

ETC5521: Exploratory Data Analysis

Learning from history

Lecturer: *Di Cook*

✉ ETC5521.Clayton-x@monash.edu

CALENDAR Week 2 - Session 1



Birth of EDA

John W. Tukey

EXPLORATORY DATA ANALYSIS



The field of exploratory data analysis came of age when this book appeared in 1977.

Tukey held that too much emphasis in statistics was placed on statistical hypothesis testing (confirmatory data analysis); more emphasis needed to be placed on using data to suggest hypotheses to test.

John W. Tukey



Born in 1915, in New Bedford, Massachusetts.

Mum was a private tutor who home-schooled John. Dad was a Latin teacher.

BA and MSc in Chemistry, and PhD in Mathematics

Awarded the National Medal of Science in 1973, by President Nixon

By some reports, his home-schooling was unorthodox and contributed to his thinking and working differently.

3/24

Taking a glimpse back in time

is possible with the [American Statistical Association video lending library](#).

We're going to watch John Tukey talking about exploring high-dimensional data with an amazing new computer in 1973, four years before the EDA book.

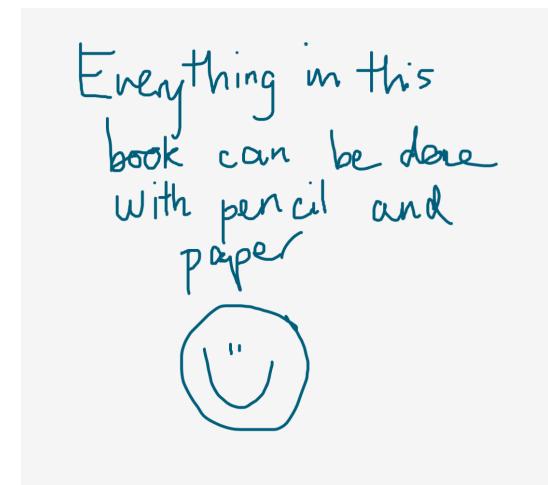
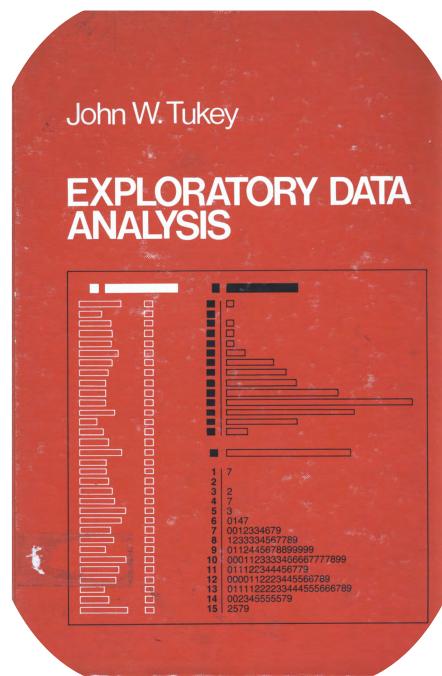
💡 Look out for these things:

Tukey's expertise is described as *for trial and error learning* and the computing equipment.

prim9



5/24



6/24

Setting the frame of mind

To learn about data analysis, it is right that each of us try many things that do not work--that we tackle more problems than we make expert analyses of. We often learn less from an expertly done analysis than from one where, by not trying something, we missed--at least until we were told about it--an opportunity to learn more. Each teacher needs to recognize this in grading and commenting on problems.

Precision

The teacher who heeds these words and admits that there need be *no one correct approach* may, I regret to contemplate, still want whatever is done to be digit perfect. (Under such a requirement, the write should still be able to pass the course, but it is not clear whether she would get an "A".) One does, from time to time, have to produce digit-perfect, carefully checked results, but forgiving techniques that are not too distributed by unusual data are also, usually, *little disturbed by SMALL arithmetic errors*. The techniques we discuss here have been chosen to be forgiving. It is hoped, then, that small arithmetic errors will take little off the problem's grades, leaving severe penalties for larger errors, either of arithmetic or concept.

7/24

Outline

- 1. Scratching down numbers
- 2. Schematic summary
- 3. Easy re-expression
- 4. Effective comparison
- 5. Plots of relationship
- 6. Straightening out plots (using three points)
- 7. Smoothing sequences
- 8. Parallel and wandering schematic plots
- 9. Delineations of batches of points
- 10. Using two-way analyses
- 11. Making two-way analyses
- 12. Advanced fits
- 13. Three way fits
- 14. Looking in two or more ways at batches of points
- 15. Counted fractions
- 16. Better smoothing
- 17. Counts in bin after bin
- 18. Product-ratio plots
- 19. Shapes of distributions
- 20. Mathematical distributions

8/24

Scratching down numbers

Prices of Chevrolet in the local used car newspaper ads of 1968.

Stem-and-leaf plot: still seen introductory statistics books

Export

```
250, 150, 795, 895, 695,  
1699, 1499, 1099, 1693,  
1166, 688, 1333, 895,  
1775, 895, 1895, 795
```

First stem-and-leaf, first digit on stem, second digit on leaf

$$250 = 2|5$$

1	5
2	5
3	
4	
5	
6	9 8
7	9 9
8	9 9 9
9	
10	9
11	6
12	3
13	3
14	9
15	
16	9 9
17	7
18	9

Order any leaves which need it, eg stem 6

$$250 = 2|5$$

1	5
2	5
3	
4	
5	
6	8 9
7	9 9
8	9 9 9
9	
10	9
11	6
12	3
13	3
14	9
15	
16	9 9
17	7
18	9

A benefit is that the numbers can be read off the plot, but the focus is still on the pattern. Also quantiles like the median, can be computed easily.

11/24

Shrink the stem

1.	5 5
3.	
5.	8 9
7.	9 9 9 9 9
9.	9
11.	6
13.	3 9
15.	9 9
17.	7 9

Shrink the stem more

0-5	5 5
6-9	9 9 9 8 9 9 9
10-15	9 9 6 3
16-20	9 9 7 9

12/24

And, in R ...

```
stem(chevrolets$prices)

##
##      The decimal point is 3 digit(s) to the right of the |
##
##      0 | 23
##      0 | 7788999
##      1 | 123
##      1 | 57789
```

13/24

Remember the tips data

```
tips <- read_csv("http://ggobi.org/book/data/tips.csv")
stem(tips$tip, scale=0.5, width=120)

##
##      The decimal point is at the |
##
##      1 | 0000012333344455555555556666667777788889
##      2 | 0000000000000000000000000000000000000000000011222222333355555555566778889
##      3 | 000000000000000000000000000000000000000000001111112222223333444455555555566778889
##      4 | 0000000000001112233335777
##      5 | 00000000001122226799
##      6 | 05577
##      7 | 6
##      8 |
##      9 | 0
##     10 | 0
```

14/24

Refining the size

3.	8	Tate	(1)
4*	0121243121300214202		(19)
4-	597886556569		(12)
5*	142010		(6)
5-	977899958797		(12)
6*	412441		(6)
6-	898598		(6)
7*	320341203		(9)
7-	86657		(5)
8*	303		(3)
8-	8	Hinds	(1)
9*	24	Bolivar, Yazoo	(2)

A) FIVE-LINE VERSION

		(#)
1*	1	(1)
t	2333	(4)
f	445555	(6)
s	66677	(5)
.	88	(2)
2*	0000011	(7)
t	23	(2)
f	445	(3)
s	6	(1)
.	9	(1)
3*	1	(1)
t	3	(1)
f		
s		

15/24

16/24

Similar information to the histogram. Generally it is possible to also read off the numbers, and to then easily calculate median or Q1 or Q3. However, its really designed for small data sets and for pencil and paper.

17/24

a different style of number scratching

We know about

/ // /// //// ////

but its too easy to

// or ////

make a mistake

Try this instead

4 is ::

8 is □

10 is ✗

18/24

Count this data using the squares approach.

```
## [1] "Sun" "Sun" "Sun" "Sun"  
## [5] "Sun" "Sun" "Sun" "Sun"  
## [9] "Sun" "Sun" "Sun" "Sun"  
## [13] "Sun" "Sun" "Sun" "Sun"  
## [17] "Sun" "Sun" "Sun" "Sat"  
## [21] "Sat" "Sat" "Sat" "Sat"  
## [25] "Sat" "Sat" "Sat" "Sat"  
## [29] "Sat" "Sat" "Sat" "Sat"  
## [33] "Sat" "Sat" "Sat" "Sat"  
## [37] "Sat" "Sat" "Sat" "Sat"  
## [41] "Sat" "Sun" "Sun" "Sun"  
## [45] "Sun" "Sun" "Sun" "Sun"  
## [49] "Sun" "Sun" "Sun" "Sun"  
## [53] "Sun" "Sun" "Sun" "Sun"  
## [57] "Sat" "Sat" "Sat" "Sat"  
## [61] "Sat" "Sat" "Sat" "Sat"  
## [65] "Sat" "Sat" "Sat" "Sat"
```

 Export

19/24



What does it mean to "feel what the data are like?"

20/24

exhibit 10 of chapter 1: state heights

The heights of the highest points in each state

A) STEM-and-LEAF--unit 100 feet

		(#)
0*	43588	Del, Fla, La, Miss, RI
1	237886	(5)
2	484030	(6)
3	45526	(6)
4*	80149	(5)
5	34307	(5)
6	376	(3)
7	2	S. Dak
8*	8	Texas
9		(1)
10		(1)
11	2	Oregon
12*	768	(3)
13	81258	(5)
14	544	Calif, Colo, Wash
15		(3)
16*		
17		
18		
19		
20*	3	Alaska
		(1)
		(50, √)

This is a stem and leaf of the height of the highest peak in each of the 50 US states.

The states roughly fall into three groups.

It's not really surprising, but we can imagine this grouping. Alaska is in a group of its own, with a much higher high peak. Then the Rocky Mountain states, California, Washington and Hawaii also have high peaks, and the rest of the states lump together.



Exploratory data analysis is detective work -- in the purest sense -- finding and revealing the clues.

Resources

[wikipedia](#)

John W. Tukey (1977) Exploratory data analysis

Data coding using [tidyverse suite of R packages](#)

Sketching canvases made using [fabricerin](#)

Slides constructed with [xaringan](#), [remark.js](#), [knitr](#), and [R Markdown](#).

23/24



This work is licensed under a [Creative Commons Attribution-ShareAlike 4.0 International License](#).

Lecturer: *Di Cook*

✉ ETC5521.Clayton-x@monash.edu

🗓 Week 2 - Session 1

