Seventh Edition

STATISTICS FOR ECONOMICS, Accounting and Business Studies

MICHAEL BARROW





Statistics for Economics, Accounting and Business Studies



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Statistics for Economics, Accounting and Business Studies

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For Patricia, Caroline and Nicolas

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Guided tour of the book



Practising and testing your understanding



Guided tour of the book



Exercises throughout the chapter allow you to stop and check your understanding of the topic you have just learned. You can check the **answers** at the end of each chapter.

Reinforcing your understanding

Problems at the end of each chapter range in difficulty to provide a more in-depth practice of topics.



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Preface to the seventh edition

This text is aimed at students of economics and the closely related disciplines of accountancy, finance and business, and provides examples and problems relevant to those subjects, using real data where possible. The text is at a fairly elementary university level and requires no prior knowledge of statistics, nor advanced mathematics. For those with a weak mathematical background and in need of some revision, some recommended texts are given at the end of this preface.

This is not a cookbook of statistical recipes: it covers all the relevant concepts so that an understanding of why a particular statistical technique should be used is gained. These concepts are introduced naturally in the course of the text as they are required, rather than having sections to themselves. The text can form the basis of a one- or two-term course, depending upon the intensity of the teaching.

As well as explaining statistical concepts and methods, the different schools of thought about statistical methodology are discussed, giving the reader some insight into some of the debates that have taken place in the subject. The text uses the methods of classical statistical analysis, for which some justification is given in Chapter 5, as well as presenting criticisms that have been made of these methods.

Changes in this edition

There are limited changes in this edition, apart from a general updating of the examples used in the text. Other changes include:

- A new section on how to write statistical reports (Chapter 1)
- Examples of good and bad graphs, and how to improve them
- Illustrations of graphing regression coefficients as a means of presentation
- Probability chapter expanded to improve exposition
- More discussion and critique of hypothesis testing
- New Companion Website for students including quizzes to test your knowledge and Excel data files
- As before, there is an associated blog on statistics and the teaching of the subject. This is where I can comment on interesting stories and statistical issues, relating them to topics covered in this text. You are welcome to comment on the posts and provide feedback on the text. The blog can be found at http://anecdotesandstatistics.blogspot.co.uk/.

For lecturers:

- As before, PowerPoint slides are available containing most of the key tables, formulae and diagrams, which can be adapted for lecture use
- Answers to even-numbered problems (not included in the text itself)
- An Instructor's Manual giving hints and guidance on some of the teaching issues, including those that come up in response to some of the exercises and problems.

For students:

• The associated website contains numerous exercises (with answers) for the topics covered in this text. Many of these contained randomised values so that you can try out the tests several times and keep track of you progress and understanding.

Mathematics requirements and suggested texts

No more than elementary algebra is assumed in this text, any extensions being covered as they are needed in the text. It is helpful to be comfortable with manipulating equations, so if some revision is needed, I recommend one of the following books:

Jacques, I., *Mathematics for Economics and Business*, 8th edn, Pearson, 2015 Renshaw, G., *Maths for Economists*, 4th edn, Oxford University Press, 2016.

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If you are teaching an introductory statistics course for economics and business students, do you also teach an introductory mathematics course for economics and business students? If you do, you might find chapters from *Mathematics for Economics and Business, Sixth Edition* by Ian Jacques useful for your course. If you are teaching a yearlong course, you may wish to recommend both texts. Some adopters have found, however, that they require just one or



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Introduction

Statistics is a subject which can be (and is) applied to every aspect of our lives. The printed publication Guide to Official Statistics is, sadly, no longer produced but the UK Office for National Statistics website¹ categorises data by 'themes', including education, unemployment, social cohesion, maternities and more. Many other agencies, both public and private, national and international, add to this evergrowing volume of data. It seems clear that whatever subject you wish to investigate, there are data available to illuminate your study. However, it is a sad fact that many people do not understand the use of statistics, do not know how to draw proper inferences (conclusions) from them, or misrepresent them. Even (especially?) politicians are not immune from this. As I write the UK referendum campaign on continued EU membership is in full swing, with statistics being used for support rather than illumination. For example, the 'Leave' campaign claims the United Kingdom is more important to the European Union than the EU is to the UK, since the EU exports more to the UK than vice versa. But the correct statistic to use is the *proportion* of exports (relative to GDP). About 45% of UK exports go to the EU but only about 8% of EU exports come to the UK, so the UK is actually the more dependent one. Both sets of figures are factually correct but one side draws the wrong conclusion from them.

People's intuition is often not very good when it comes to statistics – we did not need this ability to evolve, so it is not innate. A majority of people will still believe crime is on the increase even when statistics show unequivocally that it is decreasing. We often take more notice of the single, shocking story than of statistics which count all such events (and find them rare). People also have great difficulty with probability, which is the basis for statistical inference, and hence make erroneous judgements (e.g. how much it is worth investing to improve safety). Once you have studied statistics, you should be less prone to this kind of error.

Two types of statistics

The subject of statistics can usefully be divided into two parts: descriptive statistics (covered in Chapters 1, 10 and 11 of this book) and inferential statistics (Chapters 4–8), which are based upon the theory of probability (Chapters 2 and 3). Descriptive statistics are used to summarise information which would otherwise be too complex to take in, by means of techniques such as averages and graphs. The graph shown in Figure 1.1 is an example, summarising drinking habits in the United Kingdom.

The graph reveals, for instance, that about 43% of men and 57% of women drink between 1 and 10 units of alcohol per week (a unit is roughly equivalent to one glass of wine or half a pint of beer). The graph also shows that men tend to

¹https://www.ons.gov.uk/

Figure 1.1

Alcohol consumption in the United Kingdom



drink more than women (this is probably no surprise to you), with higher proportions drinking 11 to 20 units and over 21 units per week. This simple graph has summarised a vast amount of information, the consumption levels of about 45 million adults.

Even so, it is not perfect and much information is hidden. It is not obvious from the graph that the average consumption of men is 16 units per week, of women only 6 units. From the graph, you would probably have expected the averages to be closer together. This shows that graphical and numerical summary measures can complement each other. Graphs can give a very useful visual summary of the information but are not very precise. For example, it is difficult to convey in words the content of a graph; you have to see it. Numerical measures such as the average are more precise and are easier to convey to others. Imagine you had data for student alcohol consumption; how do you think this would compare to the graph? It would be easy to tell someone whether the average is higher or lower, but comparing the graphs is difficult without actually viewing them.

Conversely, the average might not tell you important information. The problem of 'binge' drinking is related not to the average (though it does influence the average) but to extremely high consumption by some individuals. Other numerical measures (or an appropriate graph) are needed to address the issue.

Statistical inference, the second type of statistics covered, concerns the relationship between a sample of data and the population (in the statistical sense, not necessarily human) from which it is drawn. In particular, it asks what inferences can be validly drawn about the population from the sample. Sometimes the sample is not representative of the population (either due to bad sampling procedures or simply due to bad luck) and does not give us a true picture of reality.

The graph above was presented as fact but it is actually based on a sample of individuals, since it would obviously be impossible to ask everyone about their drinking habits. Does it therefore provide a true picture of drinking habits? We can be reasonably confident that it does, for two reasons. First, the government statisticians who collected the data designed the survey carefully, ensuring that all age groups are fairly represented and did not conduct all the interviews in pubs, for example. Second, the sample is a large one (about 10 000 households), so there is little possibility of getting an unrepresentative sample by chance. It would be very unlucky indeed if the sample consisted entirely of teetotallers, for example. We can be reasonably sure, therefore, that the graph is a fair reflection of reality and that the average woman drinks around 6 units of alcohol per week. However,

Figure 1.2 Birth rate v. growth rate



we must remember that there is some uncertainty about this estimate. Statistical inference provides the tools to measure that uncertainty.

The scatter diagram in Figure 1.2 (considered in more detail in Chapter 7) shows the relationship between economic growth and the birth rate in 12 developing countries. It illustrates a negative relationship – higher economic growth appears to be associated with lower birth rates.

Once again we actually have a sample of data, drawn from the population of all countries. What can we infer from the sample? Is it likely that the 'true' relationship (what we would observe if we had all the data) is similar, or do we have an unrepresentative sample? In this case the sample size is quite small and the sampling method is not known, so we might be cautious in our conclusions.

Statistics and you

By the time you have finished this text you will have encountered and, I hope, mastered a range of statistical techniques. However, becoming a competent statistician is about more than learning the techniques, and comes with time and practice. You could go on to learn about the subject at a deeper level and discover some of the many other techniques that are available. However, I believe you can go a long way with the simple methods you learn here, and gain insight into a wide range of problems. A nice quotation relating to this is contained in the article 'Error Correction Models: Specification, Interpretation, Estimation', by G. Alogoskoufis and R. Smith in the *Journal of Economic Surveys*, 1991 (vol. 5, pages 27–128), examining the relationship between wages, prices and other variables. After 19 pages analysing the data using techniques far more advanced than those presented in this book, they state '. . . the range of statistical techniques utilised have not provided us with anything more than we would have got by taking the [. . .] variables and looking at their graphs'. Sometimes advanced techniques are needed, but never underestimate the power of the humble graph.

Beyond a technical mastery of the material, being a statistician encompasses a range of more informal skills which you should endeavour to acquire. I hope that you will learn some of these from reading this text. For example, you should be able to spot errors in analyses presented to you, because your statistical 'intuition' rings a warning bell telling you something is wrong. For example, the *Guardian* newspaper, on its front page, once provided a list of the 'best' schools in England,

based on the fact that in each school, every one of its pupils passed a national exam – a 100% success rate. Curiously, all of the schools were relatively small, so perhaps this implies that small schools get better results than large ones? Once you can think statistically you can spot the fallacy in this argument. Try it. The answer is at the end of this introduction.

Here is another example. The UK Department of Health released the following figures about health spending, showing how planned expenditure (in £m) was to increase.

					Total increase over
	1998-99	1999-2000	2000-1	2001-2	three-year period
Health spending	37 169	40 228	43 129	45 985	17 835

The total increase in the final column seems implausibly large, especially when compared to the level of spending. The increase is about 45% of the level. This should set off the warning bell, once you have a 'feel' for statistics (and, perhaps, a certain degree of cynicism about politics). The 'total increase' is the result of counting the increase from 1998–99 to 1999–2000 *three times*, the increase from 1999–2000 to 2000–1 *twice*, plus the increase from 2000–1 to 2001–2. It therefore measures the *cumulative* extra resources to health care over the whole period, but not the year-on-year increase, which is what many people would interpret it to be.

You will also become aware that data cannot be examined without their context. The context might determine the methods you use to analyse the data, or influence the manner in which the data are collected. For example, the exchange rate and the unemployment rate are two economic variables which behave very differently. The former can change substantially, even on a daily basis, and its movements tend to be unpredictable. Unemployment changes only slowly and if the level is high this month, it is likely to be high again next month. There would be little point in calculating the unemployment rate on a daily basis, yet this makes some sense for the exchange rate. Economic theory tells us quite a lot about these variables even before we begin to look at the data. We should therefore learn to be guided by an appropriate theory when looking at the data – it will usually be a much more effective way to proceed.

Another useful skill is the ability to present and explain statistical concepts and results to others. If you really understand something, you should be able to explain it to someone else – this is often a good test of your own knowledge. Below are two examples of a verbal explanation of the variance (covered in Chapter 1) to illustrate.

Good explanation

Bad explanation resses The variance is

The variance of a set of observations expresses how spread out are the data. A low value of the variance indicates that the observations are of similar magnitude, a high value indicates that they are widely spread around the average. The variance is a formula for the deviations, which are squared and added up. The differences are from the mean, and divided by n or sometimes by n - 1.

The bad explanation is a failed attempt to explain the formula for the variance and gives no insight into what it really is. The good explanation tries to convey the meaning of the variance without worrying about the formula (which is best written down). For a (statistically) unsophisticated audience the explanation is quite useful and might then be supplemented by a few examples.

Statistics can also be written well or badly. Two examples follow, concerning a confidence interval, which is explained in Chapter 4. Do not worry if you do not understand the statistics now.

Good explanation	Bad explanation
The 95% confidence interval is given by	95% interval = $\overline{x} - 1.96\sqrt{s^2/n}$ =
$\overline{x} \pm 1.96 \times \sqrt{s^2/n}$	$\overline{x} + 1.96\sqrt{s^2/n} = 0.95$
Inserting the sample values $\overline{x} = 400$, $s^2 = 1600$	$=400-1.96\sqrt{1600/30}$ and
and $n = 30$ into the formula we obtain	$= 400 + 1.96\sqrt{1600/30}$
$400 \pm 1.96 \times \sqrt{1600/30}$	so we have [385.7, 414.3]
y icianing the miter var	

[385.7, 414.3]

In good statistical writing there is a logical flow to the argument, like a written sentence. It is also concise and precise, without too much extraneous material. The good explanation exhibits these characteristics whereas the bad explanation is simply wrong and incomprehensible, even though the final answer is correct. You should therefore try to note the way the statistical arguments are laid out in this text, as well as take in their content. Chapter 1 contains a short section on how to write good statistical reports.

When you do the exercises at the end of each chapter, try to get another student to read through your work. If they cannot understand the flow or logic of your work, then you have not succeeded in presenting your work sufficiently accurately.

How to use this book

For students:

You will not learn statistics simply by reading through this text. It is more a case of 'learning by doing' and you need to be actively involved by such things as doing the exercises and problems and checking your understanding. There is also material on the website, including further exercises, which you can make use of.

Here is a suggested plan for using the book.

- Take it section by section within each chapter. Do not try to do too much at one sitting.
- First, read the introductory section of the chapter to get an overview of what you are going to learn. Then read through the first section of the chapter trying to follow all the explanation and calculations. Do not be afraid to check the working of the calculations. You can type the data into Excel (it does not take long) to help with calculation.
- Check through the worked example which usually follows. This uses small amounts of data and focuses on the techniques, without repeating all the descriptive explanation. You should be able to follow this fairly easily. If not, work out where you got stuck, then go back and re-read the relevant text. (This is all obvious, in a way, but it's worth saying once.)

- Now have a go at the exercise, to test your understanding. Try to complete the exercise *before* looking at the answer. It is tempting to peek at the answer and convince yourself that you did understand and could have done it correctly. This is not the same as actually doing the exercise really it is not.
- Next, have a go at the relevant problems at the end of the chapter. Answers to odd-numbered problems are at the back of the book. Your tutor will have answers to the even-numbered problems. Again, if you cannot do a problem, figure out what you are missing and check over it again in the text.
- If you want more practice you can go online and try some of the additional exercises.
- Then, refer back to the learning outcomes to see what you have learnt and what is still left to do.
- Finally finally take a deserved break.

Remember – you will probably learn most when you attempt and solve (or fail to) the exercises and problems. That is the critical test. It is also helpful to work with other students rather than only on your own. It is best to attempt the exercises and problems on your own first, but then discuss them with colleagues. If you cannot solve it, someone else probably did. Note also that you can learn a lot from your (and others') mistakes – seeing why a particular answer is wrong is often as informative as getting the right answer.

For lecturers and tutors:

You will obviously choose which chapters to use in your own course, it is not essential to use all of the material. Descriptive statistics material is covered in Chapters 1, 10 and 11; inferential statistics is covered in Chapters 4 to 8, building upon the material on probability in Chapters 2 and 3. Chapter 9 covers sampling methods and might be of interest to some but probably not all.

You can obtain PowerPoint slides to form the basis of you lectures if you wish, and you are free to customize them. The slides contain the main diagrams and charts, plus bullet points of the main features of each chapter.

Students can practise by doing the odd-numbered questions. The evennumbered questions can be set as assignments – the answers are available on request to adopters of the book.

Answer to the 'best' schools problem

A high proportion of small schools appear in the list simply because they are lucky. Consider one school of 20 pupils, another with 1000, where the average ability is similar in both. The large school is highly unlikely to obtain a 100% pass rate, simply because there are so many pupils and (at least) one of them will probably perform badly. With 20 pupils, you have a much better chance of getting them all through. This is just a reflection of the fact that there tends to be greater variability in smaller samples. The schools themselves, and the pupils, are of similar quality.

Descriptive statistics

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Chapter 1 • Descriptive statistics

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	By the end of this chapter you should be able to:	
outcomes	recognise different types of data and use appropriate methods to summaris	se and anal-
	yse them	

- use graphical techniques to provide a visual summary of one or more data series
- use numerical techniques (such as an average) to summarise data series
- recognise the strengths and limitations of such methods
- recognise the usefulness of data transformations to gain additional insight into a set of data
- be able to write a brief report summarising the data.

Introduction

The aim of descriptive statistical methods is simple: to present information in a clear, concise and accurate manner. The difficulty in analysing many phenomena, be they economic, social or otherwise, is that there is simply too much information for the mind to assimilate. The task of descriptive methods is therefore to summarise all this information and draw out the main features, without distorting the picture.

Consider, for example, the problem of presenting information about the wealth of British citizens (which follows later in this chapter). There are about 18 million adults for whom data are available and to present the data in raw form (i.e. the wealth holdings of each and every person) would be neither useful nor informative (it would take about 30000 pages of a book, for example). It would be more useful to have much less information, but information which is still representative of the original data. In doing this, much of the original information would be deliberately lost; in fact, descriptive statistics might be described as the art of constructively throwing away much of the data.

There are many ways of summarising data and there are few hard-and-fast rules about how you should proceed. Newspapers and magazines often provide innovative (though not always successful) ways of presenting data. There are, however, a number of techniques which are tried and tested and these are the subject of this chapter. They are successful because: (a) they tell us something useful about the underlying data; and (b) they are reasonably familiar to many people, so we can all talk in a common language. For example, the average tells us about the location of the data and is a familiar concept to most people. For example, young children soon learn to describe their day at school as 'average'.

The appropriate method of analysing the data will depend on a number of factors: the type of data under consideration, the sophistication of the audience and the 'message' which it is intended to convey. One would use different methods to persuade academics of the validity of one's theory about inflation than one would use to persuade consumers that Brand X powder washes whiter than Brand Y. To illustrate the use of the various methods, three different topics are covered in this chapter. First, we look at the relationship between educational attainment and employment prospects. Do higher qualifications improve your employment chances? The data come from people surveyed in 2009, so we have a sample of **cross-section data** giving an illustration of the situation at one point in time. We will look at the distribution of educational attainments amongst those surveyed, as well as the relationship to employment outcomes. In this example, we simply count the numbers of people in different categories (e.g. the number of people with a degree qualification who are employed).

Second, we examine the distribution of wealth in the United Kingdom in 2005. The data are again cross-section, but this time we can use more sophisticated methods since wealth is measured on a ratio scale. Someone with £200000 of wealth is twice as wealthy as someone with £100000, for example, and there is a meaning to this ratio. In the case of education, one cannot say with any precision that one person is twice as educated as another. The educational categories may be ordered (so one person can be more educated than another, although even that may be ambiguous) but we cannot measure the 'distance' between them. We therefore refer to educational attainment being measured on an ordinal scale. In contrast, there is not an obvious natural ordering to the three employment categories (employed, unemployed, inactive), so this is measured on a nominal scale.

Third, we look at national spending on investment over the period 1977–2009. This is **time-series data** since we have a number of observations on the variable measured at different points in time. Here it is important to take account of the

time dimension of the data: things would look different if the observations were in the order 1977, 1989, 1982, . . . rather than in correct time order. We also look at the relationship between two variables, investment and output, over that period of time and find appropriate methods of presenting it.

In all three cases, we make use of both graphical and numerical methods of summarising the data. Although there are some differences between the methods used in the three cases, these are not watertight compartments: the methods used in one case might also be suitable in another, perhaps with slight modification. Part of the skill of the statistician is to know which methods of analysis and presentation are best suited to each particular problem.

Summarising data using graphical techniques

Education and employment, or, after all this, will you get a job?

We begin by looking at a question which should be of interest to you: how does education affect your chances of getting a job? It is nowadays clear that education improves one's life chances in various ways, one of the possible benefits being that it reduces the chances of being out of work. But by how much does it reduce those chances? We shall use a variety of graphical techniques to explore the question.

The raw data for this investigation come from the *Education and Training Statistics for the UK 2009.* Some of these data are presented in Table 1.1 and show the numbers of people by employment status (either in work, unemployed or inactive, i.e. not seeking work) and by educational qualification (higher education, A levels, other qualification or no qualification). The table gives a **cross-tabulation** of employment status by educational qualification and is simply a count (the **frequency**) of the number of people falling into each of the 12 cells of the table. For example, there were 9713 000 people in work who had experience of higher education. This is part of a total of nearly 38 million people of working age. Note that the numbers in the table are in thousands, for the sake of clarity.

From the table, we can see some messages from the data; for example, being unemployed or inactive seems to be more prevalent amongst those with lower qualifications: 56% (= (382 + 2112)/4458) of those with no qualifications are unemployed or inactive compared to only about 15% of those with higher education.

However, it is difficult to go through the table by eye and pick out these messages. It is easier to draw some graphs of the data and use them to form conclusions.

The bar chart

The first graphical technique we shall use is the **bar chart**. This is shown in Figure 1.1. The bar chart summarises the educational qualifications of those in work, i.e. the data in the first row of Table 1.1. The four educational categories are arranged along the horizontal (x) axis, while the frequencies are measured

	Higher education	A levels	Other qualification	No qualification	Total
In work	9713	5479	10173	1965	27 3 30
Unemployed	394	432	1166	382	2 3 7 4
Inactive	1 256	1440	3 2 7 7	2112	8085
Total	11 363	7 3 5 1	14616	4 4 5 9	37789

Table 1.1 Economic status and educational qualifications, 2009 (numbers in 000s)

Source: Adapted from Department for Children, Schools and Families, Education and Training Statistics for the UK 2009, http://dera.ioe.ac.uk/15353/, contains public sector information licensed under the Open Government Licence (OGL) v3.0. http://www.nationalarchives.gov.uk/doc/open-government-licence/open-government

on the vertical (*y*) axis. The height of each bar represents the numbers in work for that category.

The biggest groups are those with higher education and those with 'other qualifications' which are of approximately equal size. The graph also shows that there are relatively few people working who have no qualifications. It is important to realise what the graph does *not* show: it does not say anything about your likelihood of being in work, given your educational qualifications. For that, we would need to compare the *proportions* of each education category in work; for the moment, we are only looking at the absolute numbers.

It would be interesting to compare the distribution in Figure 1.1 with those for the unemployed and inactive categories. This is done in Figure 1.2, which adds bars for these other two categories.

This **multiple bar chart** shows that, as for the 'in work' category, amongst the inactive and unemployed, the largest group consists of those with 'other' qualifications (which are typically vocational qualifications). These findings simply reflect the fact that 'other qualifications' is the largest category. We can also now begin to see whether more education increases your chance of having a job. For example, compare the height of the 'in work' bar to the 'inactive' bar. It is relatively much higher for those with higher education than for those with



education

Figure 1.1 Educational qualifications

of people in work in the United Kingdom, 2009

Note: The height of each bar is determined by the associated frequency. The first bar is 9713 units high, the second is 5479 units high and so on. The ordering of the bars could be reversed ('no qualifications' becoming the first category) without altering the message.

qualifications

qualifications