



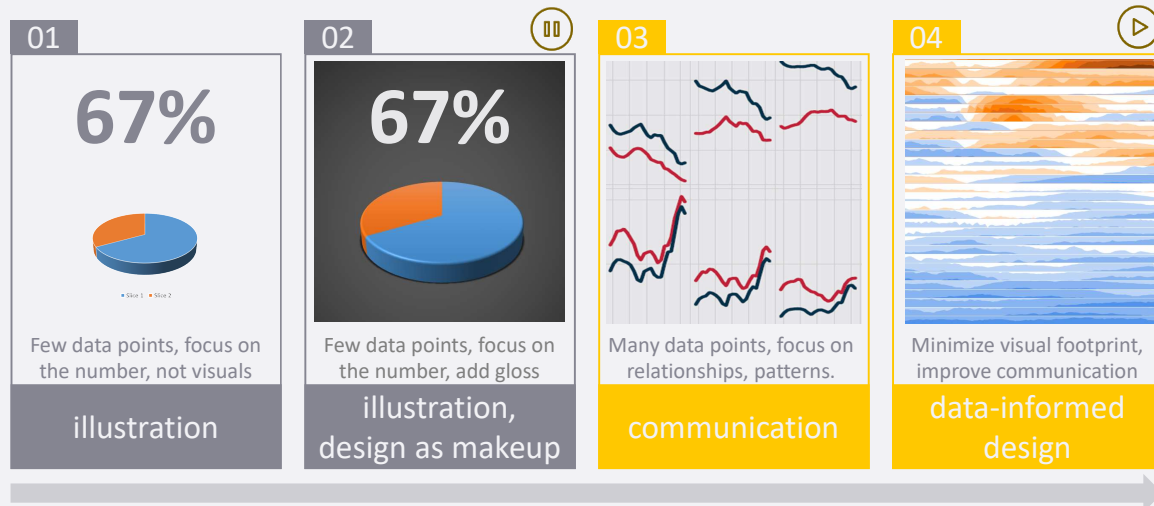
An evaluation of data visualisation practices of statistical institutes



Jorge Camões
NTTS 2017 • Brussels

So, this presentation is titled “An evaluation of data visualization practices of statistical institutes” and I’ll try to show more and tell less.

from illustration to communication



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02

- There was a time when we could focus on individual data points and afford to use colorful but irrelevant visuals (box #1).
- Today, we have many data points and we need to focus on their relationships (box #3).
- Most people are aware of some change, but often they buy into the idea that the answer is adding new makeup to old charts. (box #2).
- Graphic design skills should not be required for run-of-the-mill charts, but we can all learn how some functional design choices impact our visual communication (box #4) and apply them effectively.
- So, this will not be about good or bad, right or wrong practices. It will be about switching perspectives, from illustration to communication.
- We just need to pause our current practices, evaluate them, add a few basic rules and continue.
- Finally, the first rule of data visualization is that you do talk about data visualization, you break the rules and you try to come up with the ones that fit the concrete situation better.

major starting points

01 **eurostat as a case study**
Eurostat is a convenient starting point: relevant at EU level, many charts, many styles, in English.

02 **key issue: awareness**
As we move from illustrating to communicating and thinking visually, awareness and being open to change is the key issue.

03 **issues across institutes**
Most examples in this presentation come from national institutes, to show that these are common practices.

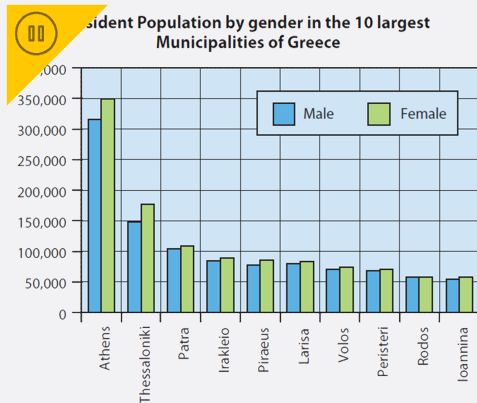
04 **graphic design insensitivity**
Chart design is often a chapter in a design style guide that is not aware of its specific needs. Graphic design alone is not the answer.

05 **new skills are easy**
Breaking inertia is often harder than learning a few new principles and best practices. And they must be practiced.

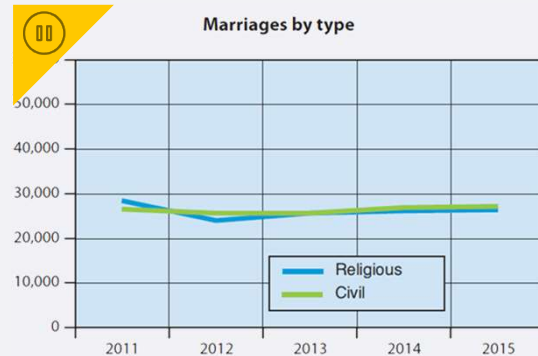
06 **run-of-the-mill charts only**
This presentation is specific to production charts, using common office tools, not requiring programming, artistic talent, or graphic design skills.

- Since this is a change in a widespread perspective, I assumed it would be visible across institutes.
- I started with Eurostat because of convenience alone.
- But most charts you'll see in this presentation come from other sources, especially national institutes.
- I will not discuss tools, but everything here can be done with Microsoft Excel.
- The discussion applies to run-of-the-mill charts (as oppose to design charts or infographics).
- Programming, artistic talent or graphic design skills are not required.

think about the data



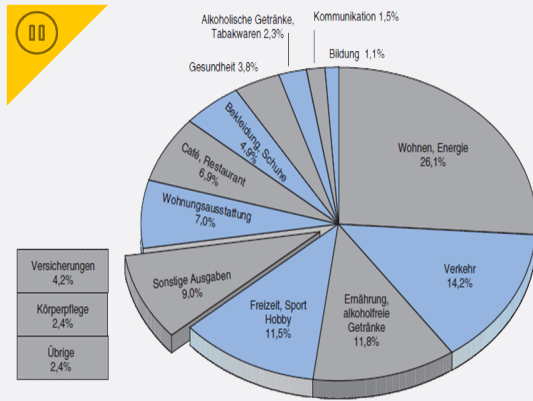
is **gender** relevant here?



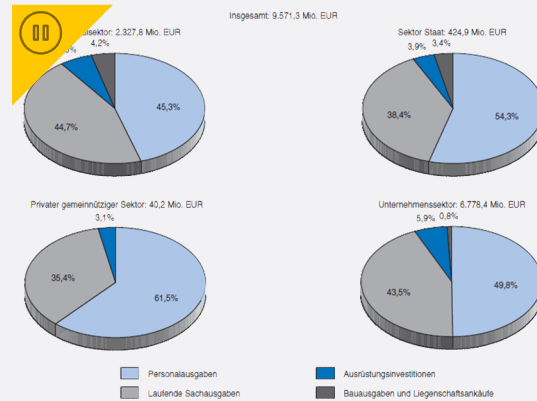
are **absolute** values relevant here?

- The data must always be our starting point
- We need to decide first how relevant or interesting it looks in a chart
- for example, should we present absolute values or focus on ratios or rate of change?

things that belong to the past: everything 3D



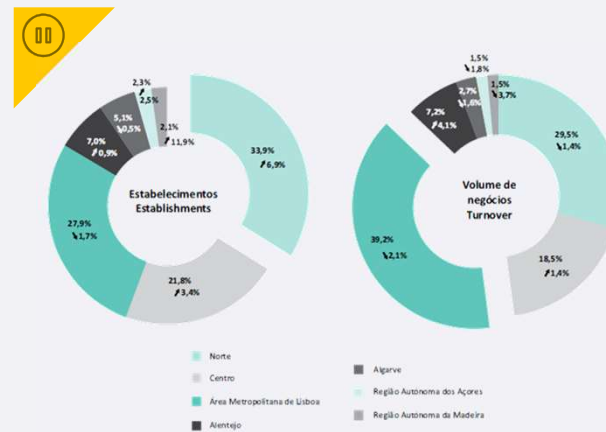
3D pie charts



Comparing 3D pie charts

- Some formatting options are no longer acceptable
- the 3D effects come at the top of the list.

things that belong to the past: exploded slices, comparing circular charts

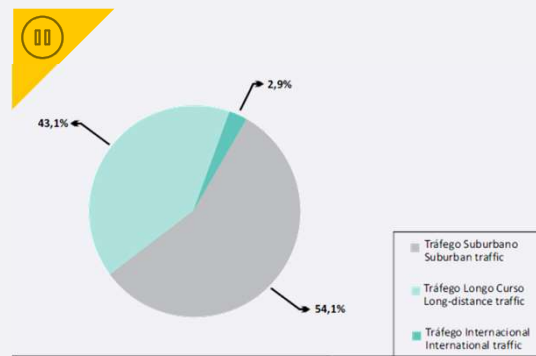


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06

- Exploded slices should also be avoided

things that belong to the past: legends in circular charts

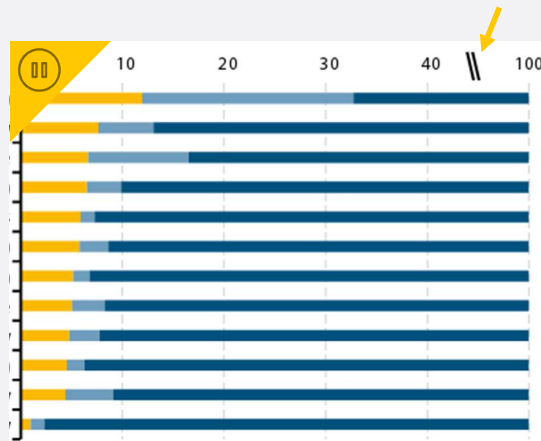


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07

- Think of a legend as a necessary evil.
- Even more so with circular charts.
- Avoid it if possible
- Because direct labeling is usually better.

things that can't happen:
breaking scales in part-of-whole charts

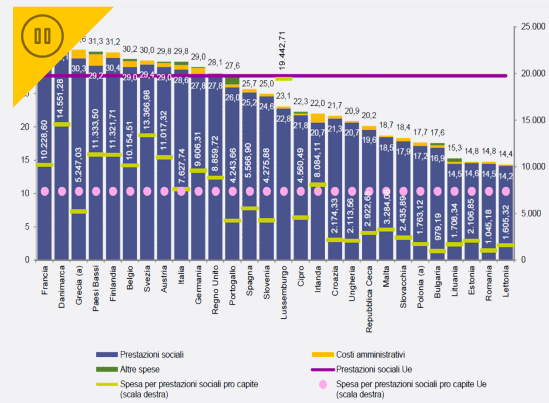
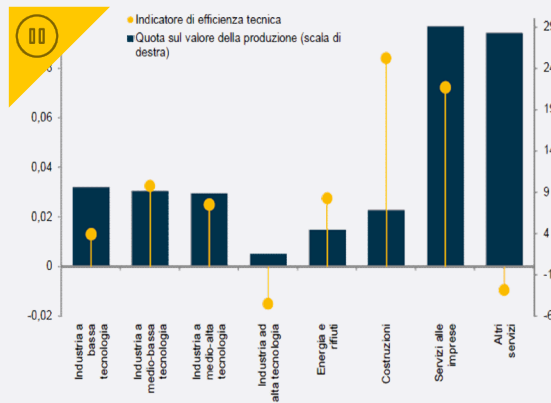


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08

- Part-of-whole charts mean that the whole must be represented,
- and breaking the scale is not an option.

things that should be avoided: dual-axis charts



we are tempted to adjust scales to
“discover” relationships.

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09

- Dual-axis are dangerous,
- Because we are tempted to adjust the scales to find relationships that may or may not exist.

things that should be avoided: in dual-axis charts, not color-coding the axes

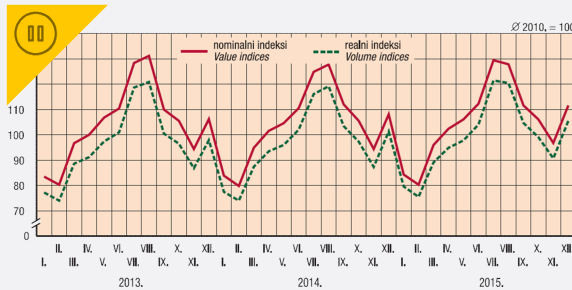


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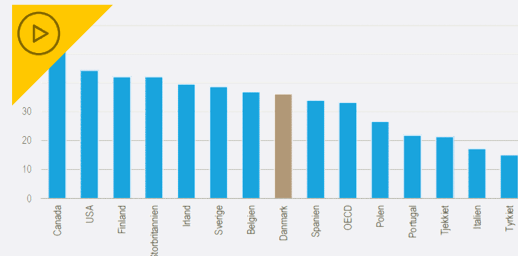
010

- If you still need two axes then make sure the readers see which series belong to which axis.
- Don't simply write it in the legend.

things that must be there in a supporting role only:
gridlines too loud, and/or too many



(You probably don't need more than 5 gridlines.)



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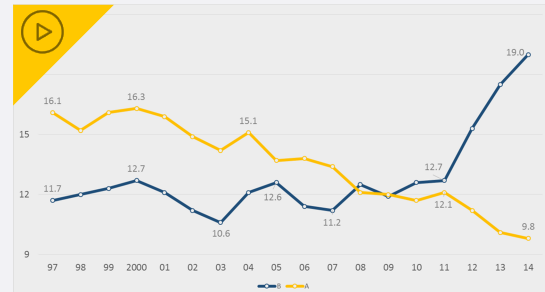
011

- The gridlines in the first chart are very loud.
- Gridlines are used in a supporting role,
- so they have to be muted to let the data shine.
- 3 to 5 gridlines are enough in most cases.

things that must be there in a supporting role only:
data labels too loud, and/or too many



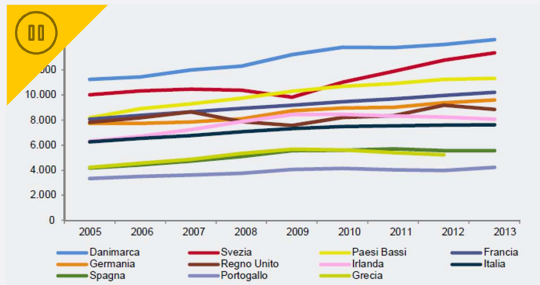
Don't turn a chart into a table.
Use a table if you need it.



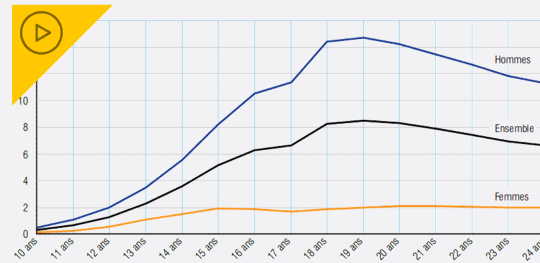
Select the more meaningful data points and use a shade of gray.

- A chart is not a table.
- If you need to show the data use a small table close to the chart.
- Otherwise, label only a few relevant data points.

things that must be there in a supporting role only: legends



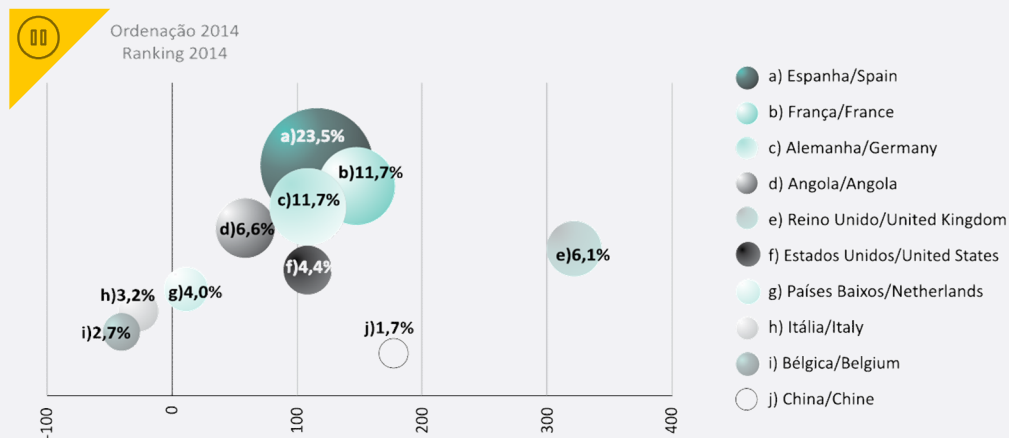
Too many series.



Direct labeling is better than a legend.

- The first chart is too busy,
- most users will not bother to read because, you know, readers are lazy. Or maybe not.
- If you can't use direct labeling in a line chart probably you are using too many series.

things that must be there in a supporting role only:
legends with a dual authentication system?

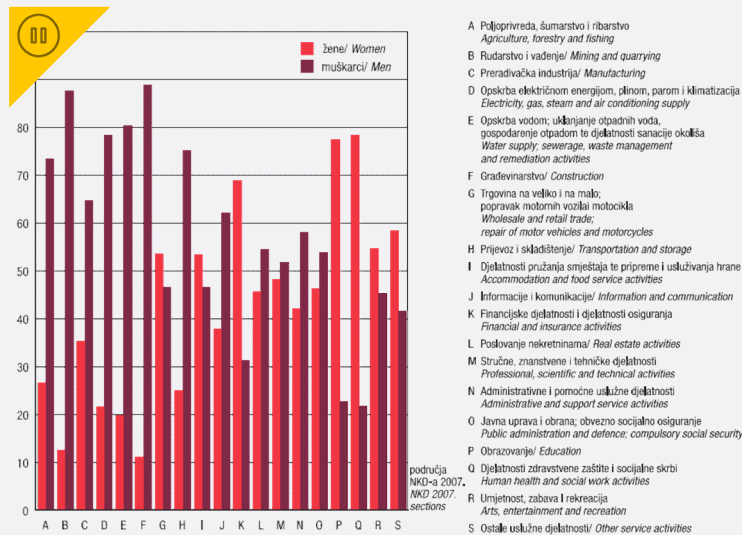


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014

- I called this technique a “dual authentication system”
- because it makes even harder to identify each data point.
- This dual authentication system is something that you clearly need to avoid.

things that must be there in a supporting role only: legends with a dual authentication system?



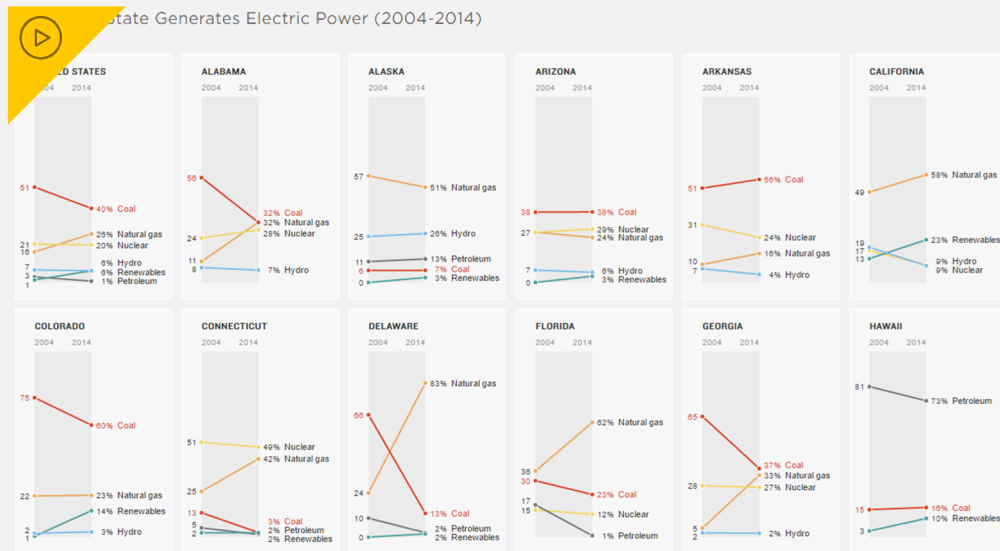
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Also: what is the message?

015

- A different version of the “dual authentication system”.
- It’s very hard to learn something from this chart.

busy charts can often be turned into small multiples



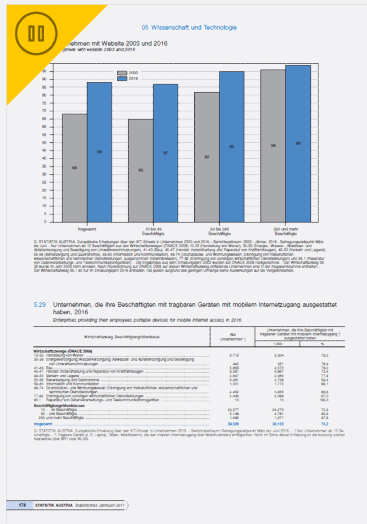
Source: NPR
(<https://goo.gl/enzzOR>)

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016

- The small multiples technique is often a good alternative when a chart is too busy.

size (and aspect ratio) matters: inefficient page space management



Vegetabilsk produktion

Den vegetabilsk produktion er i sigens natur tæt knyttet til nævnt anvendes hovedparten af arealet til kornproduktion, lter er hvede og byg. Korn tegner sig derfor også for størst mens afgrøder til grovfoder til kvæg tegner sig for den næst v

Produktionen kan deles op i tre grupper: Produkter, som enten direkte eller efter industriel forarbejdning; produkter til husdyr; samt en tredje gruppe, der omfatter blomster o food afgrøder.

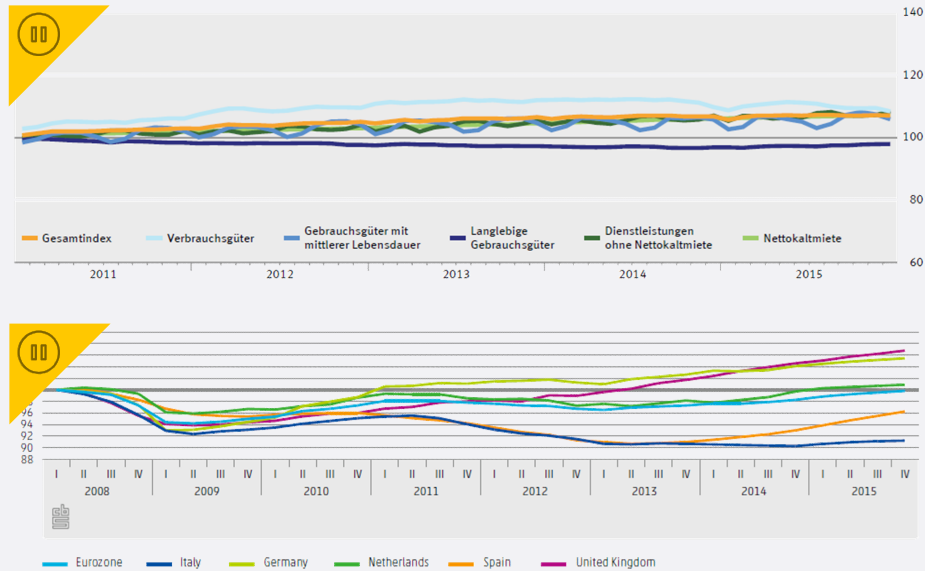
Gruppen af fødevarer, der kan anvendes direkte, omfatter i og grøntsager dyrket på friland og i væksthuse, mens kart sukkerroer samt dele af produktionen af korn og industrif anvendes som levnedsmidler. Den vegetabilsk produktion i lag for den animalske produktion i landbruget, idet den er i kilde til husdyrenes foderforbrug.

Ud over korn, hvor en stor del af produktionen anvendes i lang række græs- og grønfoderafgrøder, som primært anven 3 er vist de seneste års udvikling i det samlede høstudbytte i duktion, dog undtaget frugt, grøntsager og andre gartneripre

Small charts, next to the text.

- Most charts are much larger than needed.
- The chart on the left uses almost half a page to display only 8 data points.
- Many charts can be replaced by smaller versions,
- Place them near the text discussing the data.

size (and aspect ratio) matters: the swimming pool effect

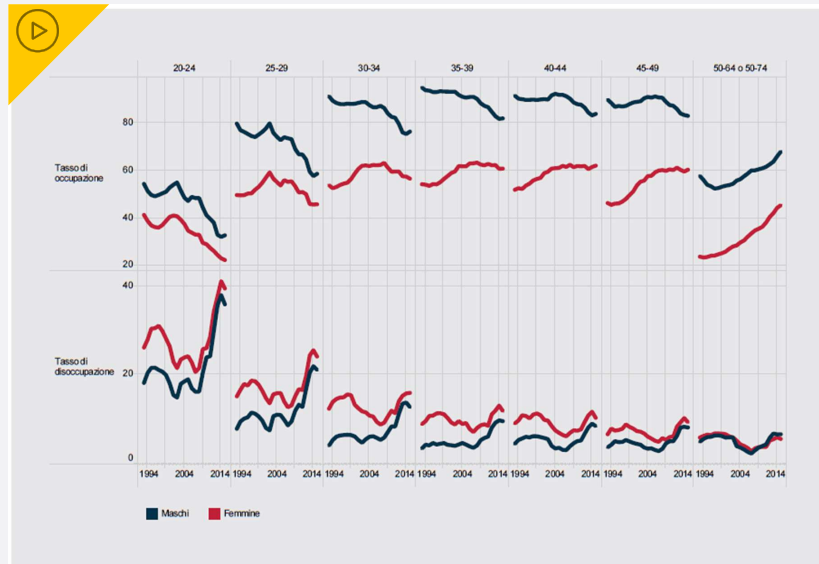


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018

- There are many examples of what I call the swimming pool effect
- By that I mean charts too wide and with an aspect ratio of 4:1 or even more.
- This reduces vertical resolution.
- There are no specific guidelines,
- but taking into account the human field of vision and common aspect ratios in use,
- probably a chart shouldn't be stretched above a 2:1 ratio.

a **panel chart** is a solution to the swimming pool effect



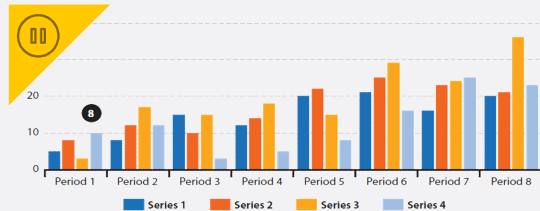
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019

- Again, small multiples could be an interesting alternative.

color management

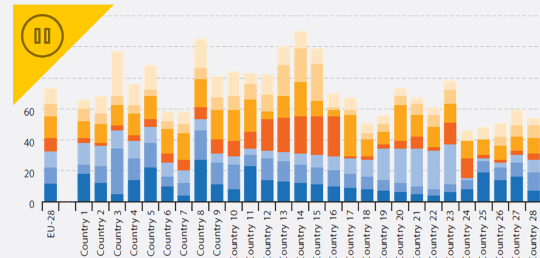
not aligned with data visualization needs



- 1 No stroke for the bars
- 2 Baseline and tick marks — colour: black; weight: 1 pt; Tick marks: height 2 mm
- 3 Gridlines — colour: 30 % black; weight: 0.4 pt; appearance: dashed
- 4 Typography vertical axis — Myriad Pro Regular 8.5 pt (*)
- 5 Typography horizontal axis — Myriad Pro Regular 8.5 pt (*)
- 6 Typography legend — Myriad Pro Bold 8 pt (*)
- 7 Place an empty column between geographical entity groups
- 8 When more than 3 colours are needed, use a new colour tint rather than a 4th colour.

This is less important

This is more important



- Series 7: Lorem ipsum dolor sit amet, consectetur adipiscing elit.
- Series 6: Pellentesque molestie lacus non nisi vehicula semper.
- Series 5: Nam nec libero in sapien tempor congue ac sed justo.
- Series 4: Vestibulum et velit sed ante mattis efficitur vitae sed velit.
- Series 3: In et arcu scelerisque, elementum risus vitae, bibendum et.
- Series 2: In sodales est eu sapien commodo sagittis.
- Series 1: Fusce at risus hendrerit, faucibus nibh dictum

Group 2

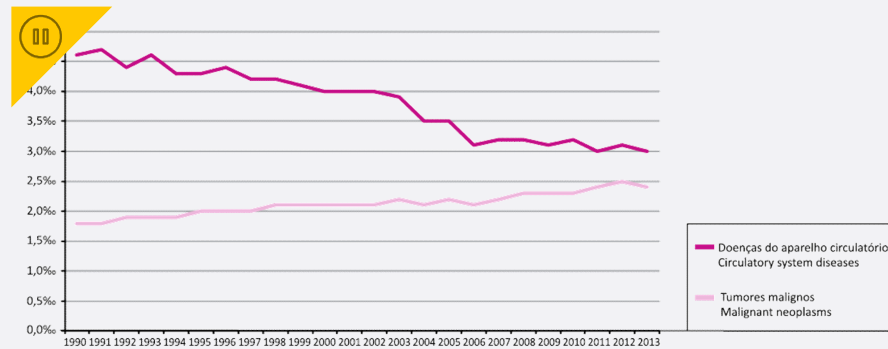
Group 1

8 When more than 3 colours are needed, use a new colour tint rather than a 4th colour.

- Color is a complex issue.
- Edward Tufte says that our main concern when using it should be avoid catastrophe.
- These rules come from the Eurostat style guide.
- From a design perspective, they may be OK,
- but without more context they are not OK for data visualization tasks.
- If you use two different colors and several tints, readers will probably read each color as a group,
- lighter tints will be read as less important than darker or more saturated ones.
- We should take advantage of this, but it is a data-driven design decision, not simply because we have too many series.

color management

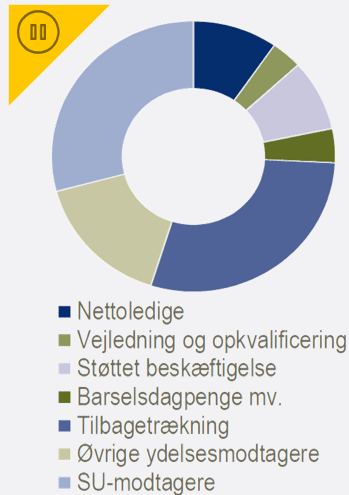
change chromatic intensity to denote relevance (on purpose)



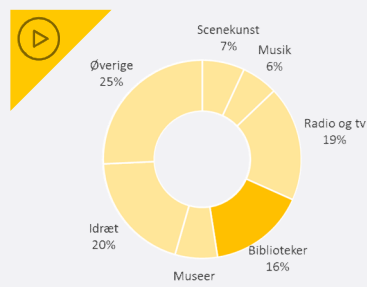
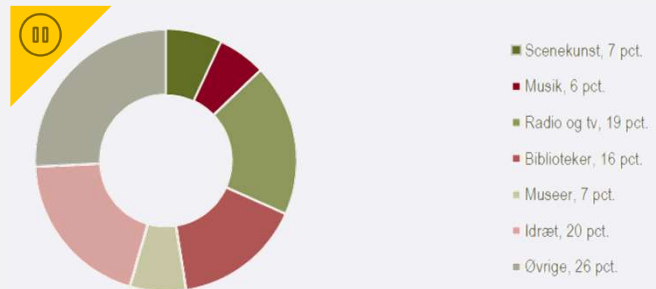
Trend of mortality rate caused by diseases of the circulatory system and malignant neoplasms, 1990 – 2013

- Here, the darker series looks more relevant.
- If this is done on purpose, it should be said it in the title.

color management unwanted grouping



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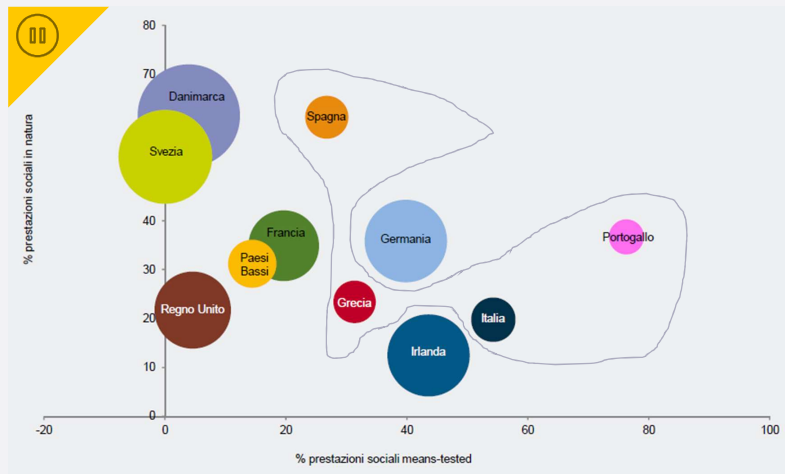


Use color/tints for
more relevant tasks

022

- The top two charts show examples of unwanted grouping,
- a consequence of the guidelines above.
- A functional use of color would be more effective than defining how many colors and tints people should use.
- Most of the time we use too much color,
- and it is virtually never needed in pies or donuts,
- When we don't need it to identify slices we can use it for emphasis
- as you can see in the chart below.

color management use it when you need it



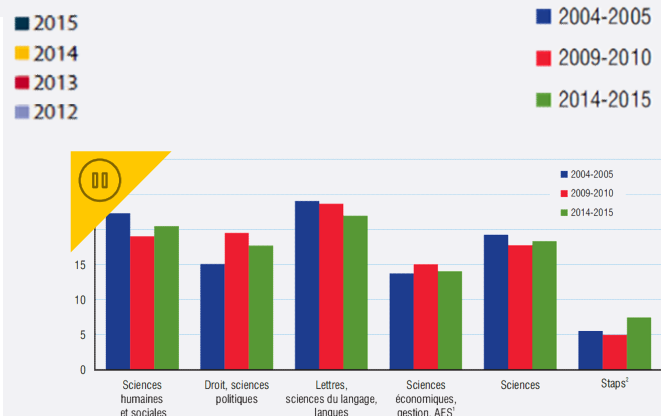
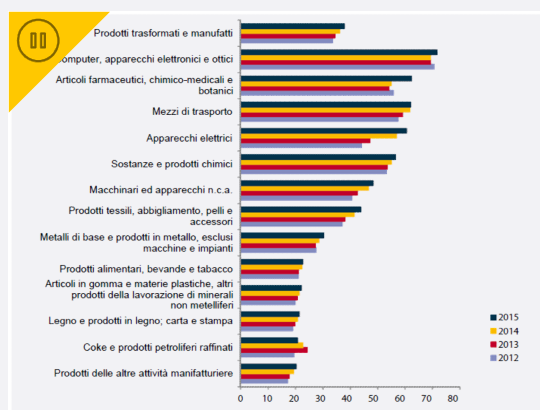
Color-encode these 4 countries using the same color.

Do the same with the other countries.

Explicit the grouping variable.

- This is another example where color is not needed.
- We could use it to group countries.

color management sequences becoming qualitative

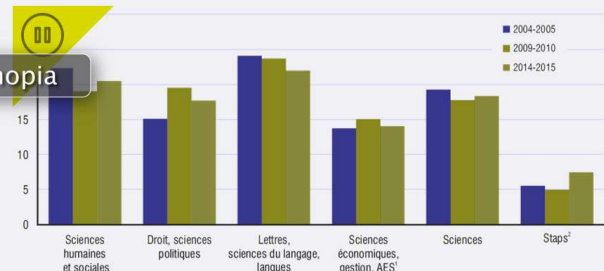
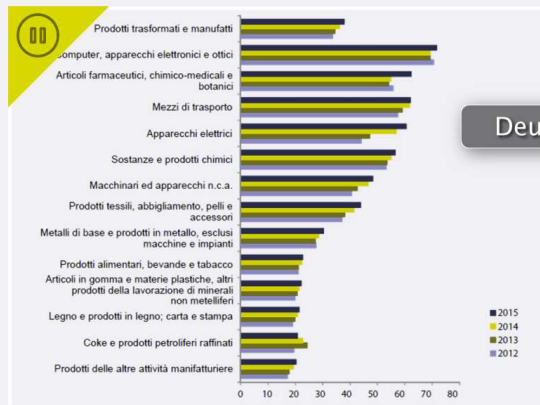


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024

- If there is some kind of sequence, like in a time series, using different colors destroys that sequence.

color management sequences becoming qualitative



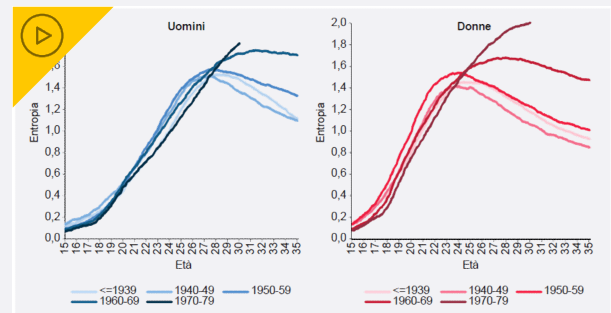
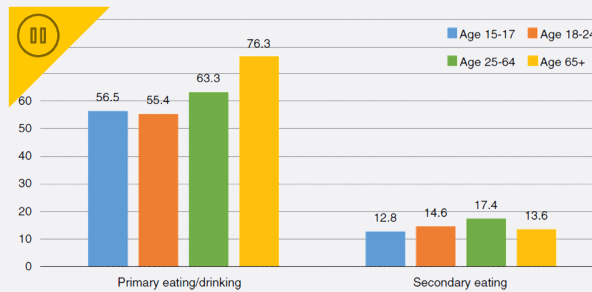
Tips:

- Test your charts with shades of gray;
- Use a color blindness simulator like Color Oracle to test your colors.

- This simulates color blindness, and it's something you should be aware of.
- As you can see, you can't tell red and green apart

color management

use tints instead of colors to make a sequence more obvious



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026

- The charts on the right shows how it should be done with a simple mnemonic: darker means more recent. Very simple.
- In general, make sure the colors you choose help people reading the chart, minimizing the need for a legend.
- Put color discriminability and stimuli intensity before aesthetics.

reference values: use a line instead of a bar

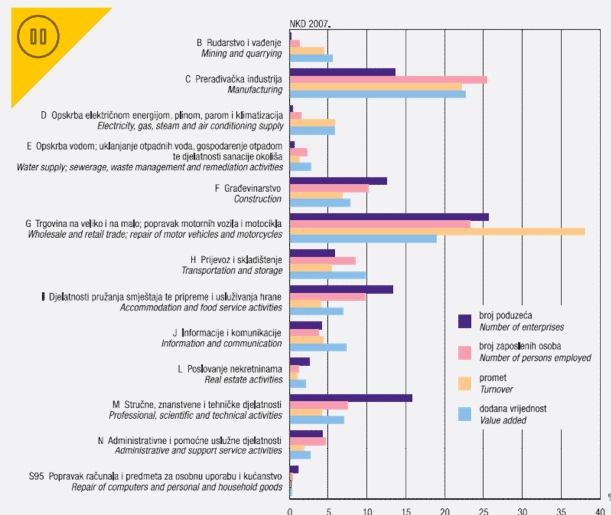


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027

- This is also a common issue.
- When you have a reference value in a bar chart use a line to encode it, like the right chart does.
- Comparing gaps to the reference line is easier than using a bar.

what is the question? is this the right chart type? author's intentions vs. chart's ability to deliver the message

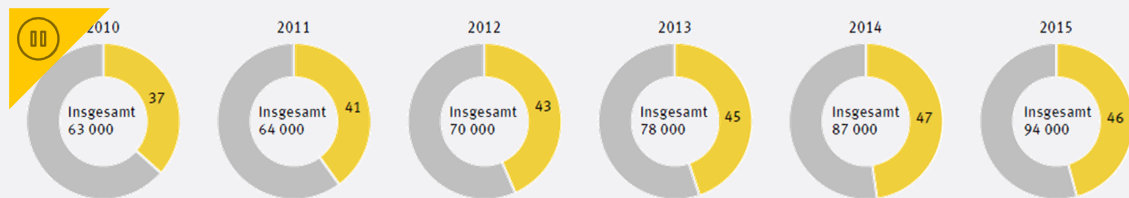


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028

- Think of a chart as a visual answer.
- That means that there should be a clear answer
- but also a clear question.
- Often we can guess the author's intention,
- but in cases like this the answer is not clear.

what is the question? is this the right chart type?
author's intentions vs. design temptations

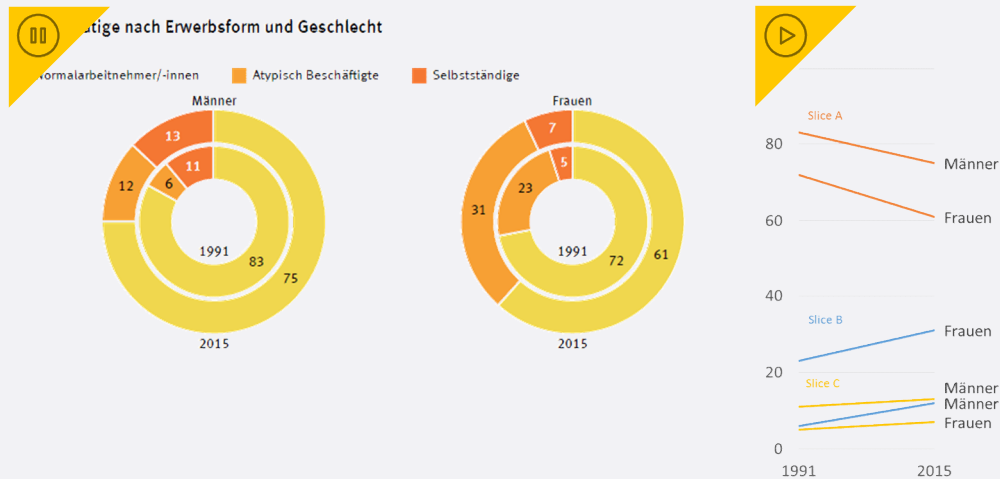


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029

- Here, the intention is clear, but the author couldn't resist having fun with donuts.
- It's a case of, as Stephen Few puts it, "Our Irresistible Fascination with All Things Circular"

what is the question? is this the right chart type? intentions unclear vs. design temptations

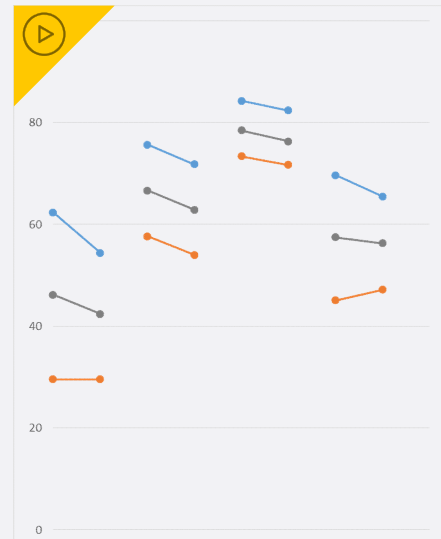
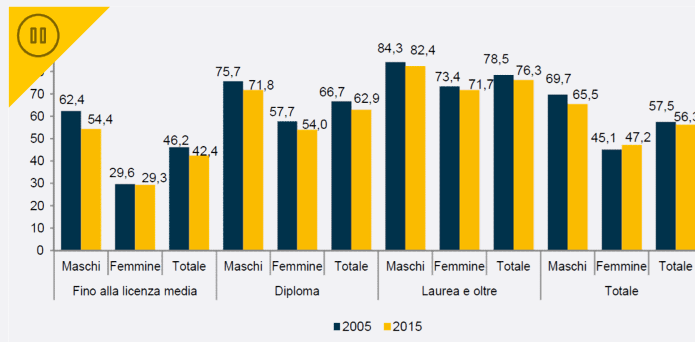


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030

- Comparing two or more circular charts should be avoided
- and that includes rings within rings
- The chart on the right simplifies evaluating and comparing the data points.

what is the question?

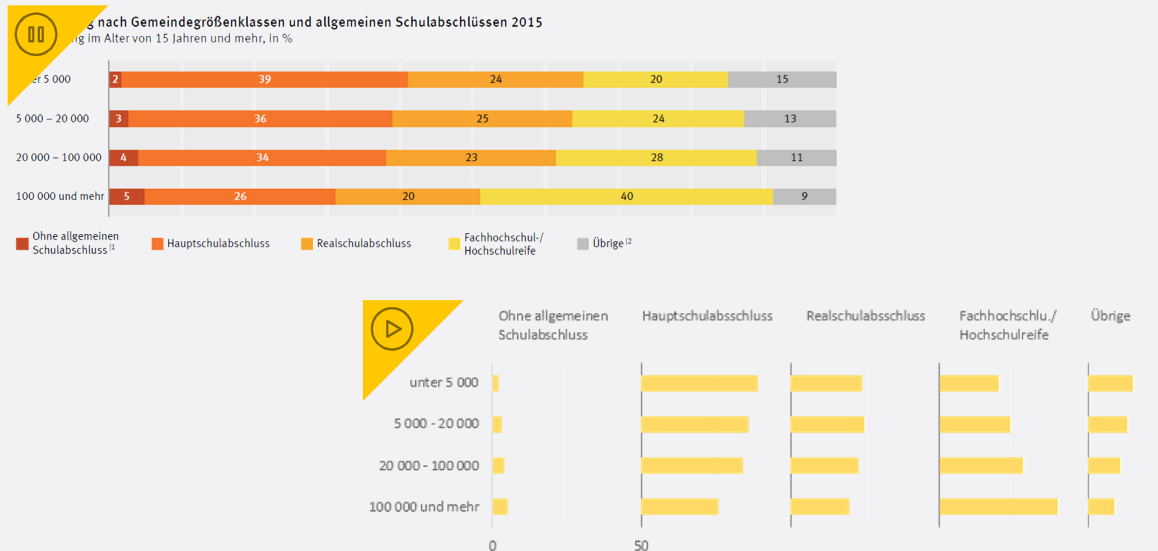


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031

- Displaying data split by gender is very common.
- Show the difference and the gaps to the total, not the full bars.
- The chart on the right would achieve that and would be a much lighter display

what is the question?



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032

- 100% stacked bars are very ineffective.
- They use too many colors,
- need a legend
- and, above all, makes it very hard to compare the middle series.
- The patterns are much clearer using the chart below.

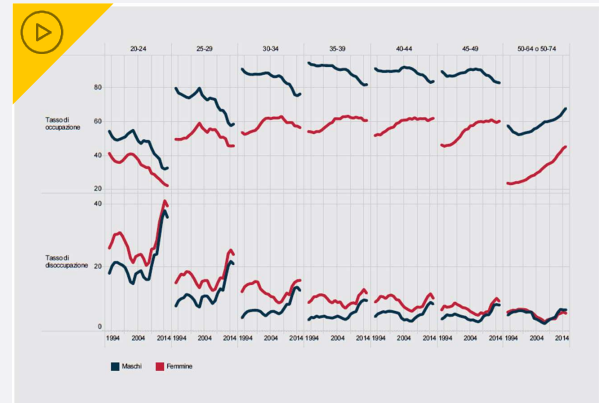
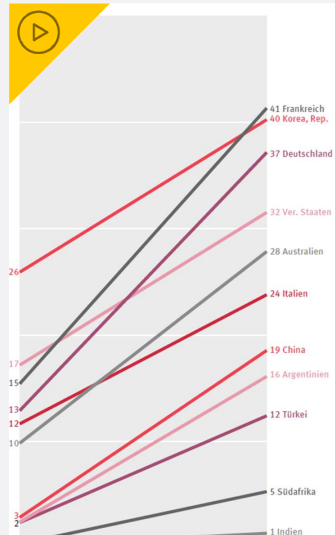
There's a strand of the data viz world that argues that everything could be a bar chart. That's possibly true but also possibly a world without joy.

Amanda Cox, NYT

<https://hbr.org/2013/03/power-of-visualizations-aha-moment>

- There are hundreds of chart types,
- and I'm sure you'll find the right one for your data, your question and your audience.
- Bar charts are usually safe,
- but to provide a more precise answer you often have to go beyond them.
- Don't be afraid to experiment, within reason.

should be used more often

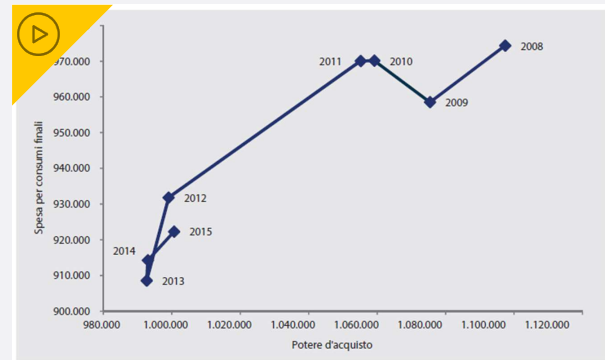


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034

- Here are a few chart types that could be used more often
- Slope charts and small multiples.

should be used more often



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035

- Scatterplots are used, but should include more annotations
- connected scatterplots are great to show relationships over time

should be used more often

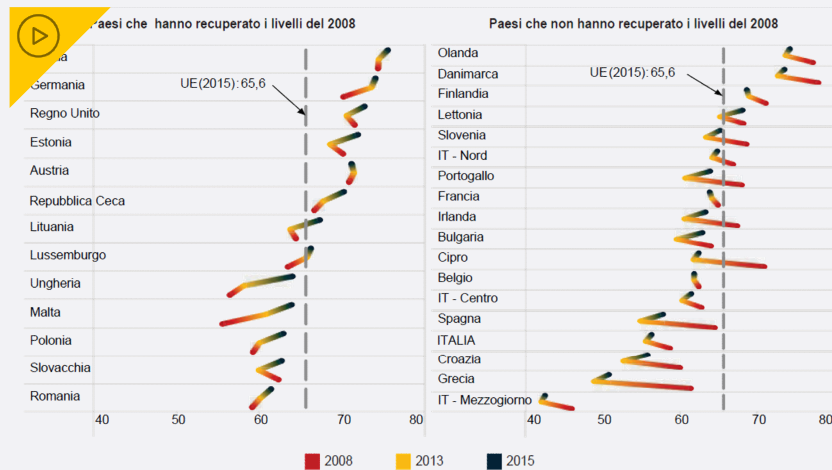


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036

- Cycle plots for strongly seasonal data

some experiments seem to work

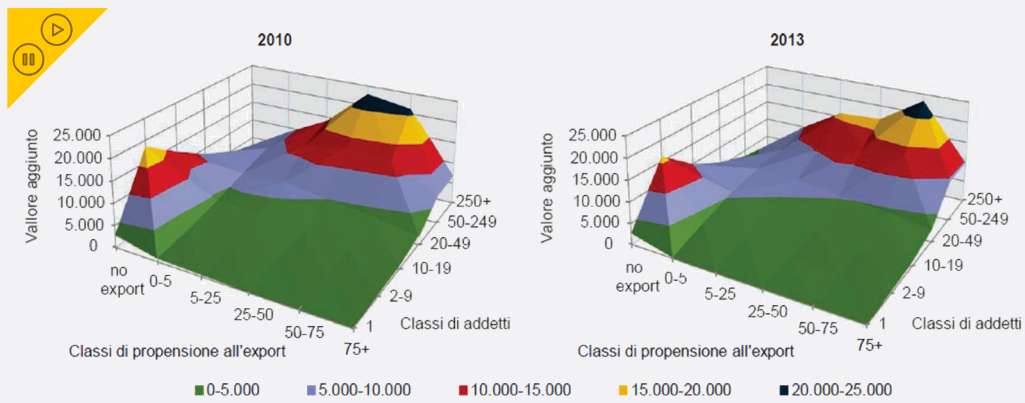


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037

- Should we call it a boomerang chart?
- A very interesting experiment,
- Could be improved using a different color pallet

others not so much

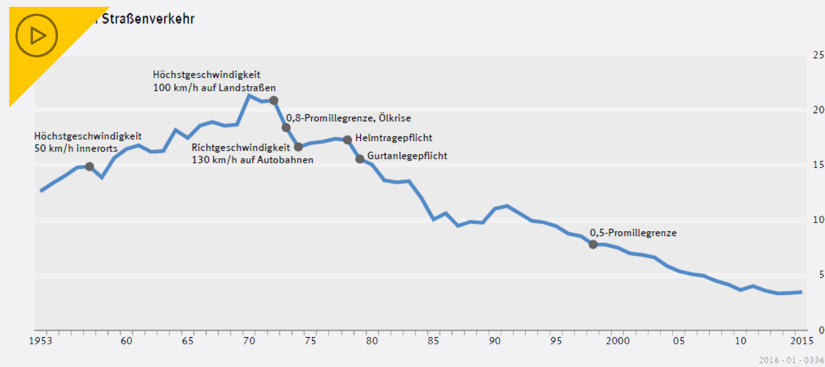


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038

- Others don't seem to work
- 3D and color pallet issues here

annotate

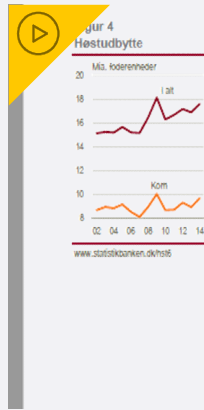


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039

- Annotate relevant data points or outside events that could impact the data.

test sizes, enrich the message



www.statistikbanken.dk/7105

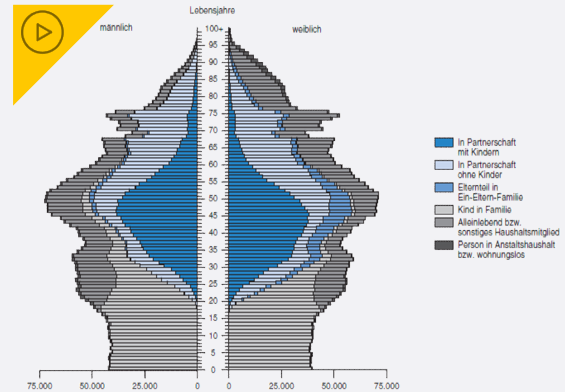
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Den vegetabiliske produktion er i sigens natur tæt knyttet til nævnt anvendes hovedparten af arealet til kornproduktion, l ter er hvede og byg. Korn tegner sig derfor også for størst mens afgrøder til grovfoder til kvæg tegner sig for den næst v

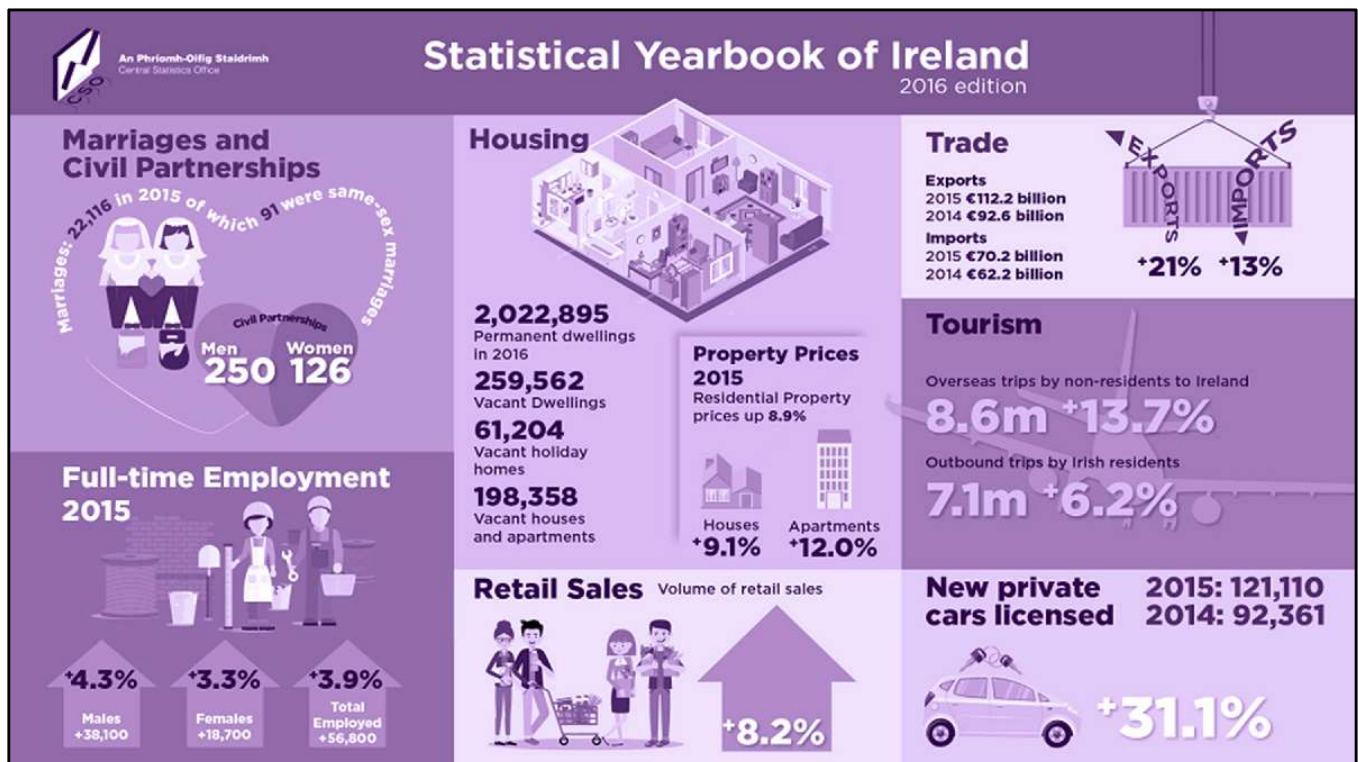
Produktionen kan deles op i tre grupper: Produkter, som enten direkte eller efter industriel forarbejdning; produkter til husdyr; samt en tredje gruppe, der omfatter blomster o food afgrøder.

Gruppen af fødevarer, der kan anvendes direkte, omfatter s og grøntsager dyrket på friland og i væksthuse, mens kart sukkerrøer samt dele af produktionen af korn og industrif anvendes som levnedsmidler. Den vegetabiliske produktion i lag for den animalske produktion i landbruget, idet den er i kilde til husdyrenes foderforbrug.

Ud over korn, hvor en stor del af produktionen anvendes lang række græs- og grønfoderafgrøder, som primært anven 3 er vist de seneste års udvikling i det samlede høstudbytte i duktion, dog undtaget frugt, grøntsager og andre gartneripr

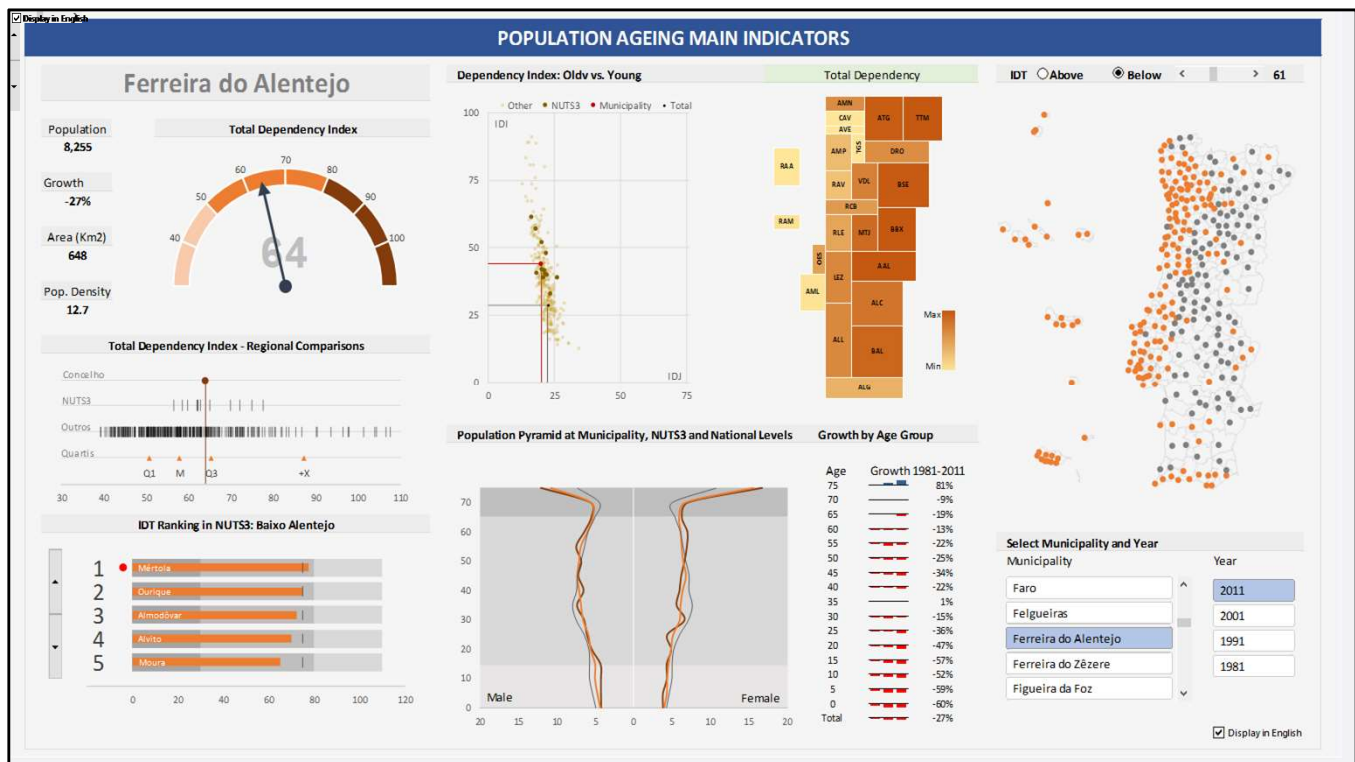


- Test smaller sizes close to the text
- Add detail



- Be aware of what makes your charts more effective,
- and feel comfortable with design choices like color.
- But with more data comes the need for a more complex and consistent message.
- Don't think of charts, think of communication,
- and for that you have to remove the mental border around each chart.
- Treat a chart as a paragraph in a longer narrative.
- You could try the infographic way, like in this case,
- but infographics require a more design-oriented approach, and we often lack those skills.

An Evaluation of data visualization practices of statistical institutes



- This, on the other hand, is data-oriented,
- and it is nothing more than a few Excel charts
- put together with the purpose of showing related data.
- This is where we need to go after solving single-chart issues.
- I'm sure your results will be much better than this.

major takeaways

01 communicate visually
Switch from illustration to communication. Find what's interesting about the data and decide if it deserves to be shared.

02 clarify and enrich
A chart answers a question. Make sure that question is obvious and clear. Then, add details to enrich the message.

03 select the right visual
Each chart's effectiveness is situation-dependent. Find the one that best translates your message into a visual representation.

04 minimize visual footprint
Space-efficient visuals *tend* to be more rational choices and free up space to add more data, annotations and details.

05 functional use of color
Make sure color encoding is needed. Be aware of possible interactions when using colors vs. tints.

06 data-informed design
A professionally designed publication will not save poor charts. Style guidelines must take the specifics of data visualization into account.

Jorge Camoes • NTTS 2017

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- So, here are some major takeaways.
- Use visuals to communicate, not to illustrate
- Clarify and enrich the message
- Select the right visual for your data, your message and your audience
- Select charts that minimize the visual footprint
- Make a functional use of color
- In general, apply a data-informed design
- Thank you.