Lab Worksheet VI

Statistical inference I

This lab worksheet walks you through the very basic concepts of statistical inference (no need for Stata today, pencil and paper will do). For the purposes of this exercise, it will be very helpful if you already know a bit about the following concepts:

- Population.
- Sample.
- · Sample statistic.
- Sampling distribution.
- · Central Limit Theorem.
- · Normal distribution.

The main learning goals is to understand what inferential statistic is, but we will also look at how we can collect random samples from larger populations as well as how we go about constructing sampling distributions using repeated random samples. *Figure 1* below shows the basic "statistical procedure." As you can see, it has three main components: a **population** or target group of interest, a **sample** or sub-group of the target group, and **probability**, which allows us to say things about the population based on a sample. After collecting a sample, we produce some summaries (i.e., we describe and explore the data). However, this does not really speak of the population but of the observed data in a sample. These observed data might differ from the population, so we rely on probability and inference to draw conclusions. Below *Figure 1* there are some questions for you to answer.

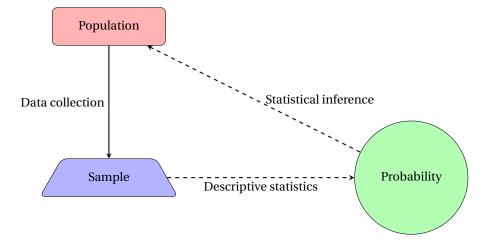


Figure 1: Doing statistics.

? Might the following samples (simple random sampling) be representative? Target population: Lawyers in Greater London area. Sampling and sample: All lawyers working in the Greater London area are assigned an X-digit identification number. 500 lawyers are selected at random by using a random-number generator. How this sample could have been non-representative: This samples would not be representative if only lawyers with a British passport had been selected (presumably there are lawyers with non-British passports working in the Greater London area). Target population: University students studying in Scotland. Sampling and sample: Using Scottish universities' student records, a random sample of 1,000 students was pooled. This sample was designed to comprise students older than eighteen and younger or equal than twenty-four. All nationalities, ethnic groups, and sexes were included. Is this sample representative? Why/why not? How could it be representative? Target population: University students studying in Scotland. Sampling and sample: 50 interviewers were hired in order to interview university students from all Scottish universities. Interviewers were sent to the field only on odd working calendar-days. Data collection was ended after obtaining 1,000 completed questionnaires. Is this sample representative? Why/why not? How could it be representative?	? Provide some examples of populations and samples in the box below.
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Target population: University students studying in Scotland. Sampling and sample: Researchers gather a comprehensive list of university students in Scotland. Students are grouped into "male" and "female" categories. Conveniently, 60 percent of university students in Scotland are female. Therefore, the researchers select at random 600 female students and 400 male students. Is this sample representative? Why/why not? How could it be representative?
Next we are going to construct a sample using simple random sampling. For this, we will use real data from the European Social Survey 2012, but this time we will only focus on respondents from Scotland. On the last page of this worksheet you will find a table with 100 self-reported happiness levels. Happiness was measured from 0 to 10 (being 10 the happiest one can be). Our task is to construct a sample of 15 individuals, so:
? What is the value of <i>N</i> ? And the value of <i>n</i> ?
? How would you chose a random sample of 15 individuals from <i>Table 1</i> ?
One "manual" way to construct a random sample involves using a table of random numbers. The numbers in the table below were placed in a random order by a computer, so technically is not purely random (but it is good enough for our exercise). We need to use this table of random numbers to chose 15 individuals from <i>Table 1</i> that reports happiness levels in Scotland. First we must devise a "path" or "method", for example: "two to the right, one down, one left, one up, two left, two up, and reports (it can be easier, of course). Now we place a finger randomly on the table and
simply follow our "path." The figure we end up on will be our first sampled individual. Finally we repeat this procedure as many times as necessary. ? Annotate below the 15 respondents' ID and their happiness levels.

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We could have calculated the average happiness level using all 100 respondents. However, this would take us more time (although it is easily doable) than sampling 15 individuals and calculating the average happiness. The formula below is how you calculate a mean (use the box below for your computation):

$$\overline{x} = \frac{1}{n} \left(\sum_{i=1}^{n} x_i \right)$$

With the arithmetic mean you can calculate now the standard deviation as follow:

$$s = \sqrt{\frac{\sum\limits_{i=1}^{n} (x_i - \overline{x})^2}{n-1}}$$

In turn, with the standard deviation we can calculate the standard error:

$$s_{\overline{x}} = \frac{s}{\sqrt{n}}$$

Finally we can use the arithmetic mean to create the sampling distribution (of the mean). If we were to repeat the process above 10 times (i.e., if we constructed 10 samples of 15 individuals each) and graph their means (10 means) we would get a graph that might not look "normally distributed." However, if we repeated this 1,000 times the graph will look "more normal" (and the more samples you draw, the "more normal" your distribution would look like). However, remember that we created a sample of 15 individuals; we probably need a bigger sample size (about 25) to obtain a "normal" distribution. There are online applications that recreate this process, but if you have time you can try it yourself "manually."

Table 1: Happiness in Scotland, 2012

	Table 1.		mess m scon		12
ID	Happiness	ID	Happiness	ID	Happiness
01	8	41	7	81	8
02	9	42	8	82	7
03	6	43	9	83	8
04	7	44	10	84	9
05	5	45	8	85	6
06	10	46	5	86	7
07	9	47	9	87	6
80	8	48	6	88	7
09	8	49	8	89	10
10	1	50	9	90	10
11	7	51	7	91	9
12	4	52	8	92	7
13	8	53	10	93	7
14	7	54	9	94	10
15	8	55	8	95	9
16	10	56	8	96	8
17	8	57	9	97	8
18	8	58	9	98	5
19	9	59	8	99	8
20	8	60	7	100	8
21	9	61	9		
22	9	62	10		
23	8	63	7		
24	8	64	8		
25	8	65	9		
26	8	66	10		
27	9	67	9		
28	10	68	10		
29	8	69	9		
30	9	70	8		
31	7	71	6		
32	9	72	10		
33	8	73	10		
34	9	74	8		
35	4	75	10		
36	8	76	10		
37	7	77	8		
38	9	78	8		
39	6	79	9		
40	7	80	5		