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## Data Visualisation for Business Insight

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### Topics

- What is data visualisation and why is it useful?
- Principles and practices of data visualisation
  - Illustrated throughout by case studies
- Focus is very practical
  - “Rules and tools” for actuarial staff to help improve day to day communication of information
  - Not intended to imply that some of these methods aren’t already in use
  - Not about “MI/BI” data analytics systems / processes
- Commentary, additional material and references are all contained in an accompanying paper, available from [www.sias.org.uk](http://www.sias.org.uk).



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2

## What is data visualisation?

- The main goal of data visualization is to **communicate information clearly and effectively** through graphical means. (Friedman [1])
- Important stories live in our data and data visualization is a powerful means to **discover and understand these stories**, and then to present them to others. (Few [2])
- Visualization gives you **answers to questions you didn't know you had**. (Shneiderman [3])



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3

## Why is data visualisation useful for actuaries?

### Boards struggle to understand internal model outputs

Poor communication of the outputs from Solvency II internal models means the results are at risk of being ignored or misunderstood by the boards of insurance companies, according to LCP.

**"What are these numbers telling me?  
And the font is too small – my  
eyesight isn't what it used to be."**  
Unnamed UK Chief Actuary

### AVOID PRINTING IN SOLID FULL COLOUR

Sign above printer in most offices in the  
UK

**"Why is there so little graphical  
communication of internal model  
results and how much healthy  
challenge is missing as a result?"**  
InsuranceERM article

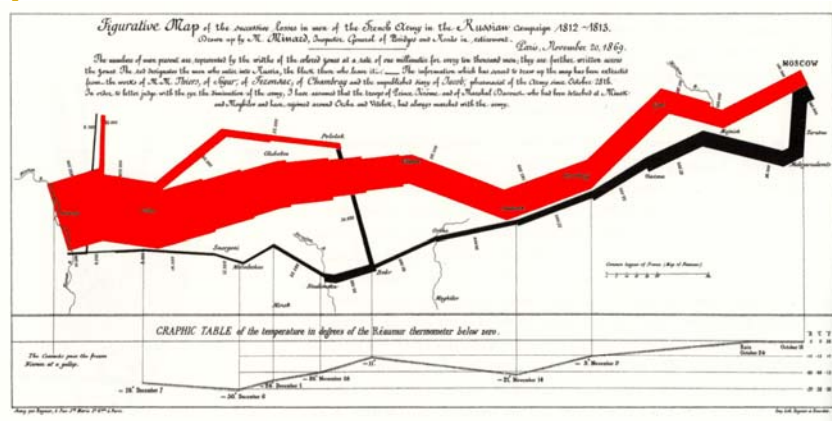
Information [should be] presented in  
a clear and comprehensible manner  
TAS R



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4

## Napoleon's 1812 March to Moscow



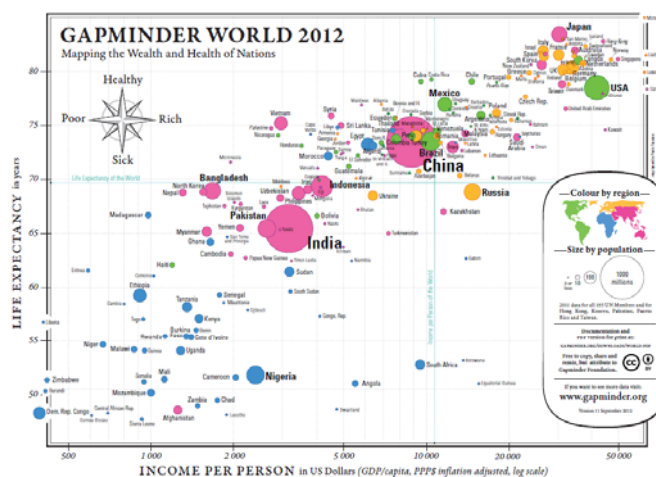
- Produced in 1869 (!) by Charles Minard
- Red is towards Moscow, black is retreat, width represents size of army
- Temperatures during the retreat are shown at the bottom
- "It may be the best statistical graphic ever drawn" (Tufté [6])



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5

## Encoding 4 variables in 2-D



- Size and colour used to encode 2 more variables
- Axes use log-scales to bring out the roughly linear relationship between life expectancy and transformed income per person



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6

## Encoding 4 variables in 2-D

### Gapminder

<http://www.gapminder.org/world-offline/>

Life expectancy vs wealth  
over the last 200 years

- Interactive version showing global changes over 200 years
- Application contains a wealth of other data
- Live web site at [www.gapminder.org/world](http://www.gapminder.org/world)



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7

## Key principles of data visualisation

Data visualisation techniques are not magical, they can be **studied** and **learned**

The key to good visualisations is **good communication**


**Trial and error** will almost always lead to improvements.

A **top-down structured process** to data visualisation, starting with the **needs of its users**, is likely to be more successful than diving straight in.



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8



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# Data Visualisation Process

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## Process Diagram

Know your audience and what they are looking for

Determine the messages the audience will find most useful

Select the best methods to display your messages

Design the display to show the information simply, clearly and accurately

Choose a technology and implement the design

Purpose


Narrative

Method

Design

Implementation

Feedback / Iteration



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10

## Narrative

- The narrative is the “overall message” of a visualisation, in business rather than technical terms
- Even where the objective of an actuarial report is very narrow (e.g. a statutory valuation) it is important to place it in a business context
  - TAS R A.1.2: “sufficient information is included to enable users to understand the implications of the contents of the reports”
- Many actuarial techniques can be seen as narratives:
 

How and why have the numbers changed?	Analysis of Change Analysis of Surplus
How do we know these numbers are reasonable / internally consistent?	Reconciliation Reasonableness testing Sensitivity analysis
How do the numbers break down into component parts?	Capital waterfalls P&L attribution



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11

## Purpose of a data visualisation



### What is the data?

- Precision
- Clarity
- Simplicity

### What does the data mean?

- Context
- Patterns
- Trends

### What else can I discover?

- Relationships
- Connections
- Associations



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12



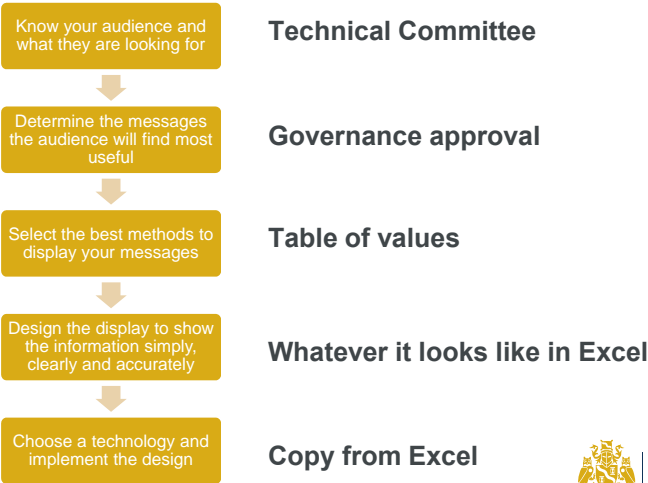
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# Case Study 1: Governance Approval of a Correlation Matrix

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Artise  
Sponsorship  
Thought leadership  
Progress  
Community  
Sessional Meetings  
Education  
Working parties  
Volunteering  
Research  
Shaping the future  
Networking  
Professional support  
Enterprise and risk  
Learned society  
Opportunity  
International profile  
Journals  
Support

## Correlation Matrix: Initial Process



## Correlation Matrix: Attempt 1

		Equity returns	Credit spreads	Interest rates - parallel shifts	Interest rates - twists	Interest rates - curvature	Property returns	Corporate bond default / migration	Credit counterparty	Mortality/morbidity	Age	Major	Home	Legal	Travel	Liability	Current expenses	Expense inflation	Internal fraud	External fraud	Employment Practices	Business Practice	Physical Asset Damage	System Failures	Executive Management
Market risk	Equity returns	1.00	-0.75	-0.75	0.00	0.50	-0.50	-0.25	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	
	Credit spreads	-0.75	1.00	0.50	0.50	0.50	0.25	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	
	Interest rates - parallel shifts	-0.75	0.50	1.00	0.50	-0.25	0.50	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	
	Interest rates - twists	0.00	0.50	0.50	1.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	
	Interest rates - curvature	0.50	0.50	-0.25	0.00	1.00	-0.50	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	
Credit risk	Property returns	-0.50	0.25	0.50	0.00	0.50	1.00	-0.25	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	
	Corporate bond default / migration	-0.25	0.00	0.00	0.00	-0.50	-0.25	1.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	
	Credit counterparty	0.00	0.00	0.00	0.00	0.00	0.00	0.00	1.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	
	Mortality/morbidity	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	1.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	
	Age	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	1.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	
Life insurance risk	Major	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	1.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	
	Home	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	1.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	
	Legal	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	1.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	
	Travel	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	1.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	
	Liability	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	1.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	
Non-life insurance risk	Current expenses	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	1.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	
	Expense inflation	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	1.00	0.00	0.00	0.00	0.00	0.00	0.00	
	Internal fraud	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	1.00	0.00	0.00	0.00	0.00	0.00	
	External fraud	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	1.00	0.00	0.00	0.00	0.00	
	Employment Practices	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	1.00	0.00	0.00	0.00	
Operational risk	Business Practice	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	1.00	0.00	0.00	
	Physical Asset Damage	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	1.00	0.00	
	System Failures	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	1.00	
	Executive Management	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	



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15

## Commentary on Attempt 1

- Precise – important since approval being sought
- Symmetry  $\Rightarrow$  repetition
- Mismatch between what's important to the audience and what stands out visually
  - Size and sign of values are important to audience
  - But very hard to pick out
  - Leading diagonal looks important, but conveys no information (values are always 1)
- "Wall of numbers" - hard to see patterns and relationships
- No sense of financial significance

	Equity returns	Credit spreads	Interest rates - parallel shifts	Interest rates - twists	Interest rates - curvature	Property returns	Corporate bond default / migration	Credit counterparty	Mortality/morbidity	Morbidity	Age	Major	Home	Legal	Travel	Liability	Current expenses	Expense inflation	Internal fraud	External fraud	Employment Practices	Business Practice	Physical Asset Damage	System Failures	Executive Management
Market risk	1.00	-0.75	-0.75	0.00	0.50	-0.50	-0.25	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	
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	Interest rates - parallel shifts	-0.75	0.50	1.00	0.50	-0.25	0.50	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	
	Interest rates - twists	0.00	0.50	0.50	1.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	
	Interest rates - curvature	0.50	0.50	-0.25	0.00	1.00	-0.50	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	
	Property returns	-0.50	0.25	0.50	0.00	0.50	1.00	-0.25	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	
Credit risk	Corporate bond default / migration	-0.25	0.00	0.00	0.00	-0.50	-0.25	1.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	
	Credit counterparty	0.00	0.00	0.00	0.00	0.00	0.00	0.00	1.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	
Life insurance risk	Mortality/morbidity	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	1.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	
	Morbidity	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	1.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	
	Age	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	1.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	
	Major	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	1.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	
	Home	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	1.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	
	Legal	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	1.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	
	Travel	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	1.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	
	Liability	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	1.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	
Expense risk	Current expenses	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	1.00	0.00	0.00	0.00	0.00	0.00	0.00	
	Expense inflation	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	1.00	0.00	0.00	0.00	0.00	0.00	
	Internal fraud	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	1.00	0.00	0.00	0.00	0.00	
	External fraud	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	1.00	0.00	0.00	0.00	
	Employment Practices	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	1.00	0.00	0.00	
	Business Practice	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	1.00	0.00	
	Physical Asset Damage	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	1.00	
	System Failures	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	
	Executive Management	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	



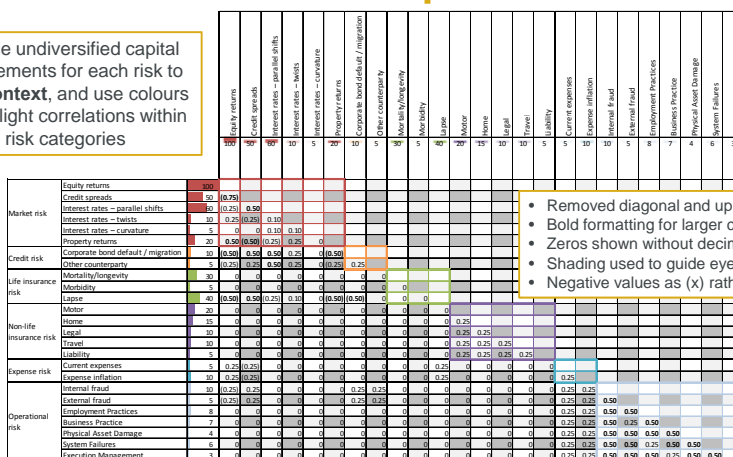
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## Correlation Matrix: Attempt 2

Include undiversified capital requirements for each risk to give **context**, and use colours to highlight correlations within risk categories



- Removed diagonal and upper triangle
- Bold formatting for larger correlations
- Zeros shown without decimal places
- Shading used to guide eye to headings
- Negative values as (x) rather than -x

Improving the **design** has started to help with seeing **patterns**



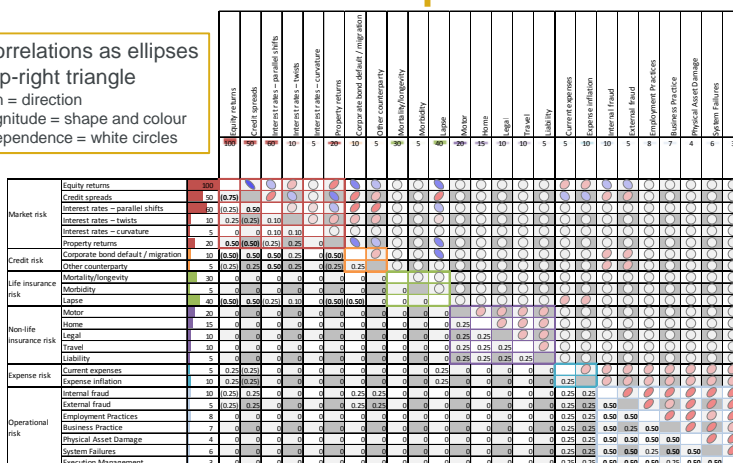
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17

## Correlation Matrix: Attempt 3

Show correlations as ellipses in the top-right triangle  
Sign = direction  
Magnitude = shape and colour  
Independence = white circles



Can see more **patterns** - easier to **explain** and **explore** the correlations

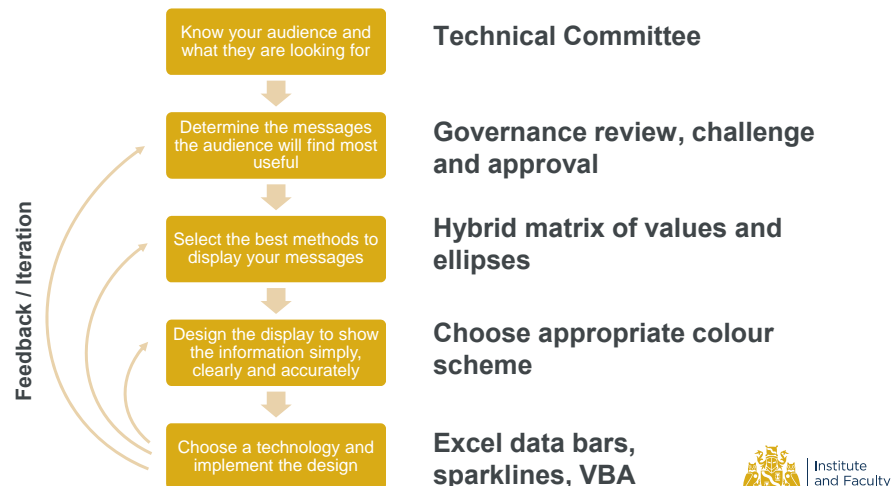


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18

## Correlation Matrix: Updated Process



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19

## Case Study 1: Lessons Learned

- **Methodology**
  - Tables are important in actuarial work, to set out numerical values out precisely
  - However, tables are at the Exhibit end of the spectrum, if we want to make it easy for users to Explain or Explore the data, pictures are likely to be useful
  - The paper covers the methodologies for tables and charts in more detail
- **Design**
  - Changing the design of a table can both improve the presentation and suggest improvements to methodology
    - In the case study, creating the white space in the upper triangle prompted the question “what can we do with this?”
    - In order to use the space, we had to develop the methodology further
- **Implementation**
  - We had to use advanced Excel features (data bars, sparklines, VBA)



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20

## Implementation

- Excel is the obvious tool, familiar to and used by most actuarial staff
- More recent versions (2010, 2013) have more visualisation features:
  - Lots of chart types – but avoid spurious 3-d charts
  - Sparklines (small charts embedded in cells – example later)
- Since Excel is so familiar, it's easy to allow visualisations to be constrained by what it can and can't support, but there are options:
  - <http://peltiertech.com/Excel/Charts/ChartIndex.html> is an excellent resource for producing additional types of chart in Excel itself
  - VBA can be used to embellish tables and charts (e.g. the ellipses)
  - The statistical package R has powerful charting capabilities – but steep learning curve
  - Bespoke packages (see accompanying paper)

**Try not to let your visualisation ideas be constrained by technology – there will often be a way to do it**



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21



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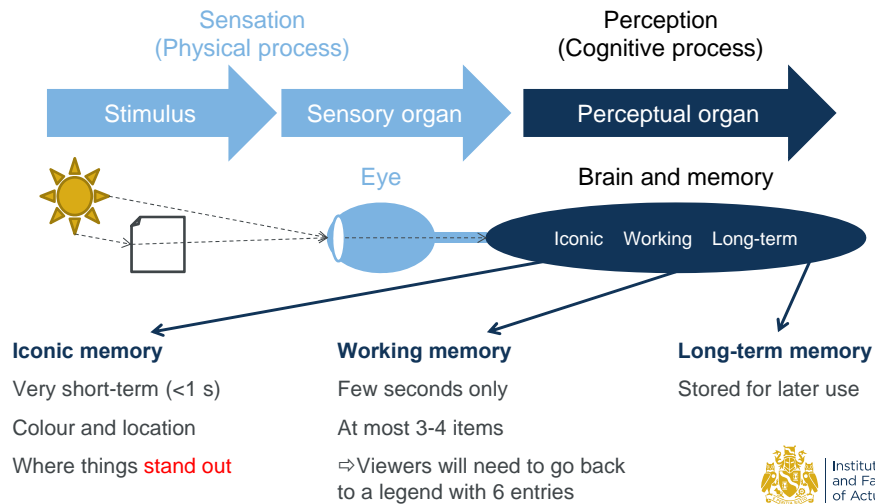
## Design and Method

erlise  
 onorship  
 Thought leadership  
 Progress  
 Community  
 Sessional Meetings  
 Education  
 Working parties  
 Volunteering  
 Research  
 Shaping the future  
 Networking  
 Professional support  
 Enterprise and risk  
 Learned society  
 Opportunity  
 International profile  
 Journals  
 Support

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22

## Design: Perception and Cognition



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23

## Avoid Pie Charts



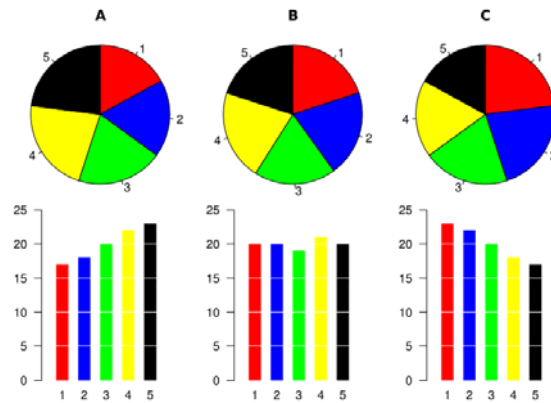
The only good pie chart?

- It is difficult to perceive the relative size of areas correctly
- Much easier to see relative sizes using lengths
- Almost always preferable to use a bar/column or line chart
  - Show absolute as well as relative values

27 February 2014

24

## Avoid Pie Charts



- It is difficult to perceive the relative size of areas correctly
- Much easier to see relative sizes using lengths
- Almost always preferable to use a bar/column or line chart
  - Show absolute as well as relative values

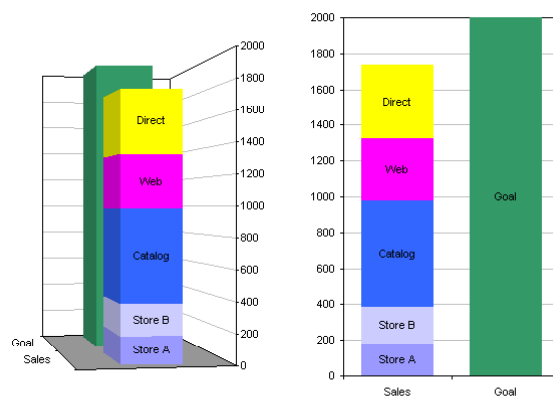
Source: <http://commons.wikimedia.org/wiki/File:Piecharts.svg>  
 where author information can be found.  
 Licensed under the Creative Commons Attribution 1.0 Generic licence.



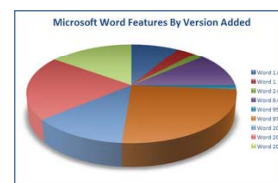
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25

## Avoid Gratuitous 3-D



Source: <http://peltiertech.com/WordPress/the-perils-of-being-in-3d/>



**Especially avoid 3-D pie charts with badly-chosen colours!**



27 February 2014

26

## Design: Overarching Principles

- Remove everything that isn't necessary
- Identify what is data and what isn't
- Make the data prominent and clear
- Make the non-data as unobtrusive as is sensible
  - Non-data are things like axes and grid-lines, which can sometimes be too "busy" – if so, remove or use light grey
- Highlight the information that's most important to your narrative (and vice versa)
- Keep colours and fonts under control
  - 2 or 3 colours will create a sense of unity
  - Different shades and sizes are allowed (within reason)
  - More will distract from the data

*Just as a good editor of prose ruthlessly prunes out unnecessary words, so a designer of statistical graphics should prune out ink that fails to present fresh data-information.*

*Graphical elegance is often found in simplicity of design and complexity of data.*

*Graphical excellence consists of complex ideas communicated with clarity, precision and efficiency.*

(All from Tufte [6])

**In summary: "maximise the data/ink ratio, within reason"**



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27



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## Case Study 2: Presentation of Stochastic Model Results

Stochastic model output is ideally suited to visualisation techniques – lots of high-dimensional data

Case study is based on a hypothetical annuity writer backing liabilities purely with corporate bonds

erlise  
 onsorship  
 Thought leadership  
 Progress  
 Community  
 Sessional Meetings  
 Education  
 Working parties  
 Volunteering  
 Research  
 Shaping the future  
 Networking  
 Professional support  
 Enterprise and risk  
 Learned society  
 Opportunity  
 International profile  
 Journals  
 Support

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28

## Stochastic Results: Initial Process

Know your audience and what they are looking for

Various, from reviewer through to Chief Actuary

Determine the messages the audience will find most useful

Governance review, challenge and approval

Select the best methods to display your messages

Probability Density Function, scenario results table

Design the display to show the information simply, clearly and accurately

Use default formatting

Choose a technology and implement the design

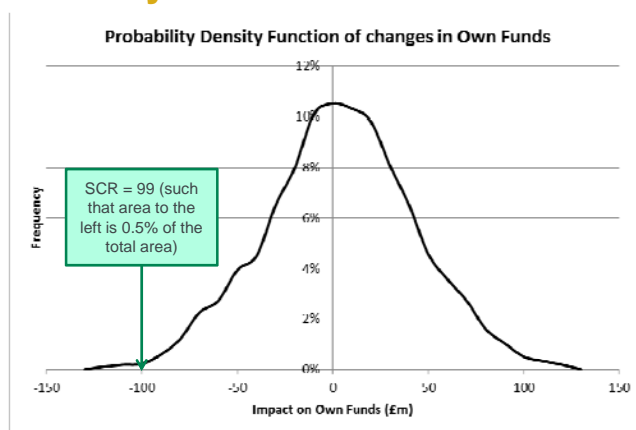
Excel



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29

## Probability Distribution Forecast: Attempt 1



- “Traditional” view
- Probability is represented by area under the curve
- Not straightforward to read off percentiles, or see whether the median is close to 0
- Y-axis is not especially meaningful

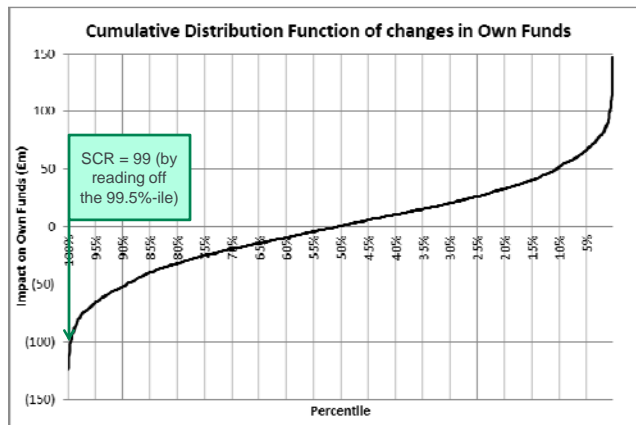
Good for: showing overall degree of symmetry/skew, comparisons of shape of different distributions



27 February 2014

30

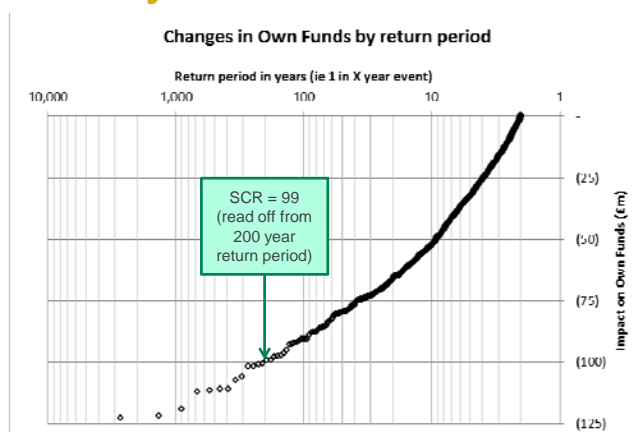
## Probability Distribution Forecast: Attempt 2



Good for: reading off percentiles across the body of the distribution, showing the contribution of different risks to the total (see later slides)

- Percentiles represented along the X-axis
- Straightforward to read off percentiles (except in the extremes?), and to see the median impact on own funds
- Gridlines are extra "ink", but facilitate reading off percentiles and impacts

## Probability Distribution Forecast: Attempt 3



Good for: reading off percentiles in the downside tail, showing the granularity of the underlying results

- Percentiles have been converted to "1 in X year" values, and shown on a log scale
- More straightforward to read off values, especially in the tail (where we are most interested)
- "Stretching" of the tail highlights sparseness of extreme simulations, not evident in the previous graphs



### Probability Distribution Forecast: Attempt 4

115.3 ± 18.6  
100.6 ± 6.9

0.1 % 1-in-1000  
0.5 % 1-in-200

50.8 ± 3.6

10.0 % 1-in-10

0.5 ± 2.2

50.0 % Median

-52.1 ± 2.7

90.0 % 1-in-10

-99.8 ± 7.1

99.5 % 1-in-200

-119.8 ± 9.6

99.9 % 1-in-1000

- “PDF summary plot” – related to box-and-whiskers/ candlestick plots, but with enhancements
- A summary of the PDF may be more useful than showing the whole distribution – this example focuses on 7 key points across the risk spectrum
- On the left-hand side we show the impact at each distribution point, along with an assessment of simulation error
- We can tell quite a lot about the distribution just from these 7 points, so we haven’t lost too much by summarising:
  - Distribution is fairly close to symmetrical
  - 1-in-200 events have roughly twice the impact of 1-in-10, like the Normal distribution
  - 1-in-1000 events not much larger than 1-in-200

Good for: minimising data/ink ratio, showing another dimension (eg simulation error), comparing distributions side by side

27 February 201433

### Scenario Level Results: Attempt 1

Drilling down into the scenario level results:

Percentile	Scenario	All risks change in OF (£m)	Interest rate risk change in OF (£m)	Credit risk change in OF (£m)	Longevity risk change in OF (£m)	Operational risk change in OF (£m)	Implied non-linearity/non-separability (£m)
100.0%	89	-123.74	-0.10	-81.26	-42.23	-0.24	0.10
100.0%	2336	-122.47	3.33	-92.76	-29.48	-0.29	-3.28
99.9%	238	-121.60	-23.18	-73.54	-47.37	-0.05	22.55
99.9%	1540	-119.01	-3.11	-78.76	-40.12	0.00	2.97
99.9%	1105	-111.91	-0.10	-89.79	-21.94	-0.17	0.09
99.8%	2258	-111.39	-5.18	-78.71	-31.75	-0.32	4.56
99.8%	2716	-111.00	2.46	-63.67	-47.55	-0.06	-2.19
99.7%	389	-110.81	-2.98	-82.69	-27.16	-0.59	2.61
99.7%	510	-107.30	-3.41	-90.41	-16.25	-0.12	2.89
99.7%	235	-105.98	0.07	-86.58	-18.98	-0.43	-0.06
99.6%	557	-101.64	3.21	-60.59	-41.42	-0.26	-2.58
99.6%	440	-101.57	5.12	-86.57	-15.70	-0.29	-4.13
99.6%	1365	-100.99	2.38	-71.90	-29.39	-0.18	-1.90
99.6%	2285	-100.58	-2.82	-70.24	-29.07	-0.66	2.20
99.5%	689	-99.19	-1.86	-73.04	-25.65	-0.08	1.44
99.4%	1202	-99.18	-5.21	-100.09	2.19	-0.08	4.00
99.4%	2761	-97.72	2.18	-59.24	-38.97	-0.01	-1.68
99.4%	2274	-97.50	4.76	-50.22	-48.22	-0.13	-3.68
99.3%	640	-97.27	2.28	-52.02	23.52	-70.70	-0.35
99.3%	541	-96.54	4.53	-75.73	-21.77	-0.10	-3.47
99.3%	2879	-94.96	-0.25	-95.03	0.81	-0.68	0.19
99.2%	373	-92.90	1.84	-82.36	-10.86	-0.18	-1.34
99.2%	1948	-92.60	3.91	-79.71	-13.85	-0.09	-2.86
99.2%	1038	-92.23	2.49	-74.69	-18.08	-0.15	-1.80
99.1%	2752	-91.98	-1.16	-70.20	-21.29	-0.16	0.83
99.1%	1083	-91.33	-2.88	-51.47	-39.00	0.00	2.03
99.0%	2355	-90.69	-2.16	-61.66	-27.93	-0.45	1.51
99.0%	1100	-90.63	3.57	-36.60	-54.82	-0.24	-2.54
99.0%	1750	-90.50	-2.94	-66.98	-22.55	-0.08	2.05

- Overly focussed on precise values
- Wasted “ink”, eg gridlines, repetitious headings
- Difficult to spot patterns

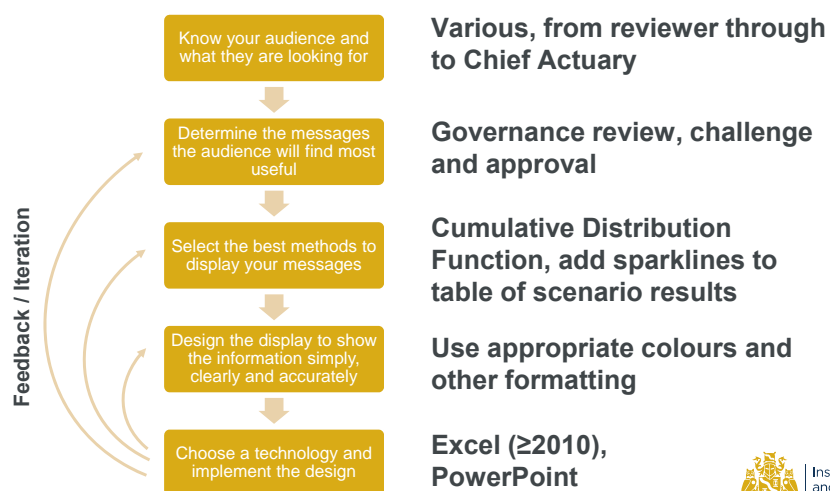
27 February 201434

## Scenario Level Results: Attempt 2

Euler allocation by risk		(99)	1	(75)	(21)	(4)	(0)
Changes in Own Funds arising from variations in... (€m)							
Percentile	Scenario	All risks	Interest rate risk	Credit risk	Longevity risk	Operational risk	Implied non-linearity & non-separability
100.0%	89	(124)	(0)	(81)	(42)	(0)	(0)
100.0%	2336	(122)	3	(93)	(29)	(0)	(3)
99.9%	238	(122)	(23)	(74)	(47)	(0)	(2)
99.9%	1540	(119)	(3)	(79)	(40)	(0)	(3)
99.9%	1105	(112)	(0)	(90)	(22)	(0)	(0)
99.8%	2258	(111)	(2)	(79)	(32)	(0)	(0)
99.8%	2716	(111)	2	(64)	(48)	(0)	(2)
99.7%	389	(111)	(3)	(83)	(27)	(1)	(0)
99.7%	510	(107)	(3)	(90)	(16)	(0)	(0)
99.7%	235	(106)	0	(87)	(19)	(0)	(0)
99.6%	557	(102)	3	(61)	(41)	(0)	(3)
99.6%	440	(102)	5	(87)	(16)	(0)	(4)
99.6%	1365	(101)	2	(72)	(29)	(0)	(2)
99.6%	2285	(101)	(3)	(70)	(29)	(1)	(2)
99.5%	689	(99)	(2)	(73)	(26)	(0)	(2)
99.4%	1202	(99)	(5)	(100)	2	(0)	(4)
99.4%	2761	(98)	2	(59)	(39)	(0)	(2)
99.4%	2274	(97)	5	(50)	(48)	(0)	(4)
99.3%	640	(97)	2	(52)	24	(71)	(0)
99.3%	541	(97)	5	(76)	(22)	(0)	(3)
99.3%	2879	(95)	(0)	(95)	1	(1)	(0)
99.2%	373	(93)	2	(82)	(11)	(0)	(1)
99.2%	1948	(93)	4	(80)	(14)	(0)	(3)
99.2%	1038	(92)	2	(75)	(18)	(0)	(2)
99.1%	2752	(92)	(1)	(70)	(21)	(0)	(1)
99.1%	1083	(91)	(3)	(51)	(39)	(0)	(2)
99.0%	2355	(91)	(2)	(62)	(28)	(0)	(2)
99.0%	1100	(91)	4	(37)	(55)	(0)	(3)
99.0%	1750	(91)	(3)	(67)	(23)	(0)	(0)

- Excessive precision removed
- Excel “sparklines” added to bring out patterns
- Data/ink ratio improved
- Enables insight into risk profile

## Stochastic Case Study: Updated Process



## Case Study 2: Lessons Learned

- Process
  - Trial-and-error is very useful (probably necessary) in improving visualisations
  - Use what you know about the business (e.g. risk profile, investment strategy) to determine whether the visualisation is working or not
    - Also, asking whether you can see things you already know puts you in a frame of mind where you might well notice other aspects not yet thought about
- Methodology
  - Changing the 'units of measurement' (density  $\Rightarrow$  distribution) or the scale (linear  $\Rightarrow$  log) can help bring out the important features
- Design
  - Using colour consistently (e.g. for the different risks) creates a sense of unity across different visualisations



27 February 2014

37

## Qualitative Visualisations

- Focus has been on **quantitative** visualisations
- However **qualitative** visualisations are also useful
  - Diagrams of model structure and data flow (e.g. [www.slateforexcel.com](http://www.slateforexcel.com))
  - Process diagrams and Gantt charts
  - Cognitive maps - see paper on complex systems by Neil Cantle and co-authors
  - Word clouds to get an overall sense of a (long and conceivably tedious) text



Word Cloud of the June 2013 IFRS  
Exposure draft on insurance contracts  
Produced using [www.wordle.net](http://www.wordle.net)



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38

## Non-Linear Presentation and Motion Charts

- PowerPoint presentations are very **linear**
  - Fixed sequence of slides
  - Hard to get a sense of the relationship between the detail and the big picture
- Prezi (<http://prezi.com>) is a new(ish) tool for **non-linear** presentation
  - Zoom into and out of different levels of detail
  - Move around key concepts using non-linear **paths**
  - Cross between a slide show and a whiteboard
- Similarly, motion charts are a method of adding extra dimensionality and interest into visualisations:
  - “Poor man’s” version can be undertaken in PowerPoint using sequential slides like a flickbook.
  - Google has an online tool ([Google Motion Chart](#)) to create simple motion charts, along the lines of the earlier, more sophisticated, Gapminder example.



27 February 2014

39

## Summary of principles

- Conceptual
  - Good visualisations aren’t especially difficult to develop and produce
  - The techniques for producing them can be studied and learned
    - Just like the communications exam!
  - It is possible to follow a well-defined process to maximise the effectiveness of your visualisations
    - Much of the content of the case studies resulted from following the process on slide 10
- Practical
  - Trial and error - don’t be afraid to try new things, present alternative ways of showing the same information, ask colleagues to critically evaluate your visualisations, and take forward the most popular
  - “**Maximise the data/ink ratio, within reason**” is the simplest principle to remember and apply
    - it will help drive all sorts of improvements
  - There are lots of resources out there to help
  - A technically imperfect chart that stimulates discussion and insight is better than a perfect one which is ignored

The [SIAS paper](#) discusses these principles in more depth



27 February 2014

40

## References (1): Books and articles

1. Friedman, Vitaly (2008) Data Visualization and Infographics  
In: *Graphics*, Monday Inspiration, January 14th, 2008.
2. Few, Stephen (2013): Data Visualization for Human Perception.  
In: Soegaard, Mads and Dam, Rikke Friis (eds.) *The Encyclopedia of Human-Computer Interaction, 2nd Ed* Aarhus, Denmark: The Interaction Design Foundation.
3. Shneiderman, Ben (quoted in Kirk, Andy (2012): Data Visualization: a successful design process)
4. Few, Stephen (quoted in Kirk, Andy (2012): Data Visualization: a successful design process)
5. Few, Stephen (2012): Show Me The Numbers
6. Tufte, Edward (2001): The Visual Display of Quantitative Information
7. Cairo, Alberto (2013): The Functional Art: An introduction to information graphics and visualization

Just a flavour – more in the [SIAS paper](#)



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41

## References (2): Websites

- <http://www.visualisingdata.com/index.php/resources/> (Lots of onward links)
- <http://visual.ly/>
- [http://www.visual-literacy.org/periodic\\_table/periodic\\_table.html](http://www.visual-literacy.org/periodic_table/periodic_table.html)
- <http://datawrapper.de/>
- <http://spatialanalysis.co.uk/>
- <http://flowingdata.com/>
- <http://www.informationisbeautiful.net/> (Accompanying book is useful for idea generation)
- <http://www.economist.com/blogs/graphicdetail>
- <http://www.guardian.co.uk/technology/data-visualisation>
- <http://peltiertech.com/Excel/Charts/ChartIndex.html> (Guidance/tutorials for Excel charts)
- <http://www.statmethods.net/> (Guidance/tutorials for producing charts in R)

*Links were valid at the time of writing,  
but may not remain so indefinitely.*



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42

Questions

Comments

Expressions of individual views by members of the Institute and Faculty of Actuaries and its staff are encouraged.


The views expressed in this presentation are those of the presenter.



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43



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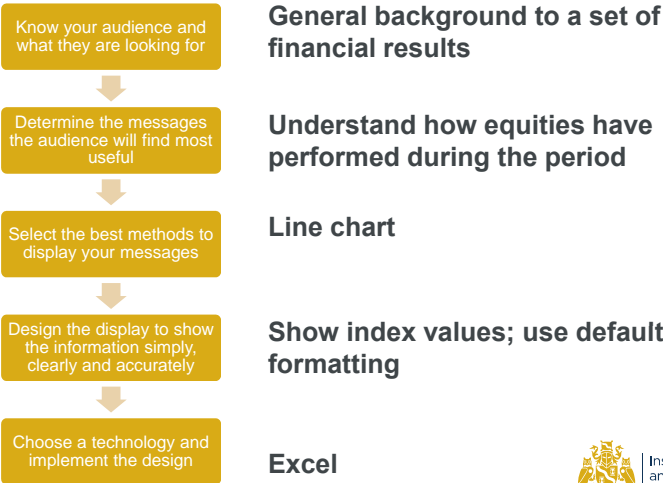
Appendix 1: Audience Case Study

ertise  
ponsorship  
Thought leadership  
Progress  
Community  
Sessional Meetings  
Education  
Working parties  
Volunteering  
Research  
Shaping the future  
Networking  
Professional support  
Enterprise and risk  
Learned society  
Opportunity  
International profile  
Journals  
Support

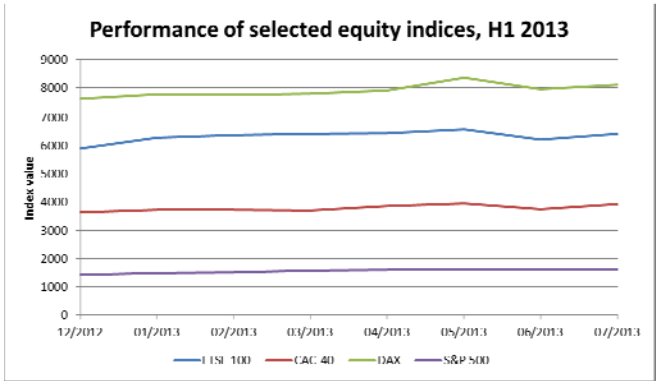
27 February 2014

44

## Equity Market Trends: Initial Process



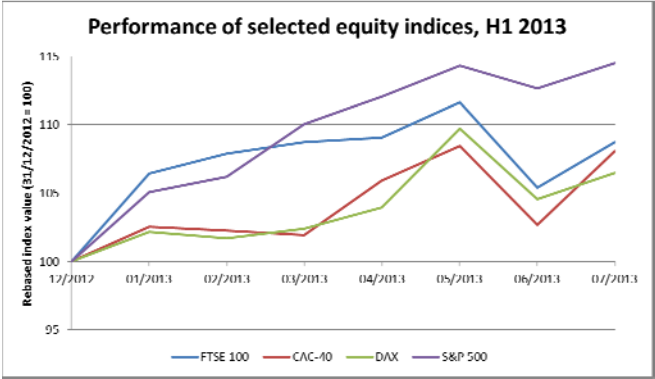
## Equity Market Trends: Attempt 1



Strengths?  
Weaknesses?  
Suggestions for improvement?



# Equity Market Trends: Attempt 2



Strengths?  
Weaknesses?  
Suggestions for improvement?

