

# Sampling Distributions (EPIB 607)

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# Parameters, Samples, and Statistics

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  - ▶  $\mu$ : population mean                       $\pi$ : population proportion

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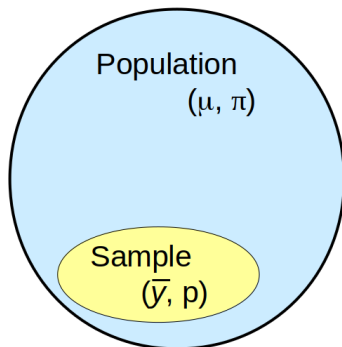
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## Means:

- Mean depth in  $n$  randomly selected ocean locations
- Mean household size in  $n$  randomly selected households.
- Median number of persons under-5 in a sample of  $n$  households



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- When conducting a study, it is always better to seek statistical advice sooner rather than later. Get a statistician involved at the *planning* stage of the study... by the analysis stage, it may be too late!

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## Do not cheat by

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  - ▶ average rent

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- Taking 5 people from the *same* household to estimate
  - ▶ proportion of Québécois who don't have a family doctor
  - ▶ who saw a medical doctor last year
  - ▶ average rent
- Sampling the depth of the ocean *only around Montreal* to estimate
  - ▶ proportion of Earth's surface covered by water

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- Prior to obtaining data, there is uncertainty as to which of all possible samples will occur
- Because of this, estimates such as  $\bar{y}$  (the sample mean) will vary from one sample to another

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- The behavior of such estimates in many samples of equal size is described by what are called **sampling distributions**
- B&M definition: The sampling distribution of a statistic is the distribution of values taken by the statistic in all possible samples of the same size from the same population.



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- Thus, they are used in confidence intervals for parameters. Specific sampling distributions (based on a null value for the parameter) are also used in statistical tests of hypotheses.

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- **CAVEAT:** This is a luxury using a toy example. In actual studies, we only get one shot!