# Code-based, open-source software for teaching interactive data visualisation

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#### Problem

Introduction

### Tukey (1965, p. 25)

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- How does interactivity benefit data analysis?
- Which interactive techniques are 'worth learning'?
- Which code-based, open-source software to use?



Introduction

- Literature review of interactive techniques.
  - Interactive data visualisation using GGobi graphical user interface (Cook and Swayne, 2007)
- Survey of current code-based, open-source software.
- Application to exploratory data analysis of 2016 National Certificate Educational Achievement (NCEA) results.
  - Explore how interactive techniques further insight into data.



## Findings

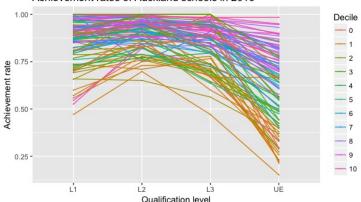
- Key interactive techniques that enrich data analysis:
  - Linked brushing
  - Identification
  - Scaling
  - Subset selection
  - Tours
- A focal set of R packages for applying interactive data visualisation: **plotly**, **crosstalk** & **shiny**.
  - Ease of installation and application
  - Coverage of interactive techniques
- Interactive data visualisation is worthwhile teaching.



## Leveraging static plots

## Parallel coordinates plot (PCP)

Achievement rates of Auckland schools in 2016





# Leveraging static plots

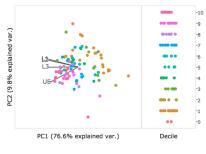
#### Parallel coordinates plot (PCP)

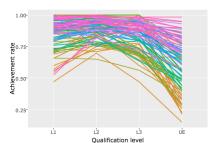
- Linked brushing and identification allow fast querying of unusual patterns, groups and/or individuals.
- Interactive scaling to compare and explore the different patterns revealed.
- Subset selection via filtering views alleviates issues with overplotting.



# Relating multiple views

#### Principal components plot and PCP





# Relating multiple views

#### Principal components plot and PCP

- Insights into multivariate data structures gained from individual static plots are extended by linked brushing.
- Applying interactive data visualisation encourages further exploration of the data.
  - Questions are quickly addressed and more questions arise from probing the data with interactive techniques.
- Awareness of the strengths and weaknesses of different software allows for efficient application of interactive techniques.



## A focal set of software

Coverage of interactive techniques by **shiny**, **plotly** and **crosstalk**.

Package	Active R session	Tooltip Identification	Scaling	Subset selection	Linked brushing (except lines)	Animation (for tours)
Shiny	Yes			Analysis & filtering views	Aggregate brush possible	Yes
Plotly		Yes	Zoom in or out	Filtering views only		Yes
Crosstalk				Filtering views only	Easiest for 1-to-1	Yes



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#### Conclusion

- Interactive techniques benefit data analysis.
  - Insights beyond static plots.
  - Relate multiple views.
  - Further exploration of structures.
- The R packages shiny, plotly and crosstalk enable interactive data visualisation with code-based, open-source software.
- The benefits of applying interactive techniques to data analysis warrant teaching interactive data visualisation to future statisticians.



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