

# VISUALIZATION

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# Exploratory data analysis

- Exploratory analysis is a loosely-defined process
- Roughly, the stuff between loading data and formal analysis is “exploratory”
- This includes
  - Visualization
  - Checks for data completeness and reliability
  - Quantification of centrality and variability
  - Initial evaluation of hypotheses
  - Hypothesis generation
- Current emphasis is visualization

# A picture is worth 1000 words

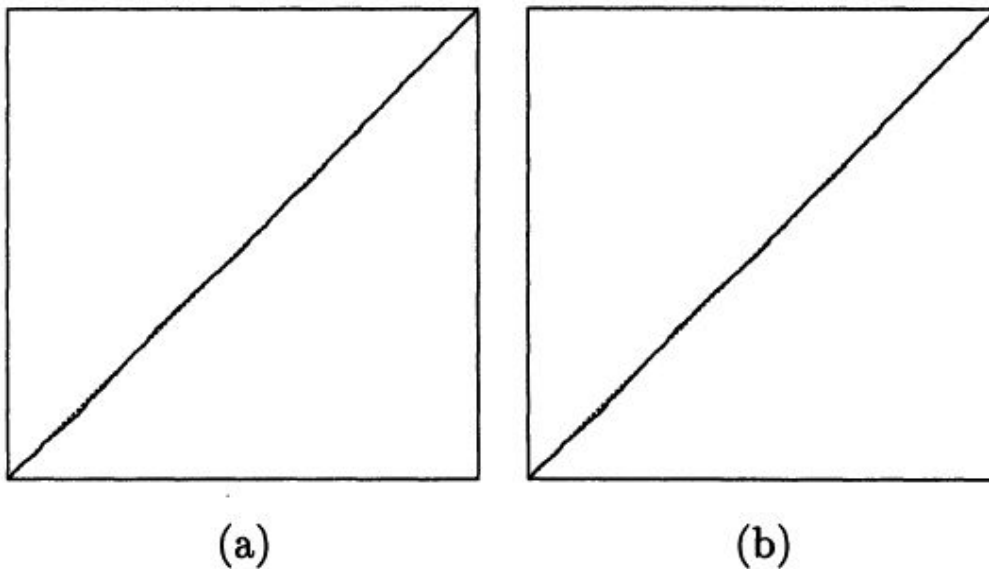
- Looking at data is critical
  - True for you as an analyst
  - True for you as a communicator
- You should make dozens, maybe even hundreds, of graphics for each dataset
  - Most of these are for your eyes only
  - A small subset are for others

# A<sub>good</sub> picture is worth 1000 words

- Bad graphics are worth only a few words

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*Figure 1. SRQ Plots of  $T_i/T_n$  (Vertical Axes) Against  $i/n$  (Horizontal Axes) for the Gibbs Sampler (a) and an Alternating Gibbs/Independence Sampler (b) for the Pump Failure Data Based on Runs of Length 5,000. Lines through the origin with unit slope are shown dashed; axis ranges are from 0 to 1 for all axes.*

For more bad graphics, see Karl Broman's "Top Ten Worst Graphics"

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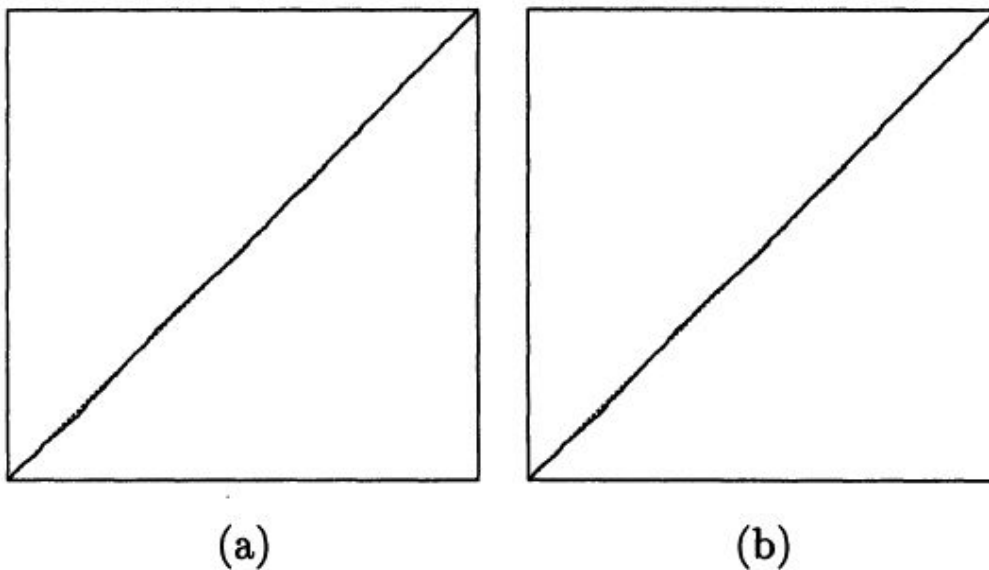
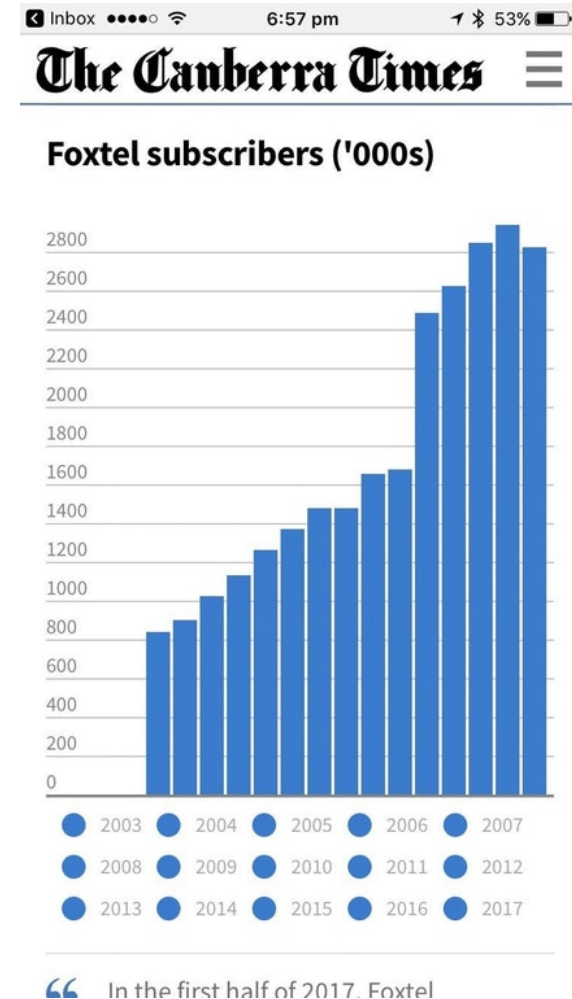


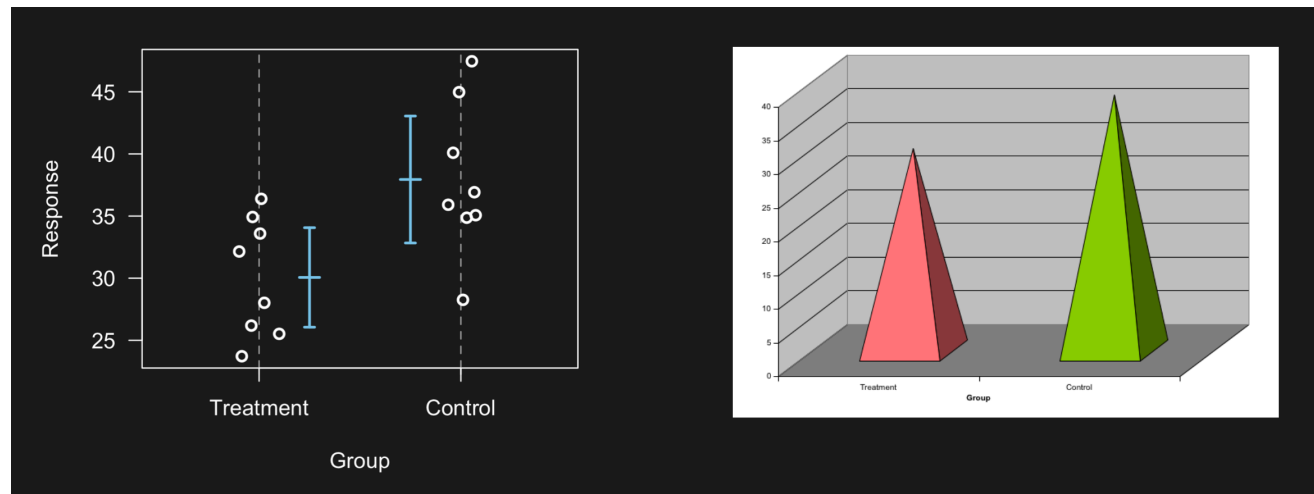
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# What makes a “good” picture?

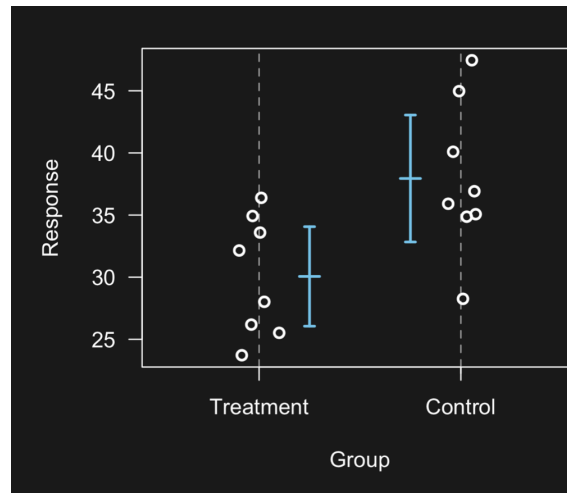
- Show as much of the data as possible
- Avoid superfluous frills (e.g. 3D ...)
- Facilitate comparisons
  - Put groups in a sensible order
  - Use common axes
  - Use color to highlight groups
  - No pie charts



“Creating effective tables and figures” – talk by Karl Broman

# What makes a “good” picture?

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.@earino: There is a time and a place for pie charts

That is when you are talking about pie

Otherwise, never

#PlotCon



12:58 PM - 18 Nov 2016



# What makes a “good” picture?

- From the expert:

## Cole Knaflic

@storywithdata

Helping rid the world of ineffective graphs, one exploding, 3D pie chart at a time! Author of #SWDbook, organizer of #SWDchallenge, hear me on #SWDpodcast.



Cole Knaflic

@storywithdata

Follow

My guiding #dataviz principles:

1. Be clear on intent
2. The right graph creates an "aha" moment
3. Don't overcomplicate
4. Get rid of the non-essential
5. Make it clear where to look
6. Words make a graph accessible
7. Audience trumps all else

#InternationalChartDay #ChartDay

5:19 AM - 26 Apr 2018

261 Retweets 637 Likes



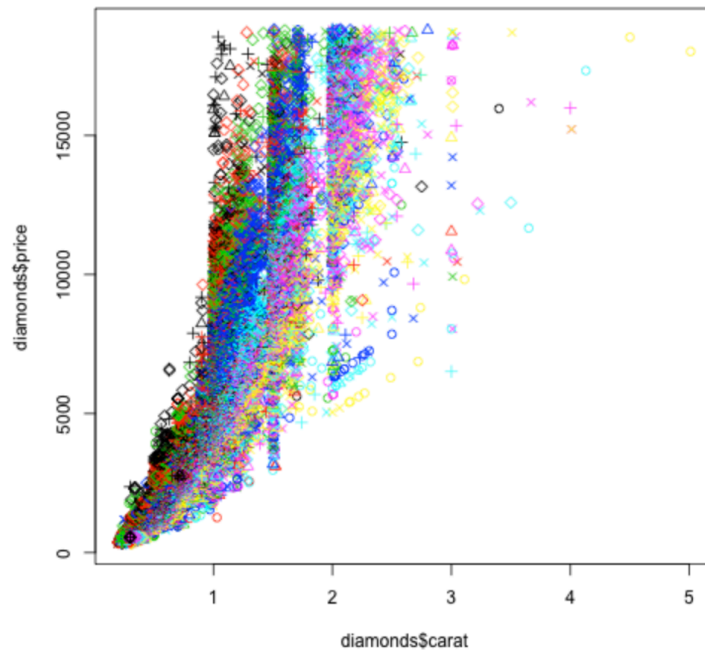
14 261 637

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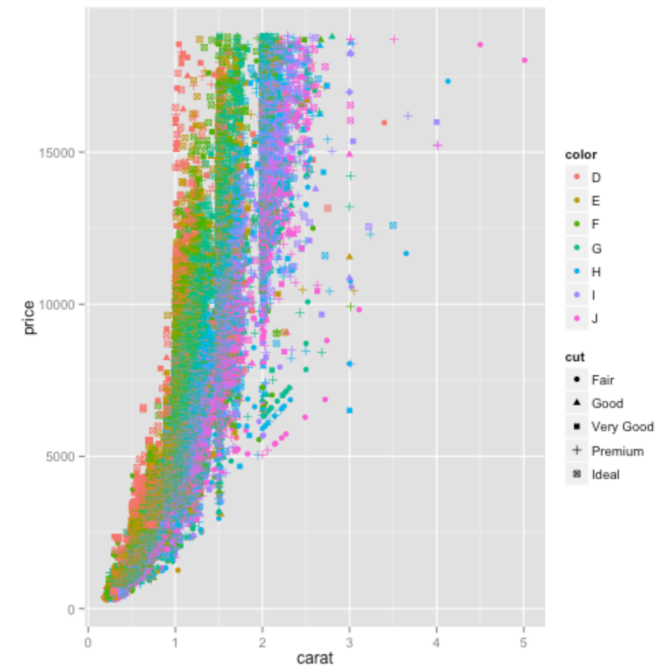
- “Good” figures aren’t necessarily “publication quality” pictures
  - Most figures are for you, and even these should be good
  - Graphics for others require more fiddly detailing than is necessary for graphics for you

# Why ggplot?

- Makes good graphics with relative ease
  - “Relative” here is compared to base R graphics



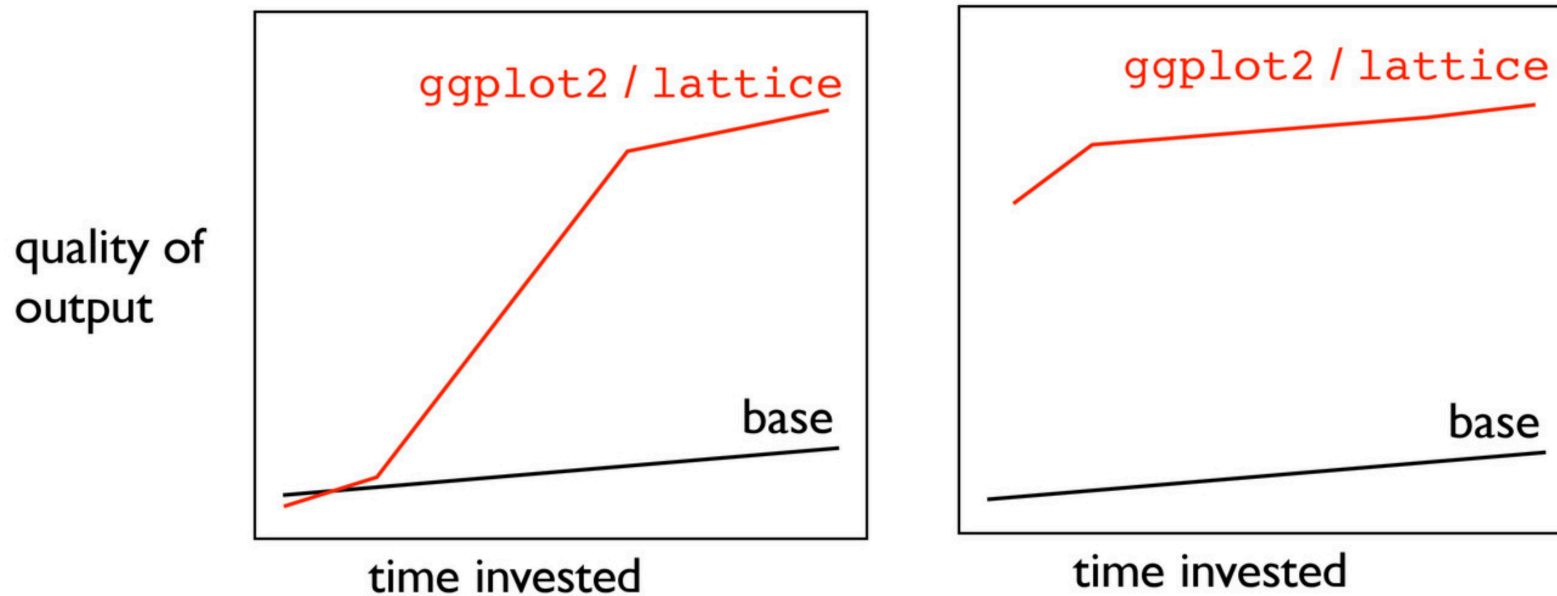
VS



“Don’t teach built-in plotting to beginners (teach ggplot2)” – blog post by David Robinson

# Why ggplot?

- Cohesiveness shortens the learning curve
  - Same principles underlie all graphic types



# Learning ggplot

- Lots of materials
- google is your friend
  - Start searches with “ggplot”
  - StackOverflow has lots of questions and useful answers
  - Don’t worry about googling stuff you “should know”

David Robinson Retweeted

 **Myfanwy Johnston** @Voovarb · Aug 10

Attention [#rstats](#) beginners - googling is okay. I repeat, googling is okay. And as it turns out, repeat googling is okay too.

 **David Robinson** @drob

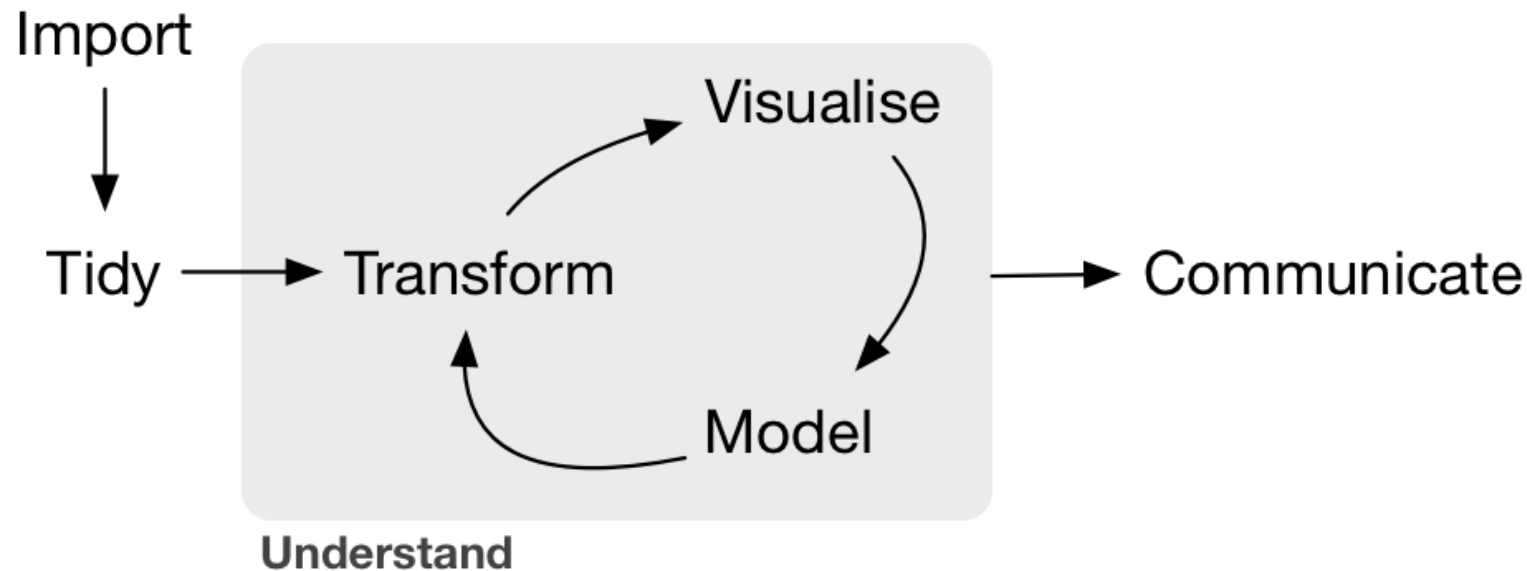
Just discovered that I've visited this ggplot2 question 29 times in the last two years

Worth it every time

5 54 153

# Using ggplot

- Based around the “tidy data” framework
- Trouble making a plot is often trouble with data tidiness in disguise
  - Think about how your data organization affects your ability to visualize
  - Factors can help with ordering



# Using ggplot

- Basic graph components
  - data
  - aesthetic mappings
  - geoms
- Advanced graph components
  - facets
  - scales
  - statistics
- A graph is built by combining these components
- Components are consistent across graph types
  - Scatterplots, bar graphs, density plots, ridge plots ...