#### **Data Visualisation**

#### Jingpeng Li

© University of Stirling 2019

CSCU9T6 Information Systems

1 of 28

#### **Data Visualisation**

- Our eyes are very good at data mining
- We can spot patterns, trends and clusters instantly in plotted data
- Problems begin when data covers more than a few dimensions
- Provides a good way to choose a more powerful data mining technique

© University of Stirling 2019

CSCU9T6 Information Systems

#### When to Use It

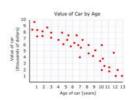
- Before starting a data mining project, to understand the problem
- To guide the data mining project and choice of technique
- To improve the use of data mining techniques, e.g. choosing a number of clusters
- To show the results of a data mining analysis

© University of Stirling 2019

CSCU9T6 Information Systems

3 of 28

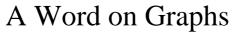
#### **Scatter Plots**



- Perfect for seeing how one variable changes with another
- Can be used to see how well one variable predicts another
- Can be used to see how two variables combine to form clusters or a state space

© University of Stirling 2019

CSCU9T6 Information Systems





- Always give your graph a title
- Always label both axes with variable names and, if appropriate units (e.g. Spend in pounds or Number of products sold)
- Always show the scale of both axes
- Bar charts are for frequencies (counts of things)
- Line graphs are for continuous variables

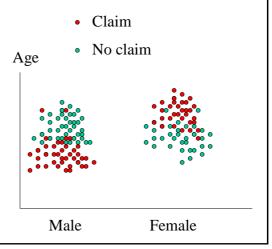
© University of Stirling 2019

CSCU9T6 Information Systems

5 of 28

#### Scatter Plots – Insurance Claims

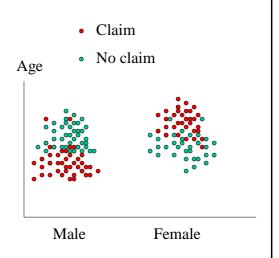
- Here is an example from a previous lecture
- It is easy to see that younger males and older females make claims



3

#### Class Labels

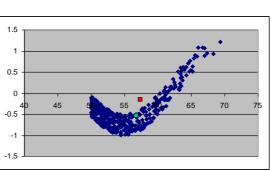
 Notice how the plot uses colour to represent the outcome class



# Scatter Plots – Machine Monitoring

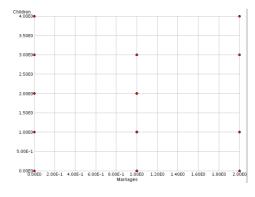
• Another previous example – machine health monitoring

This plot shows the operating relationship between temperature and pressure in a machine



# Overlap Problems

- Look at this plot, which plots the number of marriages a person has had against number of children they have
- We cannot tell if there are 1 or 100 examples at each point



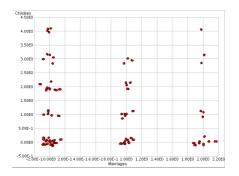
© University of Stirling 2019

CSCU9T6 Information Systems

9 of 28

#### **Jitter**

- This is the same data, but with small random amounts added to each value
- Notice how the distribution of points is revealed



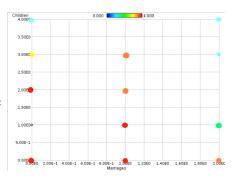
© University of Stirling 2019

CSCU9T6 Information Systems

10 of 28

## Colour as Frequency

- By using a colour scale (red, orange, yellow, blue in this example), the number of times a data point is represented may be shown
- Size can also be used in place of colour



© University of Stirling 2019

CSCU9T6 Information Systems

11 of 28

#### **Problems With Dimensions**

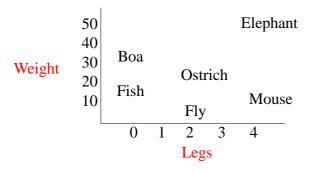
- Plotting two things against each other is fine
- But what about looking at 3,4 5 or more variables?
- We have already seen one way of adding a third dimension colour.





# Colour or Shape As a Dimension

• Category values can have their own colour or shape, or even a word or picture:



#### Projection

- If your data comes from a system that has more dimensions than you can plot, you will probably suffer problems with projection
- Imagine a cloud of moths flying in front of a projector. They occupy 3D space, but the shadow they project onto a wall is in 2D
- The third dimension (distance from the wall) is lost

© University of Stirling 2019

CSCU9T6 Information Systems

## Projection

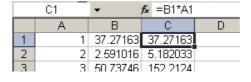
- The same happens with plotting data
- Plotting data in fewer dimensions than it contains means that you see the 'shadow' of higher dimensions
- That spoils your plot

© University of Stirling 2019

CSCU9T6 Information Systems

15 of 28

#### Example



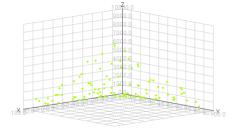
10000 9000 8000 7000 6000 5000 9000 1000 0 20 40 60 80 100 120 Column C is determined by A and B, but plotting B against C suggests only a weak relationship

If your plot could show A and B against C, the true shape of the relationship would appear.

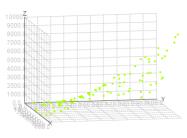
© University of Stirling 2019

CSCU9T6 Information Systems

#### The Same Data in 3D



Software that can rotate 3D views helps you see that extra dimension



http://www.math.uri.edu/~bkaskosz/flashmo/graph3d/ where  $x \in (0,1000)$ ,  $y \in (0,10)$ 

## Solving Projection Problems

- Represent all the dimensions in some way
  - Colour, shape etc. as we have seen
  - Size to show the third dimension larger things being closer
- Software that is able to rotate any 'fly' through data, switching dimensions to allow you to search for patterns
- Reduce the dimensionality

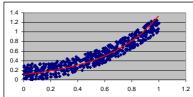
© University of Stirling 2019

CSCU9T6 Information Systems

## **Dimensionality Reduction**

- If two or more dimensions are related, they can be reduced to a single, new dimension without loosing too much information
- This new single dimension can be plotted against others to allow deeper relationships to be found

Always a loss of information



#### **Dimensionality Reduction**

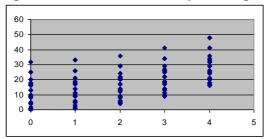
- Example techniques are:
  - Principal components reduction
  - Non-linear principal components reduction
  - Auto-associative neural networks
- Disadvantage is that the new dimensions are combinations of the original ones and might not make as much sense

© University of Stirling 2019

CSCU9T6 Information Systems

## Keep Some Constant

Here is an example with 3 inputs -a, b, c and one output -d, which is affected by all 3 inputs



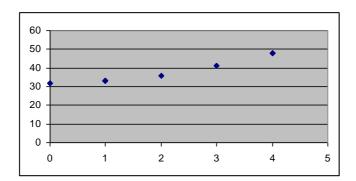
Here is a plot of input c against output d. The other variables are projected down onto the chart to show a mess of values

© University of Stirling 2019

CSCU9T6 Information Systems

21 of 28

## Keep Some Constant



Now we keep a and b constant and just plot c against d. In other words, we choose a combination of a and b that appear several times and plot a and b for just those points.

## Visualising Data for Users

- Scientific charts might not always be the best way to represent data to users or to the press
- Other visualisations can be more appropriate in the right setting

© University of Stirling 2019

CSCU9T6 Information Systems

23 of 28

# Infographics

- Methods for displaying summaries of data in an attractive way
- Less of an analysis tool
- More of presentation tool
- Static or interactive

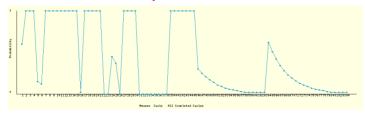
© University of Stirling 2019

CSCU9T6 Information Systems

#### Recent Example

- The project is to build a system that predicts the side effects that chemotherapy patients are likely to suffer on a daily basis throughout their treatment
- Here is a traditional time-series plot of a set of predictions:

Probability of Nausea Over Time



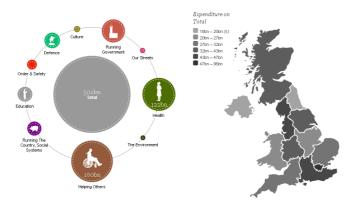
• Easy enough for us to understand – the higher the line, the larger the risk of suffering from the symptom, i.e. nausea.

#### Recent Example

- For people who are not used to looking at charts, there might be a better way of presenting the same information
- In this example, we tried to use the familiar concept of a diary to present the same data
- Looks less like a
  scientific chart, but
  makes it much easier to
  see that planning a
  weekend away over the
  7th and 8th of March
  might not be the best time
  to choose.







www.wheredoesmymoneygo.org/bubbletree-map.html#/~/total

© University of Stirling 2019

CSCU9T6 Information Systems

27 of 28

## Hans Rosling's Famous Video

- It combine enormous quantities of public data to reveal the story of the world's past, present and future development.
  - https://www.youtube.com/watch?v=jbkSRLYSojo
- How many dimensions of the data are used?
  - Income (x), life span (y)
  - population (circle size), country region (circle colour)
  - time, country name