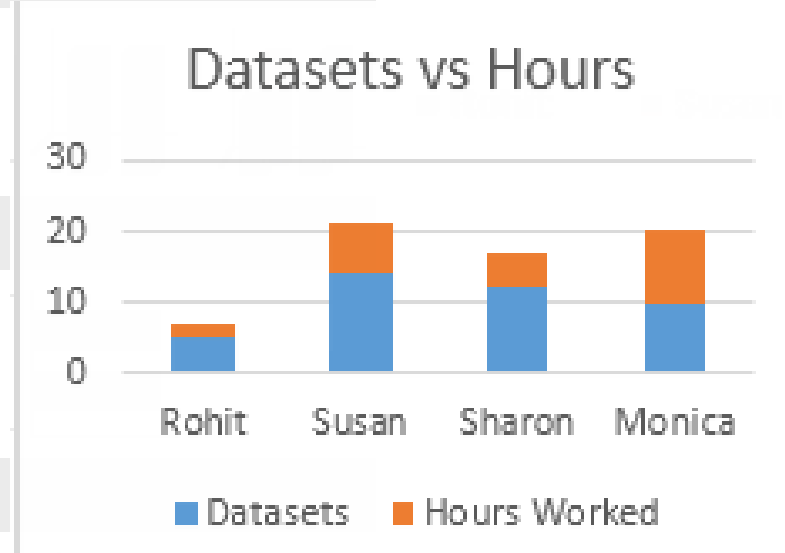
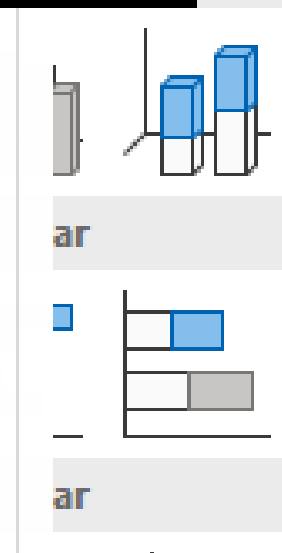
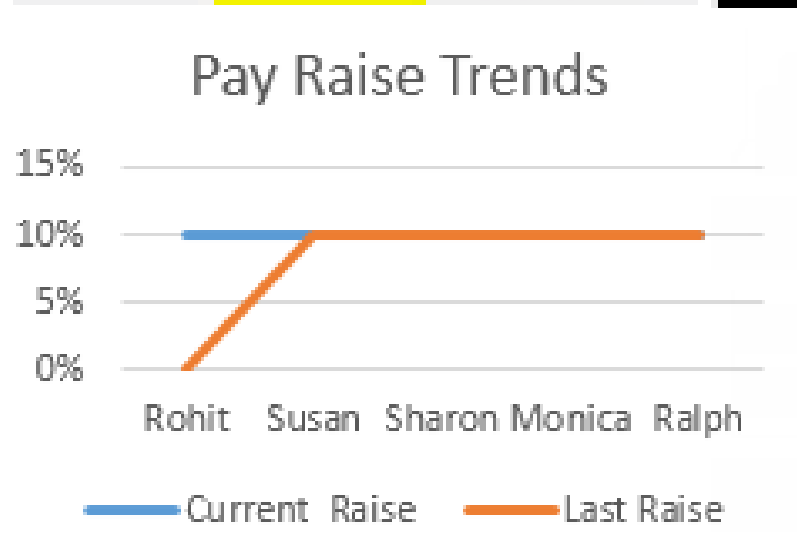
	A	B	C	D	E	F	G	H	I	J	K	L	M	N	O	P	Q	R	S	T	U	V	W	X	Y	Z
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2	Priority 4	10																								
3	Priority 1	15																								
4	Priority 3	13																								
5	Access Pri	48																								
6	Core Prior	14																								
7	Access Pri	6																								
8	Priority 2	7																								
9	Access Pri	4																								
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Types of Graphs in Excel



Datasets





**“The longer you live in the past,
the less future you have to enjoy.”**

— Robert Tew