
Confidence intervals:

The basics

BPS chapter 14

Objectives (BPS chapter 14)

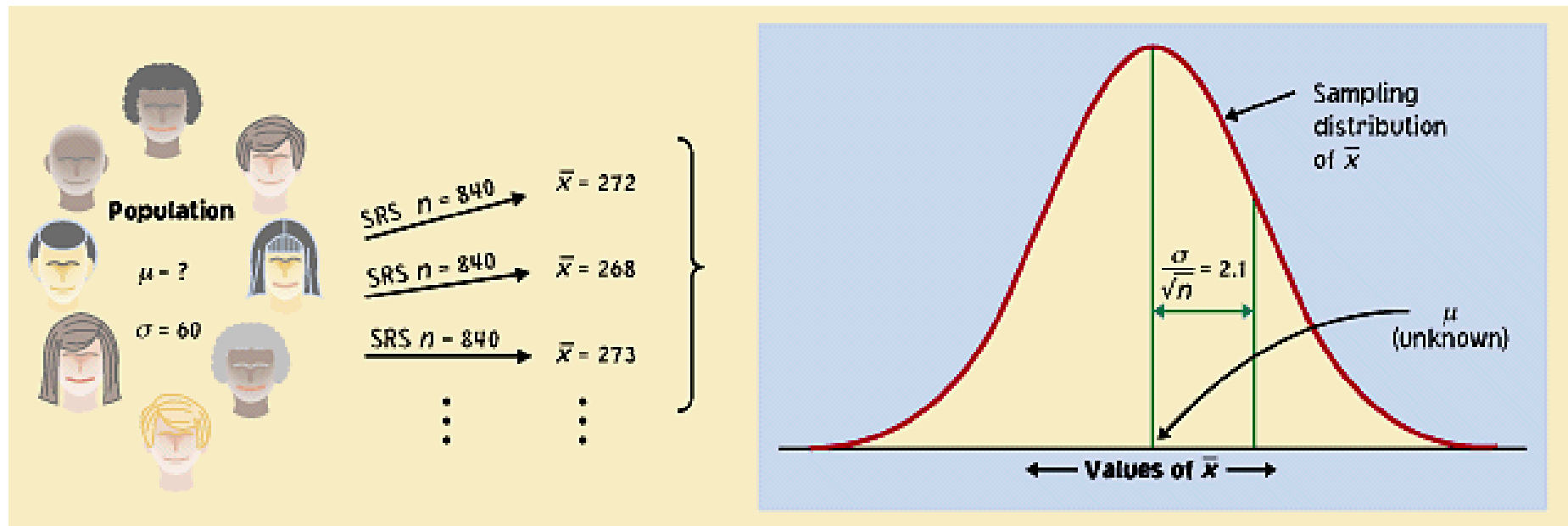
Confidence intervals: the basics

- Estimating with confidence
- Confidence intervals for the mean μ
- How confidence intervals behave
- Choosing the sample size

Estimating with confidence

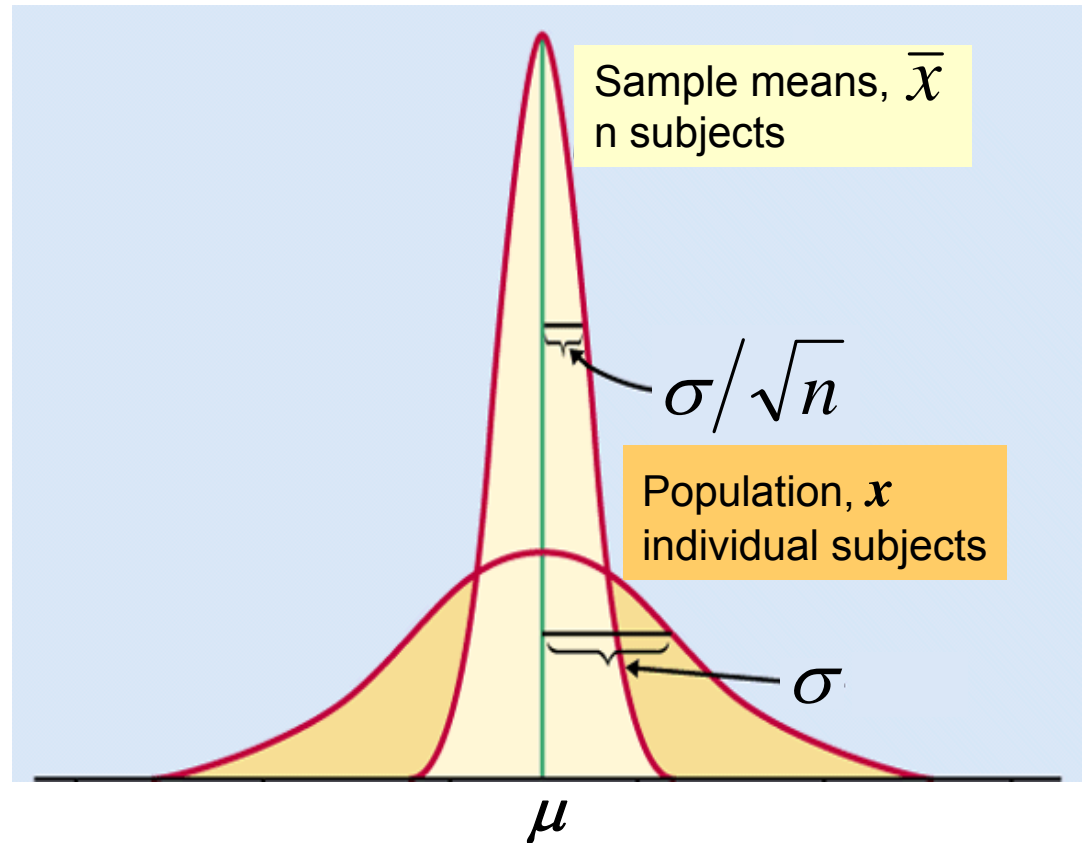
Although the sample mean, \bar{x} , is a unique number for any particular sample, if you pick a different sample, you will probably get a different sample mean.

In fact, you could get many different values for the sample mean, and virtually none of them would actually equal the true population mean, μ .



But the sample distribution is narrower than the population distribution, by a factor of \sqrt{n} .

Thus, the estimates \bar{x} gained from our samples are always relatively close to the population parameter μ .

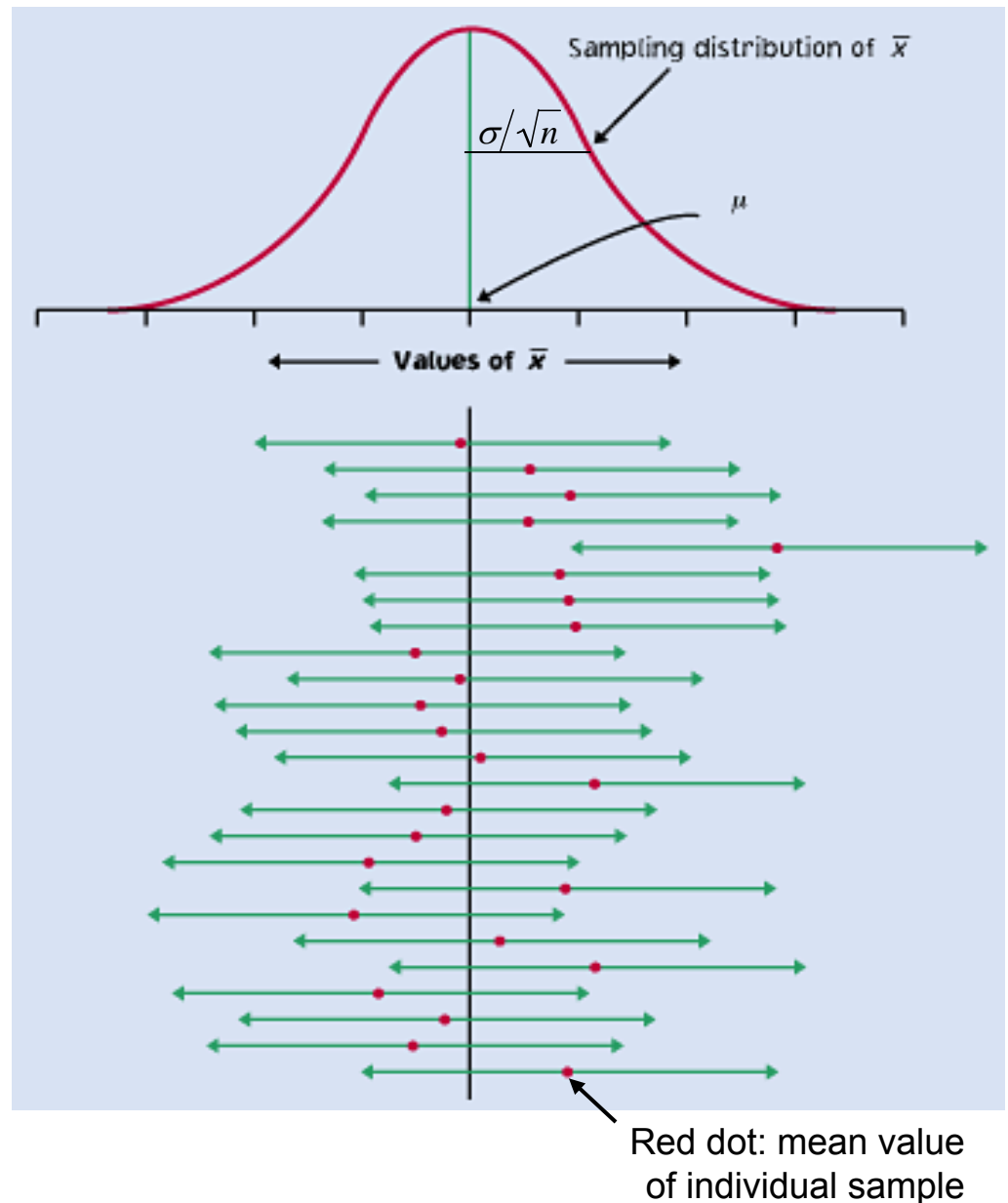


If the population is normally distributed $N(\mu, \sigma)$, so will the sampling distribution $N(\mu, \sigma/\sqrt{n})$.

95% of all sample means will be within roughly 2 standard deviations ($2 \cdot \sigma/\sqrt{n}$) of the population parameter μ .

Because distances are symmetrical, this implies that **the population parameter μ must be within roughly 2 standard deviations from the sample average \bar{x} , in 95% of all samples.**

This reasoning is the essence of statistical inference.



Red dot: mean value of individual sample

The weight of single eggs of the brown variety is normally distributed $N(65g, 5g)$. Think of a carton of 12 brown eggs as an SRS of size 12.



- What is the distribution of the sample means \bar{x} ?

Normal (mean μ , standard deviation σ/\sqrt{n}) = $N(65g, 1.44g)$.

- Find the middle 95% of the sample means distribution.

Roughly ± 2 standard deviations from the mean, or $65g \pm 2.88g$.

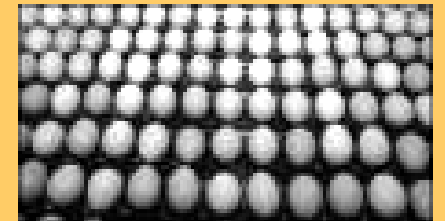


You buy a carton of 12 white eggs instead. The box weighs 770g. The average egg weight from that SRS is thus $\bar{x} = 64.2g$.



- Knowing that the standard deviation of egg weight is 5g, what can you infer about the mean μ of the white egg population?

There is a 95% chance that the population mean μ is roughly within $\pm 2\sigma/\sqrt{n}$ of \bar{x} , or $64.2g \pm 2.88g$.



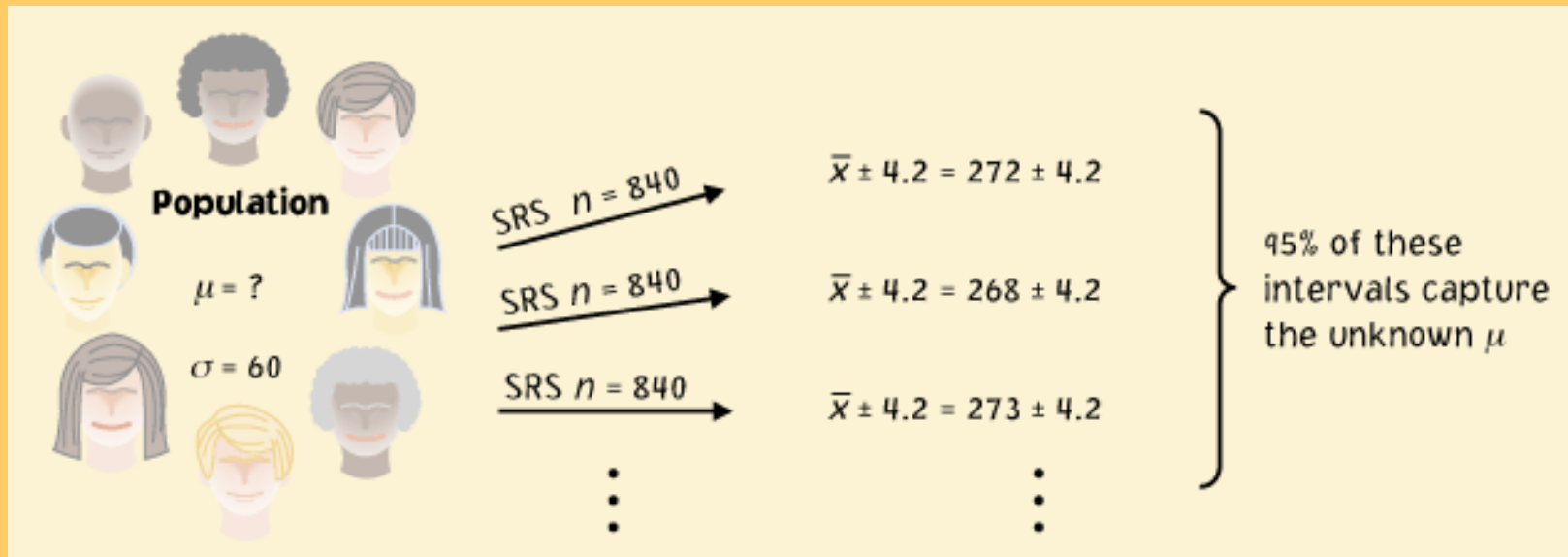
Confidence interval

A level C confidence interval for a parameter has two parts:

- An interval calculated from the data, usually of the form

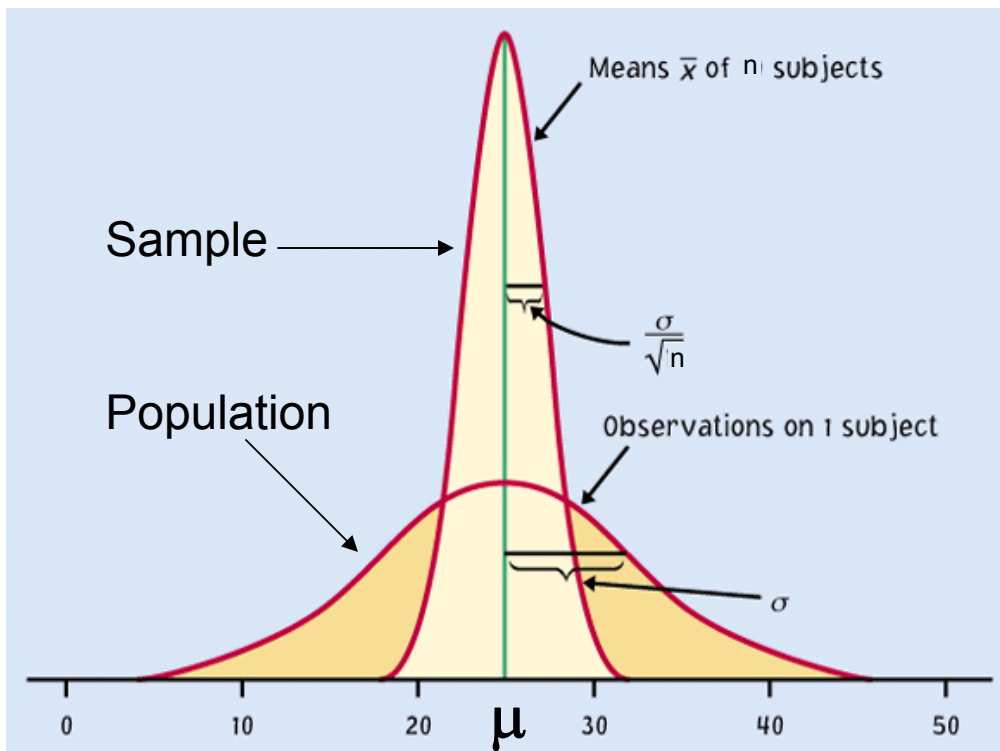
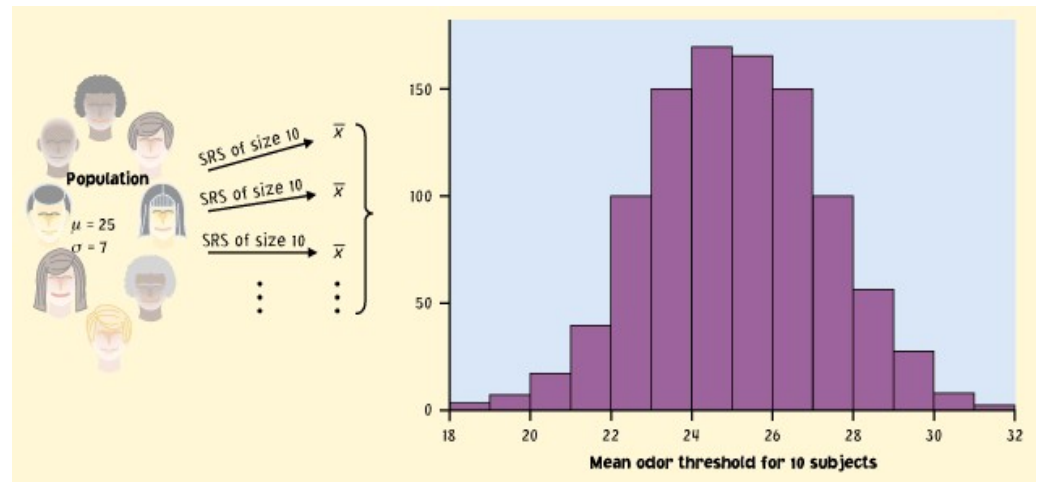
estimate \pm margin of error

- A **confidence level C** , which gives the probability that the interval will capture the true parameter value in repeated samples, or the success rate for the method.



Implications

We don't need to take lots of random samples to “rebuild” the sampling distribution and find μ at its center.

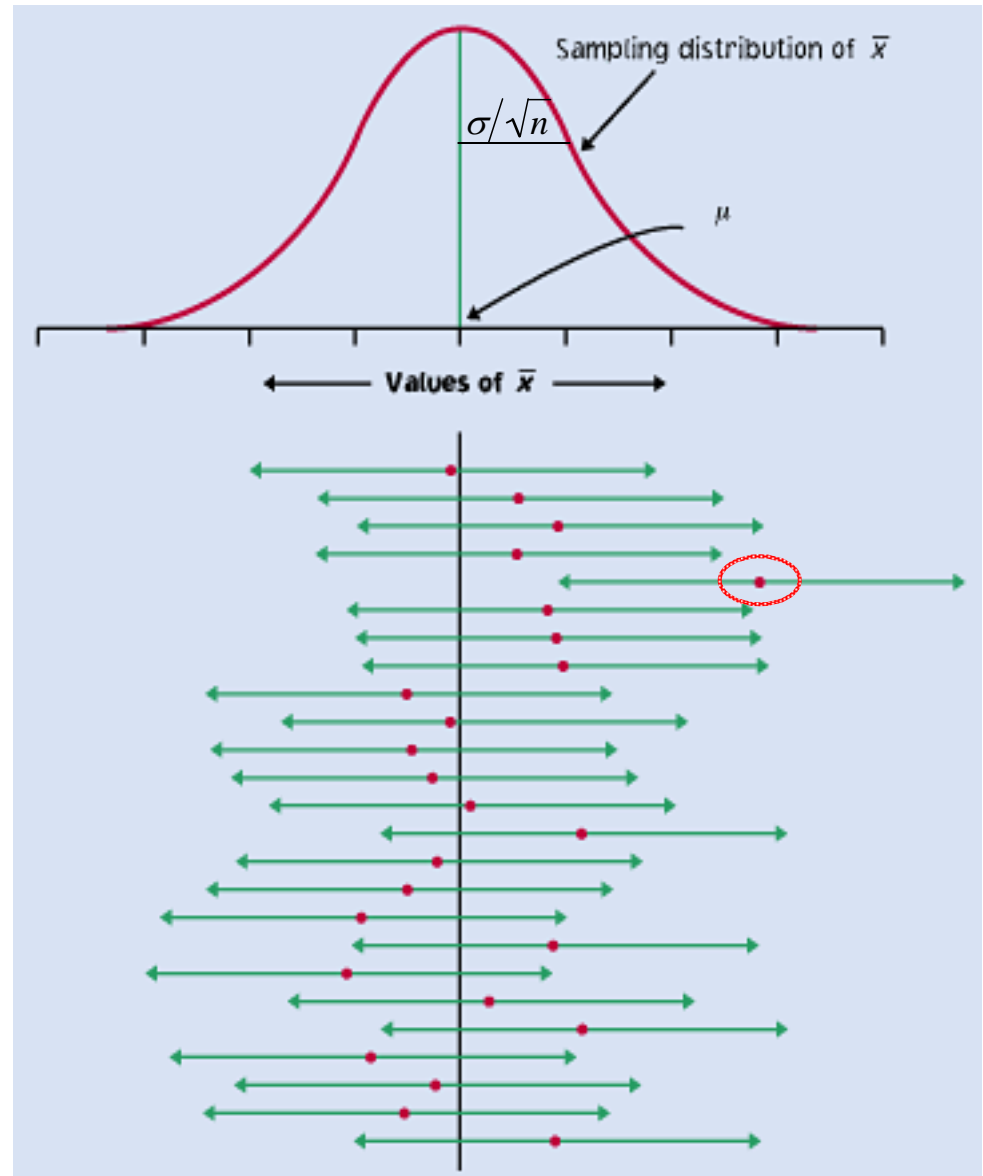


All we need is one SRS of size n , and relying on the properties of the sample means distribution to infer the population mean μ .

Reworded

With 95% confidence, we can say that μ should be within roughly 2 standard deviations ($2 \cdot \sigma/\sqrt{n}$) from our sample mean \bar{x} bar.

- In 95% of all possible samples of this size n , μ will indeed fall in our confidence interval.
- In only 5% of samples would \bar{x} be farther from μ .



Interpreting a confidence interval for a mean

A **confidence interval** can be expressed as:

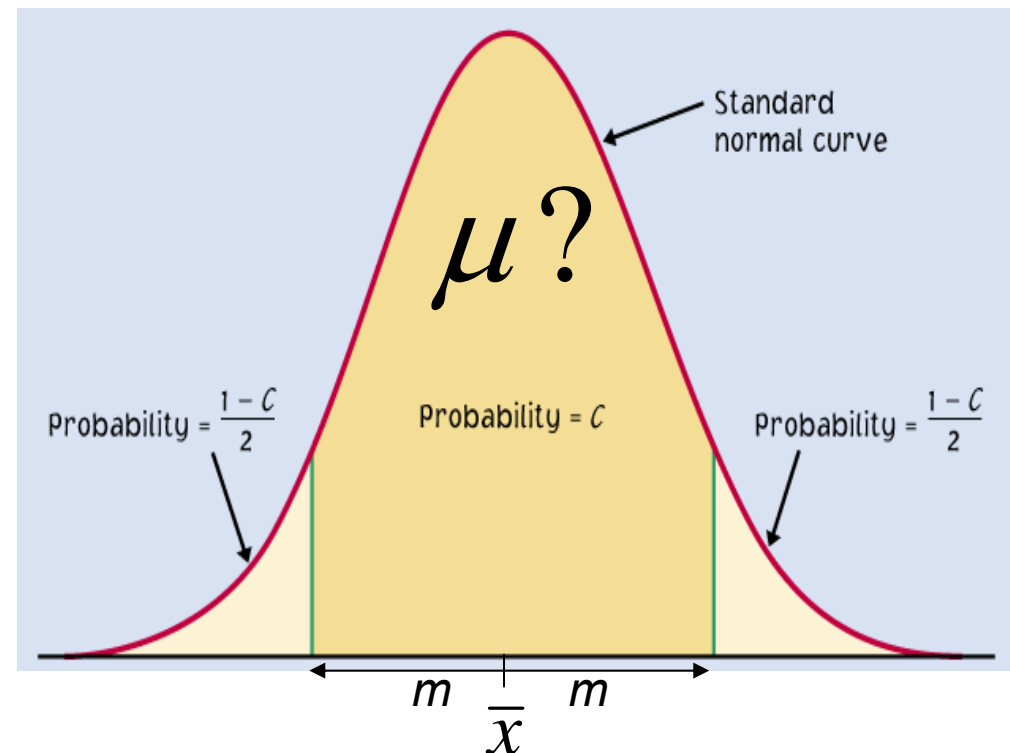
- $\bar{x} \pm m$
 m is called the **margin of error**

- Two endpoints of an interval:
 μ possibly within $(\bar{x} - m)$ to $(\bar{x} + m)$

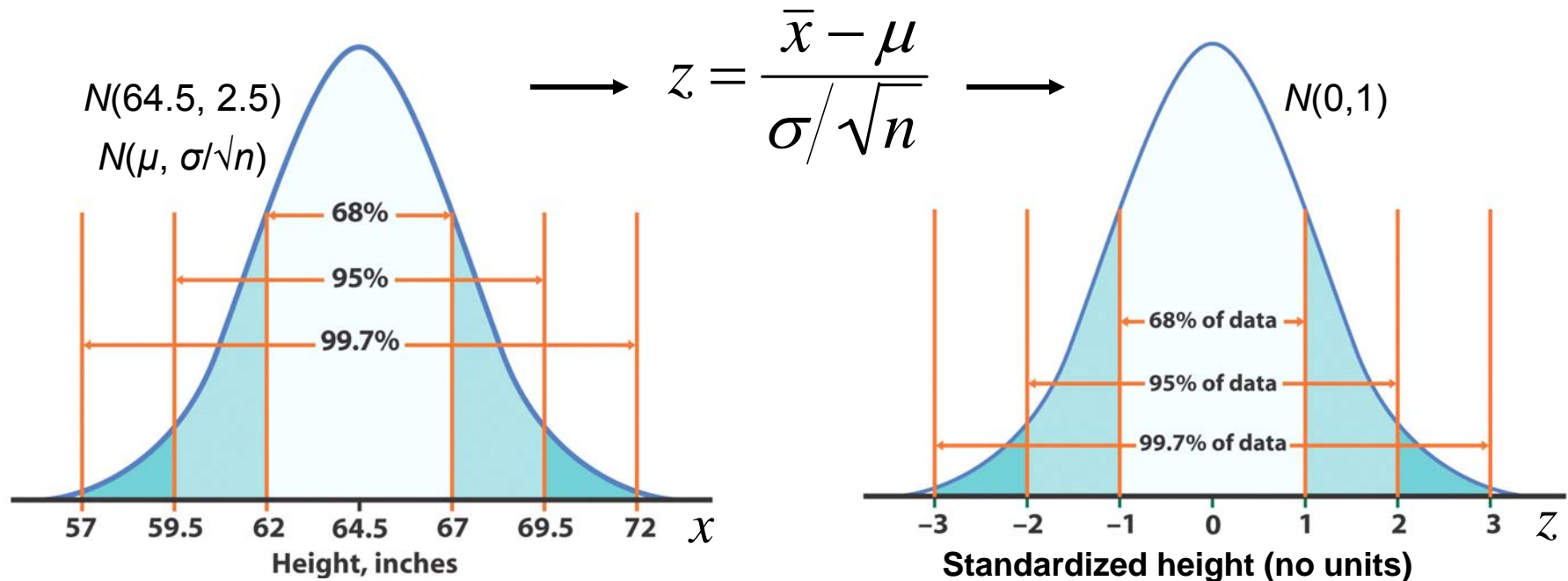
Example: 114 to 126

A **confidence level C** (in %) indicates the success rate of the method that produces the interval.

It represents the area under the normal curve within $\pm m$ of the center of the curve.



Review: standardizing the normal curve using z



Here, we work with the sampling distribution,
and σ/\sqrt{n} is its standard deviation (spread).

Remember that σ is the standard deviation of the original population.

Varying confidence levels

Confidence intervals contain the population mean μ in $C\%$ of samples.

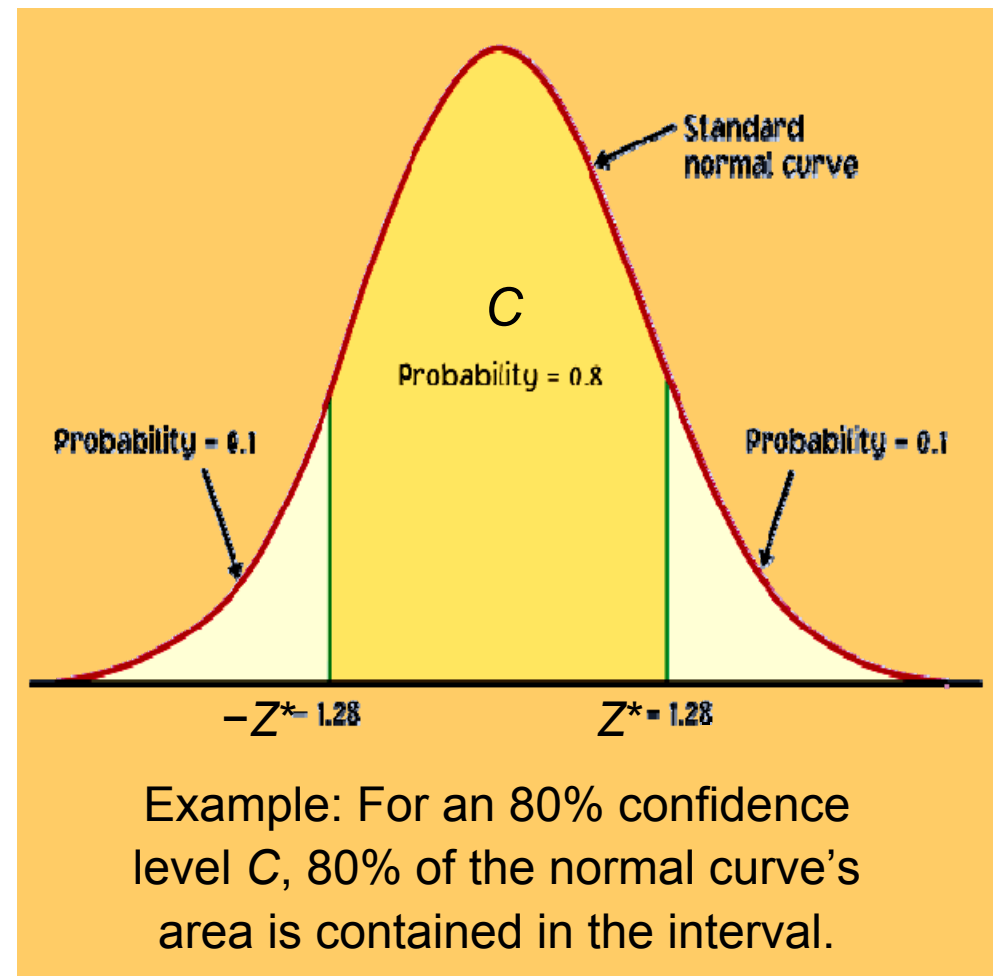
Different areas under the curve give different confidence levels C .

Practical use of z : z^*

- ▣ z^* is related to the chosen confidence level C .
- ▣ C is the area under the standard normal curve between $-z^*$ and z^* .

The confidence interval is thus:

$$\bar{x} \pm z^* \sigma / \sqrt{n}$$



How do we find specific z^* values?

We can use a table of z/t values (Table C). For a particular confidence level C , the appropriate z^* value is just above it.

z^*	0.674	0.841	1.036	1.282	1.645	1.960	2.054	2.326	2.576	2.807	3.091	3.291
	50%	60%	70%	80%	90%	95%	96%	98%	99%	99.5%	99.8%	99.9%
	Confidence level C											

Ex. For a 98% confidence level, $z^*=2.326$

We can use software. In **Excel**:

=NORMINV(probability,mean,standard_dev)
gives z for a given cumulative probability.

Since we want the middle C probability, the probability we require is $(1 - C)/2$

Example: For a 98% confidence level, = NORMINV (.01,0,1) = -2.32635 (= neg. z^*)

Link between confidence level and margin of error

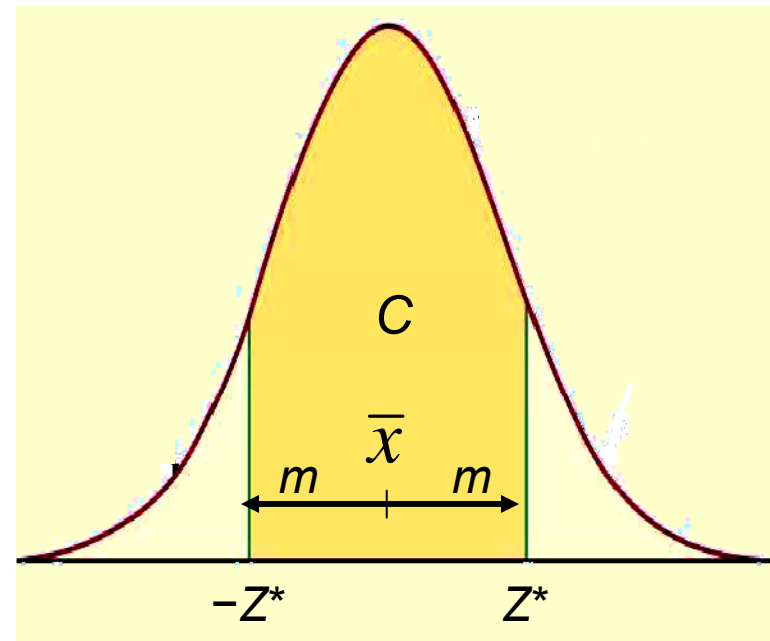
The confidence level C determines the value of z^* (in Table C).

The margin of error also depends on z^* .

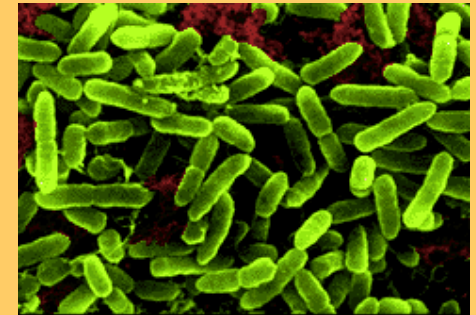
$$m = z^* \sigma / \sqrt{n}$$

Higher confidence C implies a larger margin of error m (thus less precision in our estimates).

A lower confidence level C produces a smaller margin of error m (thus better precision in our estimates).



Different confidence intervals for the same set of measurements



Density of bacteria in solution:

Measurement equipment has standard deviation $\sigma = 1 \cdot 10^6$ bacteria/ml fluid.

3 measurements: 24, 29, and $31 \cdot 10^6$ bacteria/ml fluid

Mean: $\bar{x} = 28 \cdot 10^6$ bacteria/ml. Find the 96% and 70% CI.

▣ 96% confidence interval for the true density, $z^* = 2.054$, and write

$$\begin{aligned} \bar{x} \pm z^* \frac{\sigma}{\sqrt{n}} &= 28 \pm 2.054(1/\sqrt{3}) \\ &= 28 \pm 1.19 \cdot 10^6 \\ &\text{bacteria/ml} \end{aligned}$$

▣ 70% confidence interval for the true density, $z^* = 1.036$, and write

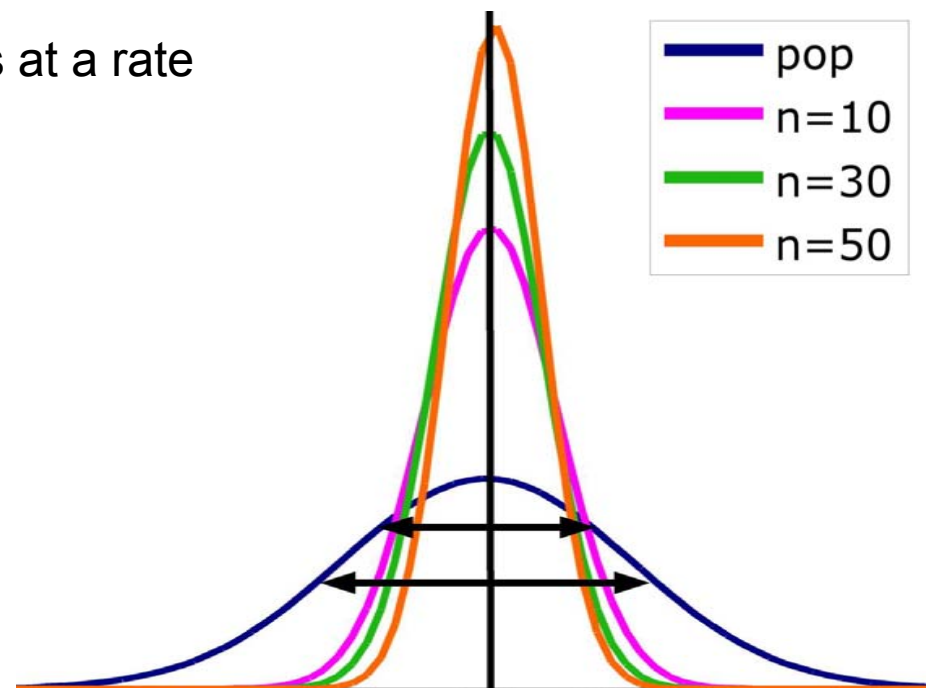
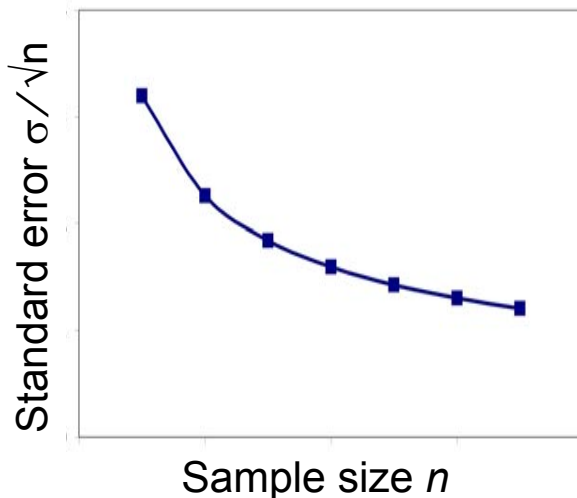
$$\begin{aligned} \bar{x} \pm z^* \frac{\sigma}{\sqrt{n}} &= 28 \pm 1.036(1/\sqrt{3}) \\ &= 28 \pm 0.60 \cdot 10^6 \\ &\text{bacteria/ml} \end{aligned}$$

z^*	0.674	0.841	1.036	1.282	1.645	1.960	2.054	2.326	2.576	2.807	3.091	3.291
	50%	60%	70%	80%	90%	95%	96%	98%	99%	99.5%	99.8%	99.9%
	Confidence level C											

Impact of sample size

The spread in the sampling distribution of the mean is a function of the number of individuals per sample.

- The larger the sample size, the smaller the standard deviation (spread) of the sample mean distribution.
- But the spread only decreases at a rate equal to \sqrt{n} .



Sample size and experimental design

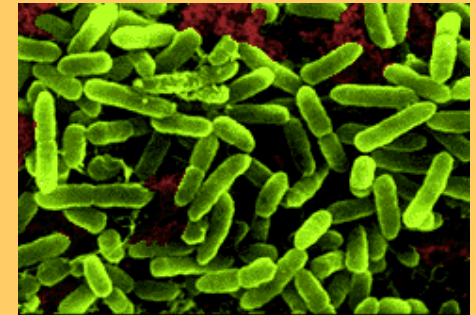
You may need a certain margin of error (e.g., drug trial, manufacturing specs). In many cases, the population variability (σ) is fixed, but we can choose the number of measurements (n).

So plan ahead what sample size to use to achieve that margin of error.

$$m = z^* \frac{\sigma}{\sqrt{n}} \quad \Leftrightarrow \quad n = \left(\frac{z^* \sigma}{m} \right)^2$$

Remember, though, that sample size is not always stretchable at will. There are typically costs and constraints associated with large samples. The best approach is to use the smallest sample size that can give you useful results.

What sample size for a given margin of error?



Density of bacteria in solution:

Measurement equipment has standard deviation

$\sigma = 1 \cdot 10^6$ bacteria/ml fluid.

How many measurements should you make to obtain a margin of error of at most $0.5 \cdot 10^6$ bacteria/ml with a confidence level of 90%?

For a 90% confidence interval, $z^* = 1.645$.

$$n = \left(\frac{z^* \sigma}{m} \right)^2 \Rightarrow n = \left(\frac{1.645 \cdot 1}{0.5} \right)^2 = 3.29^2 = 10.8241$$

Using only 10 measurements will not be enough to ensure that m is no more than $0.5 \cdot 10^6$. Therefore, we need at least 11 measurements.

z^*	0.674	0.841	1.036	1.282	1.645	1.960	2.054	2.326	2.576	2.807	3.091	3.291
	50%	60%	70%	80%	90%	95%	96%	98%	99%	99.5%	99.8%	99.9%
	Confidence level C											