



# Centralni limitni izrek in intervalna ocena

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# Normalna porazdelitev

- 1733 de Moivre (aproksimacija binomske porazdelitve za velike  $n$ )
- 1809 Gauss
- Pomembna zaradi ***centralnega limitnega izreka***, ki pravi, da je vsota velikega števila neodvisnih slučajnih spremenljivk (binomska porazdelitev, Poissonova porazdelitev, ...) porazdeljena normalno
- Primer: Telesna teža človeka je odvisna od številnih dejavnikov (genetski in okoljski, njihovi vplivi so aditivni. Telesna teža je zato porazdeljena normalno.



Abraham de Moivre  
(1667-1754)

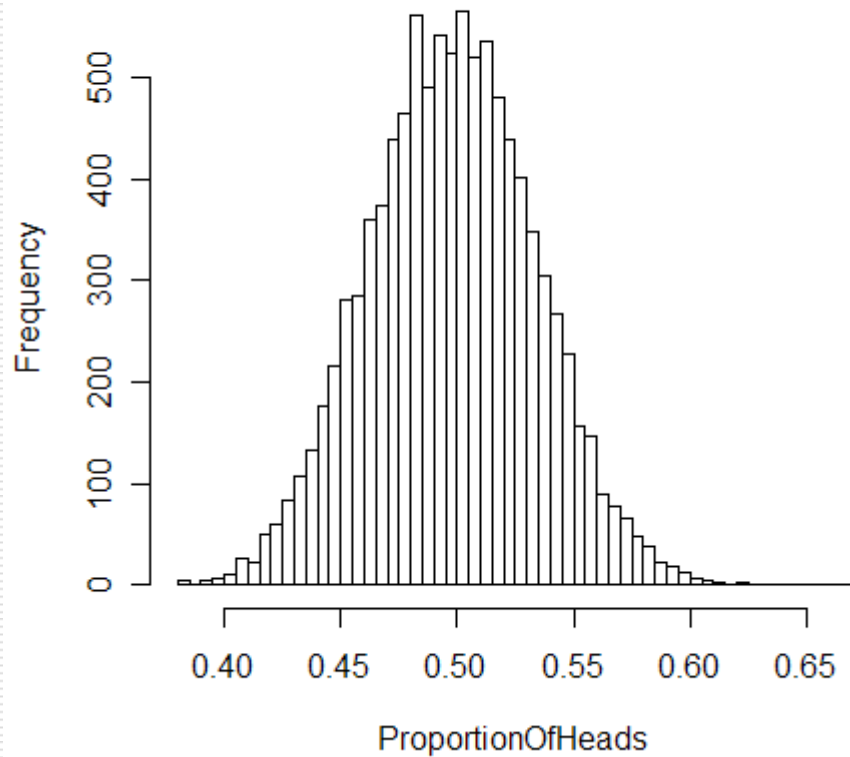


Karl F. Gauss  
(1777-1855)

# Binomska porazdelitev

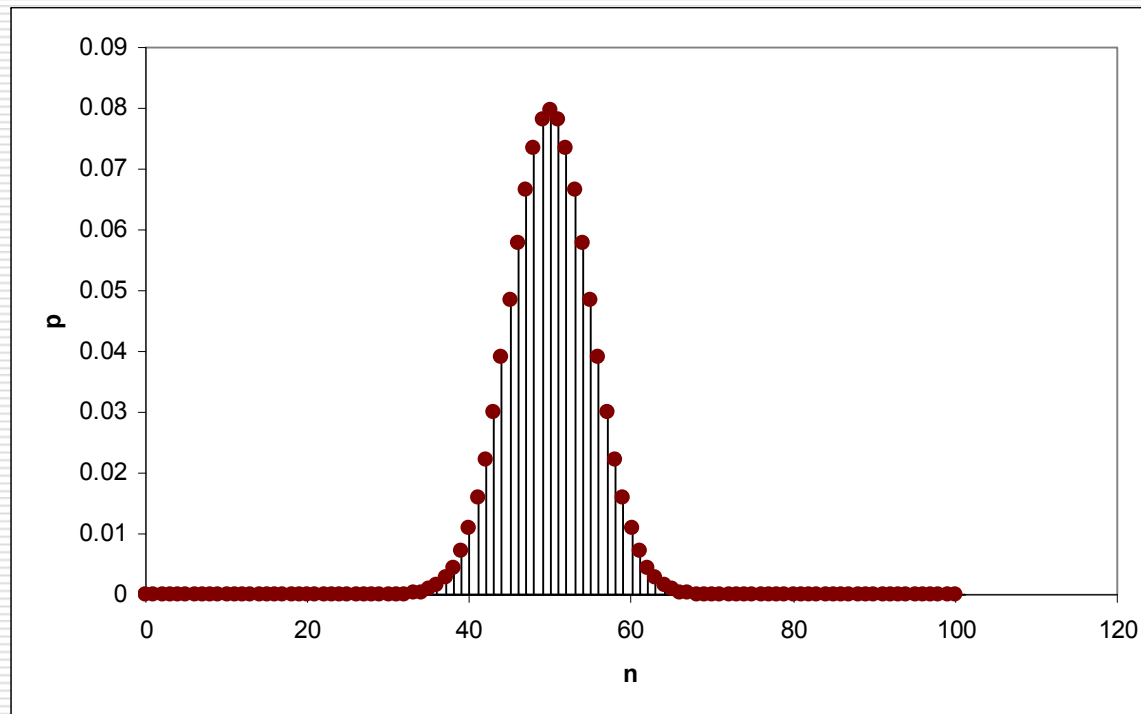
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Histogram of ProportionOfHeads



# Veliki vzorci

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$N=100$

$P=0.5$

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# Povprečna lega in razpršenost

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□  $E(x) = n p$

□  $D(x) = n p (1-p)$

□  $E(x) = p$

□  $D(x) = p (1-p)/n$

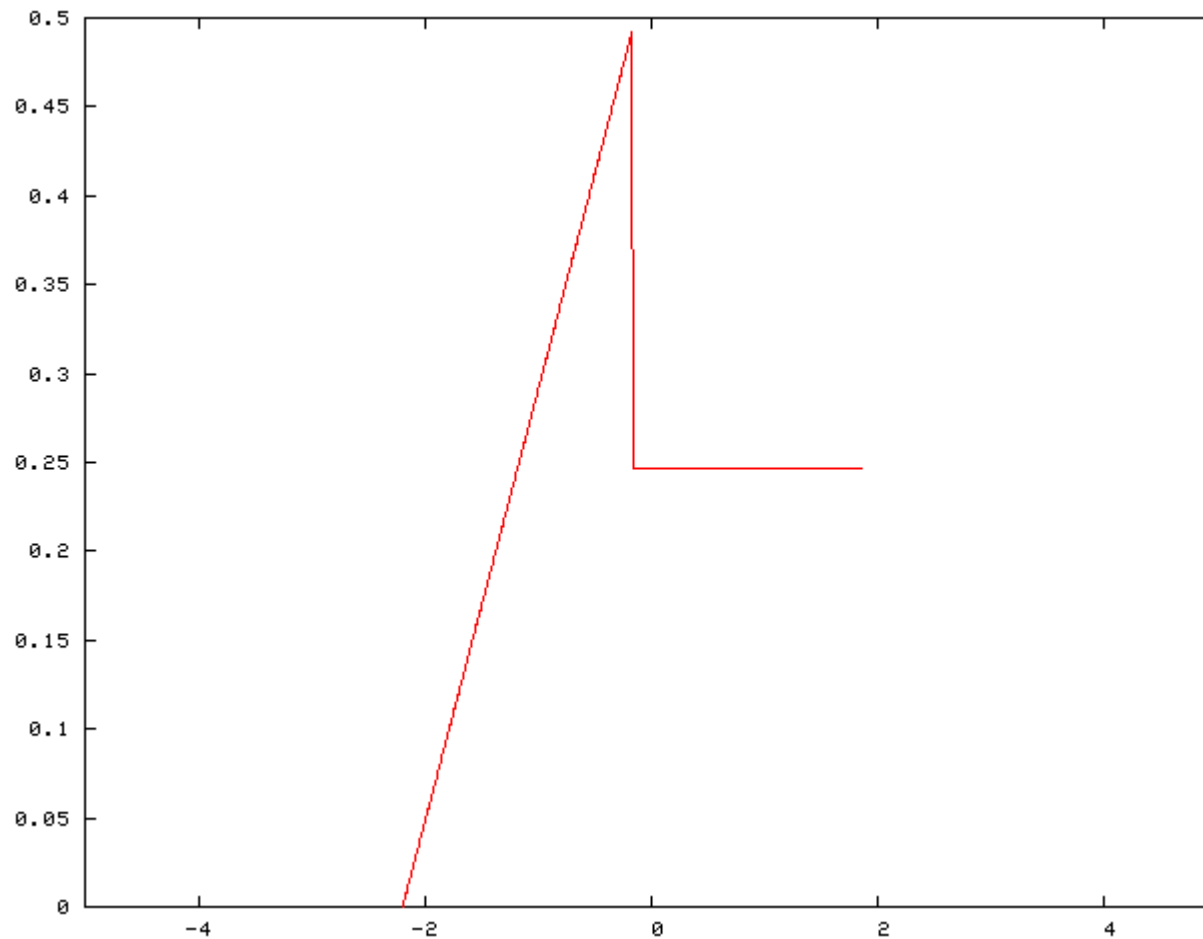
$$\sigma = \sqrt{np(1-p)}$$

$$\sigma = \sqrt{\frac{p(1-p)}{n}}$$

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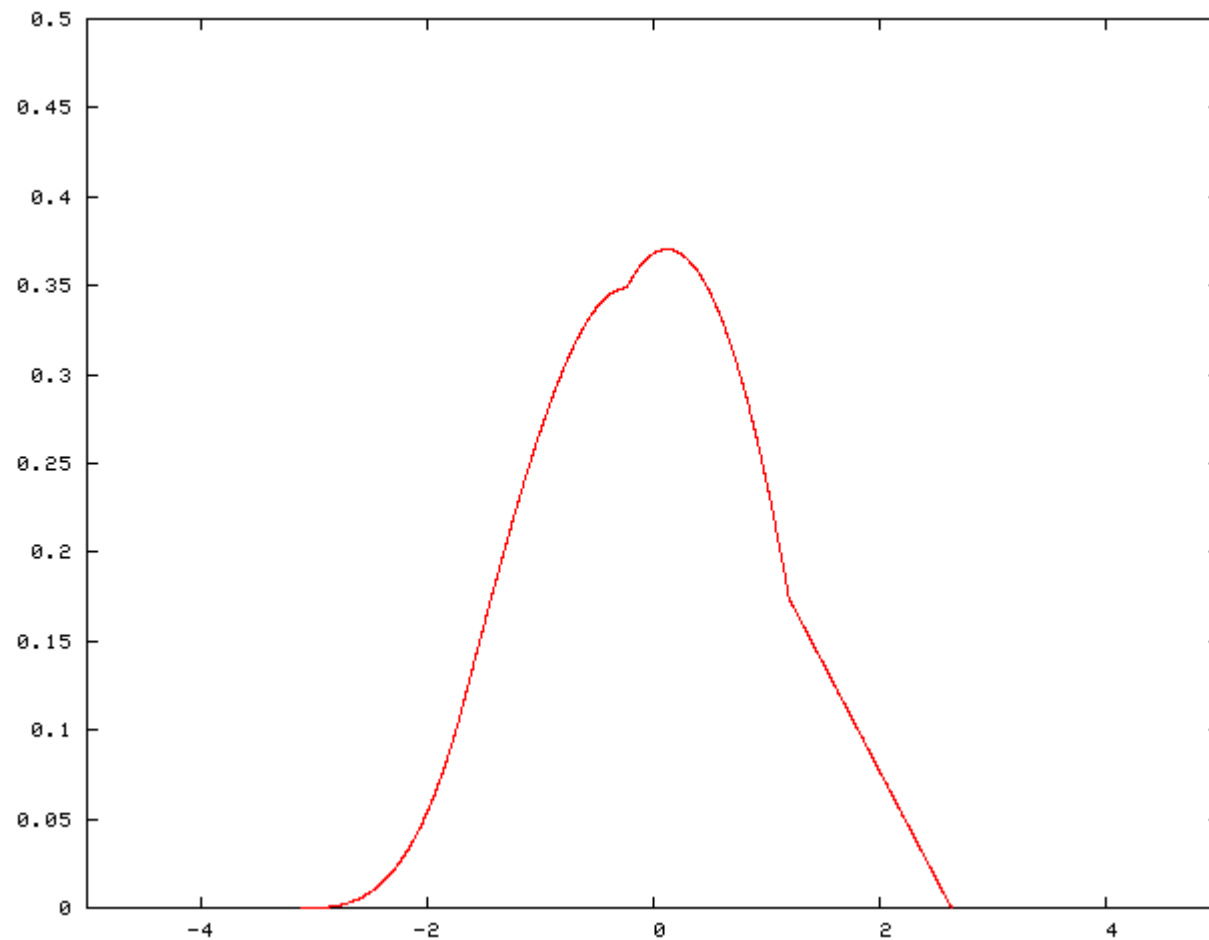
# Gostota verjetnosti X

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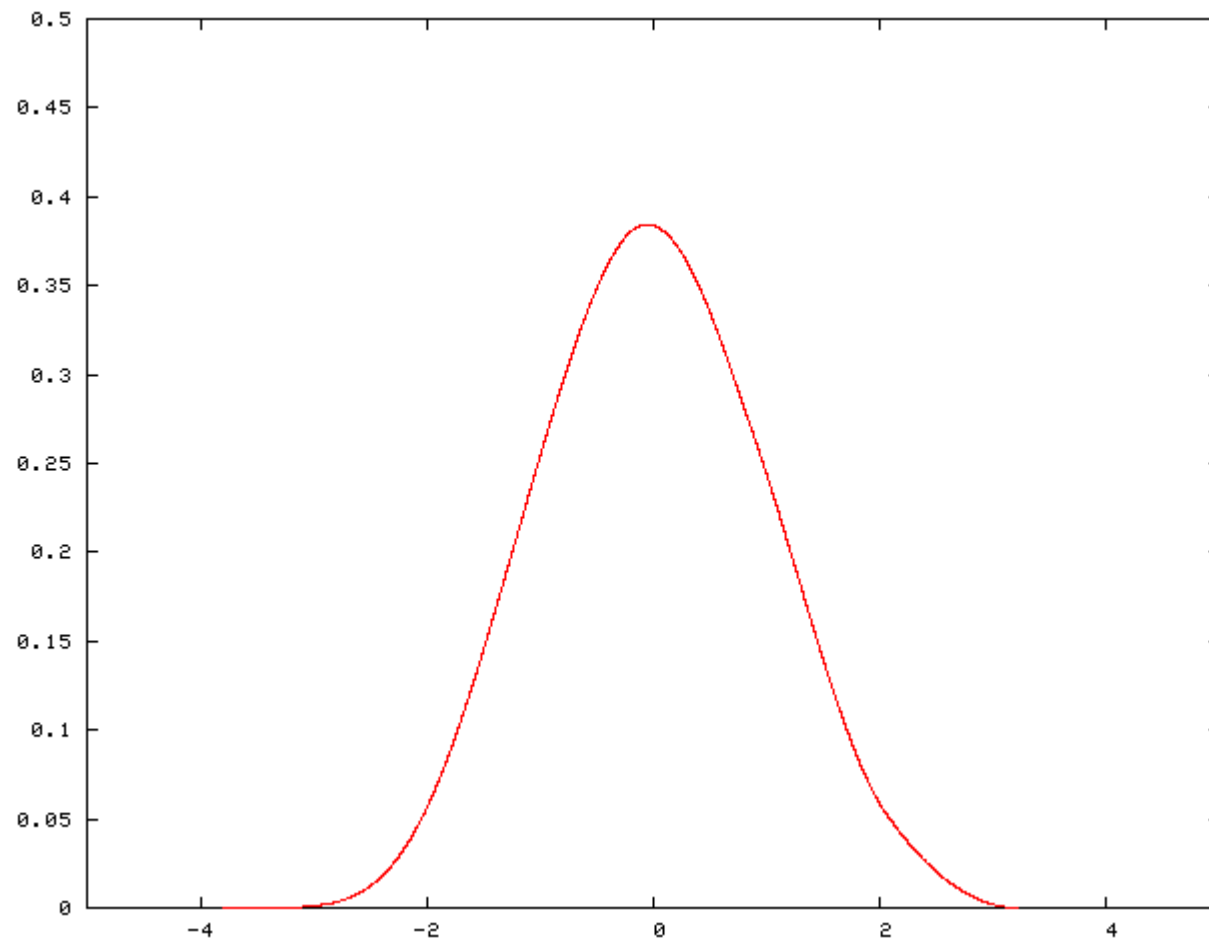
# Gostota verjetnosti $X_1 + X_2$

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# Gostota verjetnosti $X_1 + X_2 + X_3$

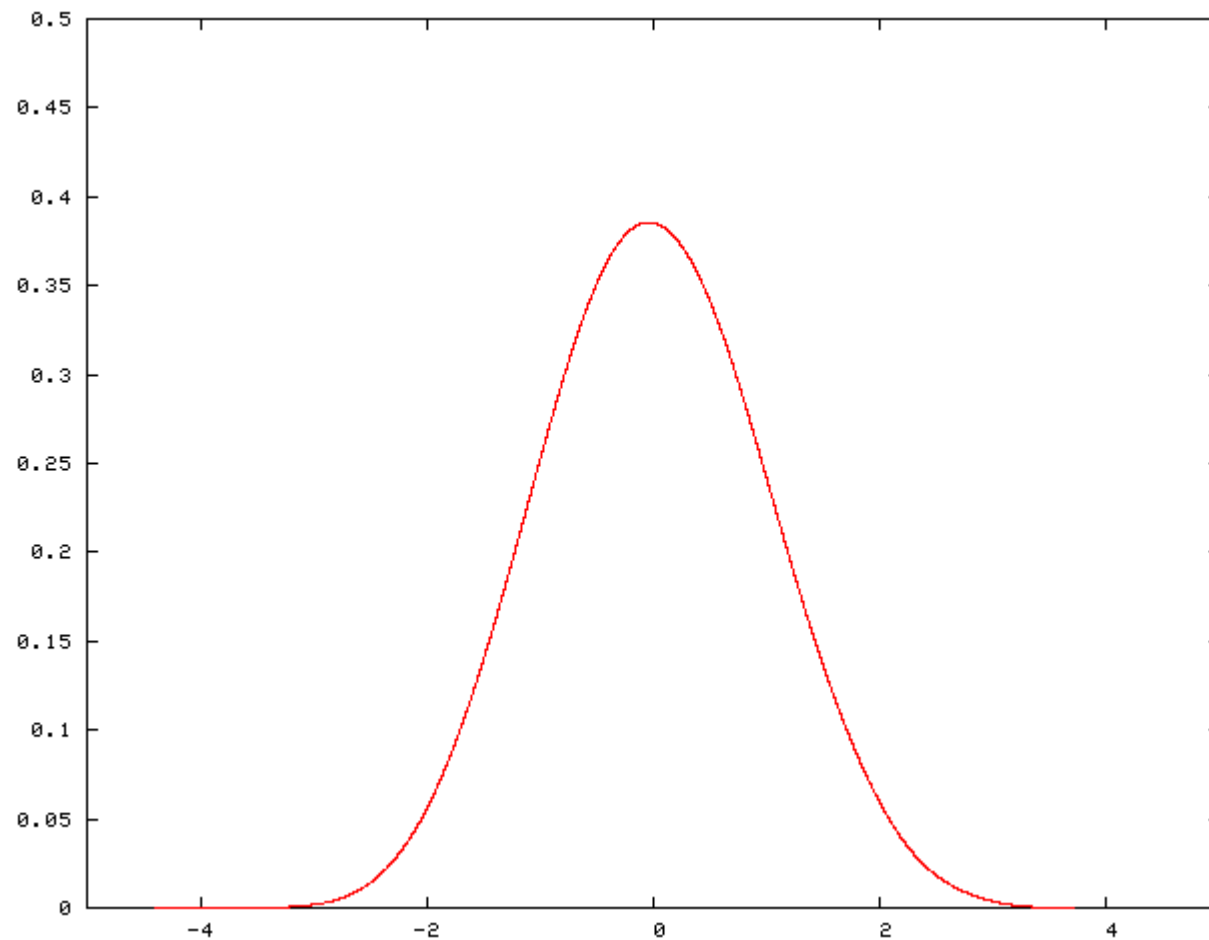
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# Gostota verjetnosti $X_1 + X_2 + X_3 + X_4$

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# Diskretna spremenljivka

$$X = \begin{cases} 1 & \text{with probability } 1/3, \\ 2 & \text{with probability } 1/3, \\ 3 & \text{with probability } 1/3. \end{cases}$$

Enakomerna porazdelitev

o	o	o
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1	2	3

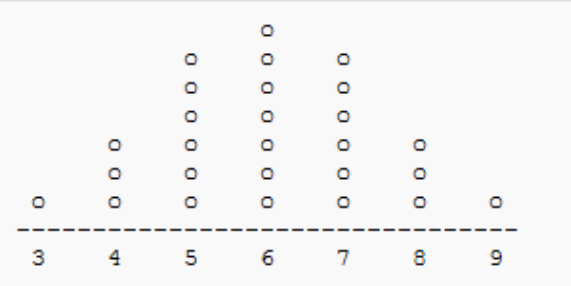
$$X_1 + X_2$$

$$\left. \begin{array}{l} 1 + 1 = 2 \\ 1 + 2 = 3 \\ 1 + 3 = 4 \\ 2 + 1 = 3 \\ 2 + 2 = 4 \\ 2 + 3 = 5 \\ 3 + 1 = 4 \\ 3 + 2 = 5 \\ 3 + 3 = 6 \end{array} \right\} = \begin{cases} 2 & \text{with probability } 1/9 \\ 3 & \text{with probability } 2/9 \\ 4 & \text{with probability } 3/9 \\ 5 & \text{with probability } 2/9 \\ 6 & \text{with probability } 1/9 \end{cases}$$

		o		
	o	o	o	
o	o	o	o	o
-----				
2	3	4	5	6

$$X_1 + X_2 + X_3$$

$$\left. \begin{array}{l}
 1+1+1 = 3 \\
 1+1+2 = 4 \\
 1+1+3 = 5 \\
 1+2+1 = 4 \\
 1+2+2 = 5 \\
 1+2+3 = 6 \\
 1+3+1 = 5 \\
 1+3+2 = 6 \\
 1+3+3 = 7 \\
 2+1+1 = 4 \\
 2+1+2 = 5 \\
 2+1+3 = 6 \\
 2+2+1 = 5 \\
 2+2+2 = 6 \\
 2+2+3 = 7 \\
 2+3+1 = 6 \\
 2+3+2 = 7 \\
 2+3+3 = 8 \\
 3+1+1 = 5 \\
 3+1+2 = 6 \\
 3+1+3 = 7 \\
 3+2+1 = 6 \\
 3+2+2 = 7 \\
 3+2+3 = 8 \\
 3+3+1 = 7 \\
 3+3+2 = 8 \\
 3+3+3 = 9
 \end{array} \right\} = \left\{ \begin{array}{l}
 3 \text{ with probability } 1/27 \\
 4 \text{ with probability } 3/27 \\
 5 \text{ with probability } 6/27 \\
 6 \text{ with probability } 7/27 \\
 7 \text{ with probability } 6/27 \\
 8 \text{ with probability } 3/27 \\
 9 \text{ with probability } 1/27
 \end{array} \right.$$



# Porazdelitev vzorčnih aritmetičnih sredin

## Vzorčna porazdelitev

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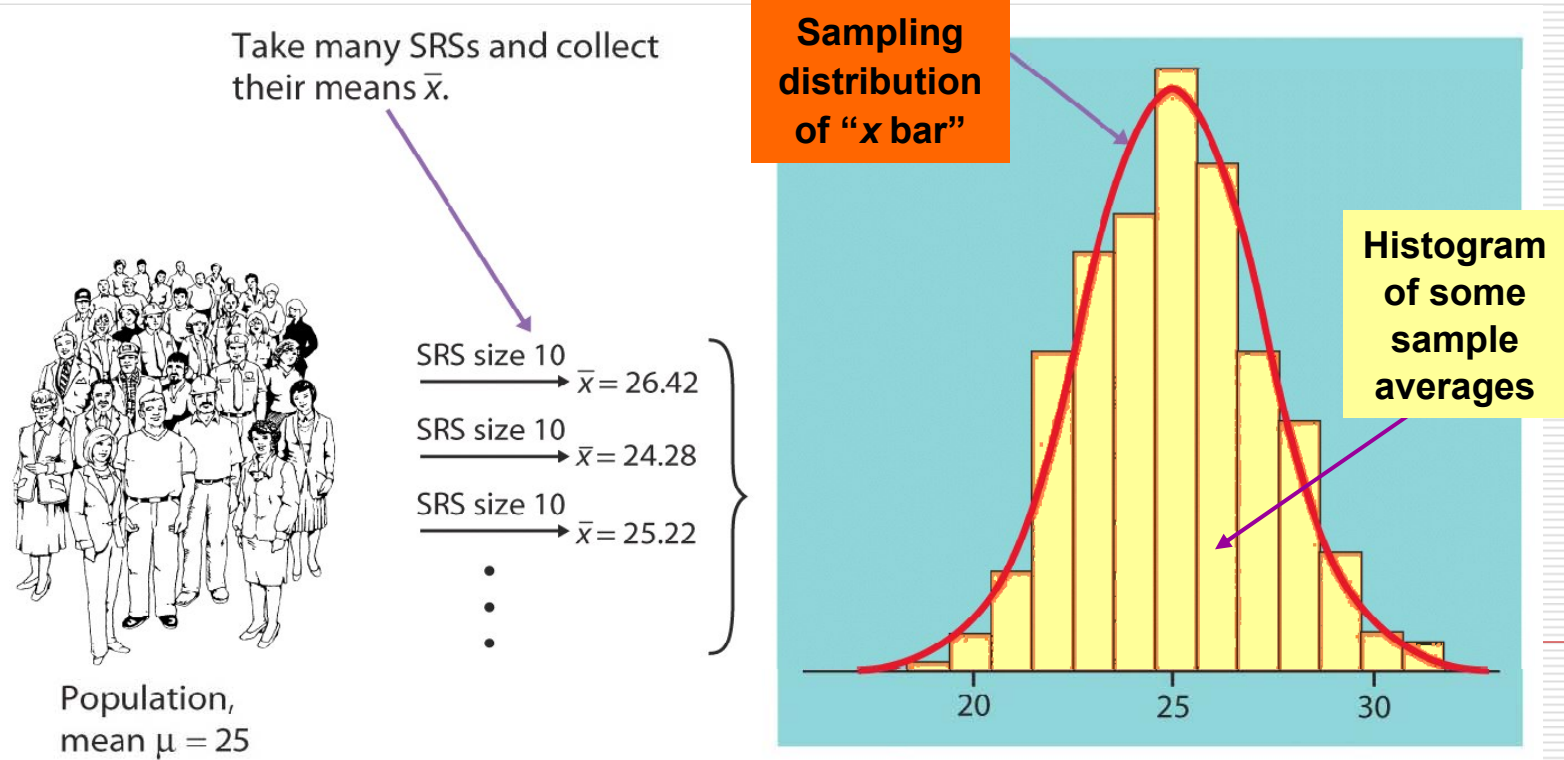
Vzorčna porazdelitev **statistike** je njena gostota verjetnosti za neskončno veliko vzorcev velikosti  $N$  iz populacije.

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# Porazdelitev vzorčnih aritmetičnih sredin

We take many random samples of a given size  $n$  from a population with mean  $\mu$  and standard deviation  $\sigma$ .

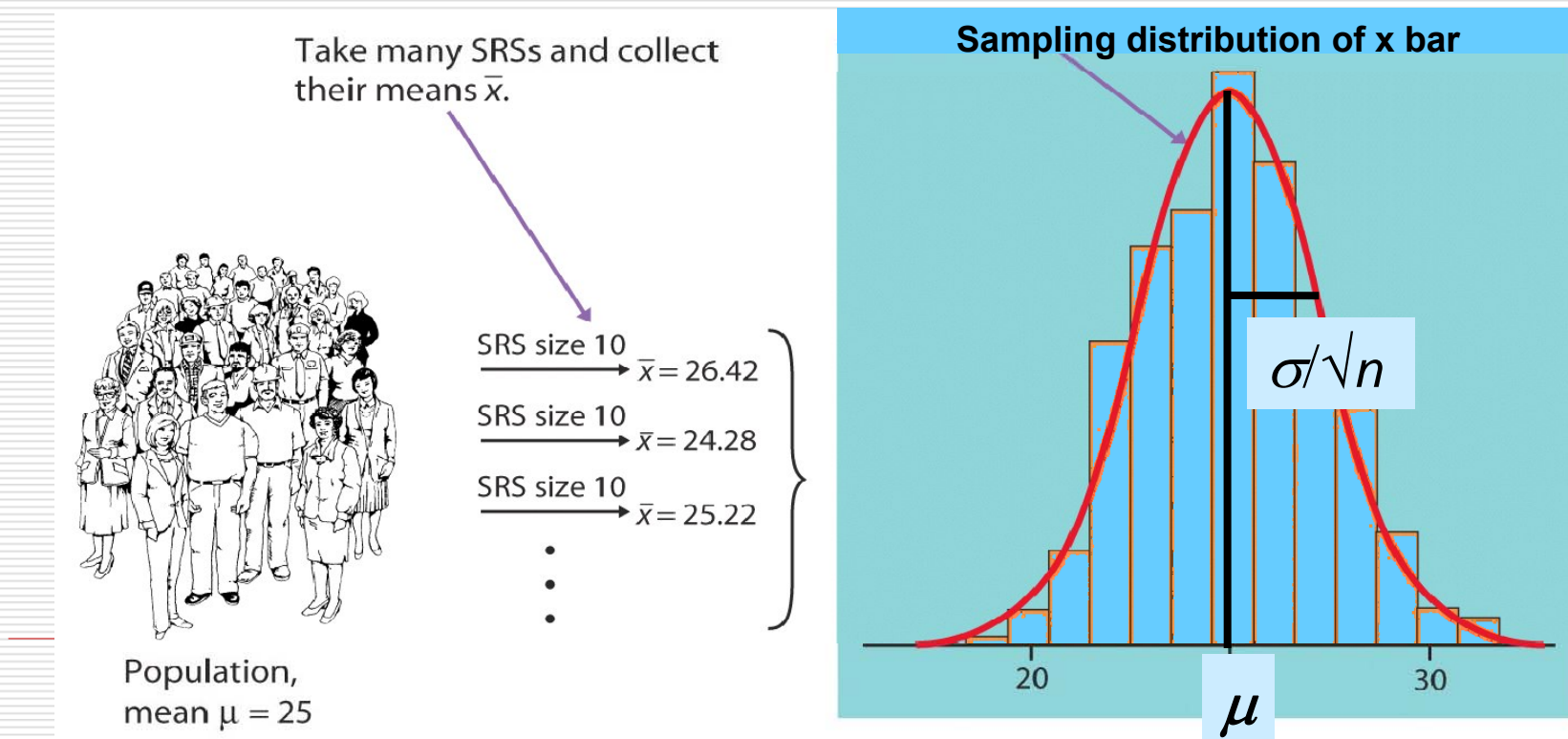
Some sample means will be above the population mean  $\mu$  and some will be below, making up the sampling distribution.



# Za vsako populacijo z aritmetično sredino $\mu$ in standardnim odklonom $\sigma$ velja

□ **Aritmetična sredina** ali centralna lega vzorčne porazdelitve, je enaka aritmetični sredini populacije  $\mu$ :  $\mu_x = \mu$ .

□ **Standardni odklon** vzorčne porazdelitve pa je  $\sigma/\sqrt{n}$ , kjer je  $n$  velikost vzorca in  $\sigma$  standardni odklon v populaciji:  $\sigma_x = \sigma/\sqrt{n}$ .



□ Aritmetična sredina vzorčne porazdelitve:

Je nepristranska ocena za **aritmetično sredino populacije**  $\mu$ .

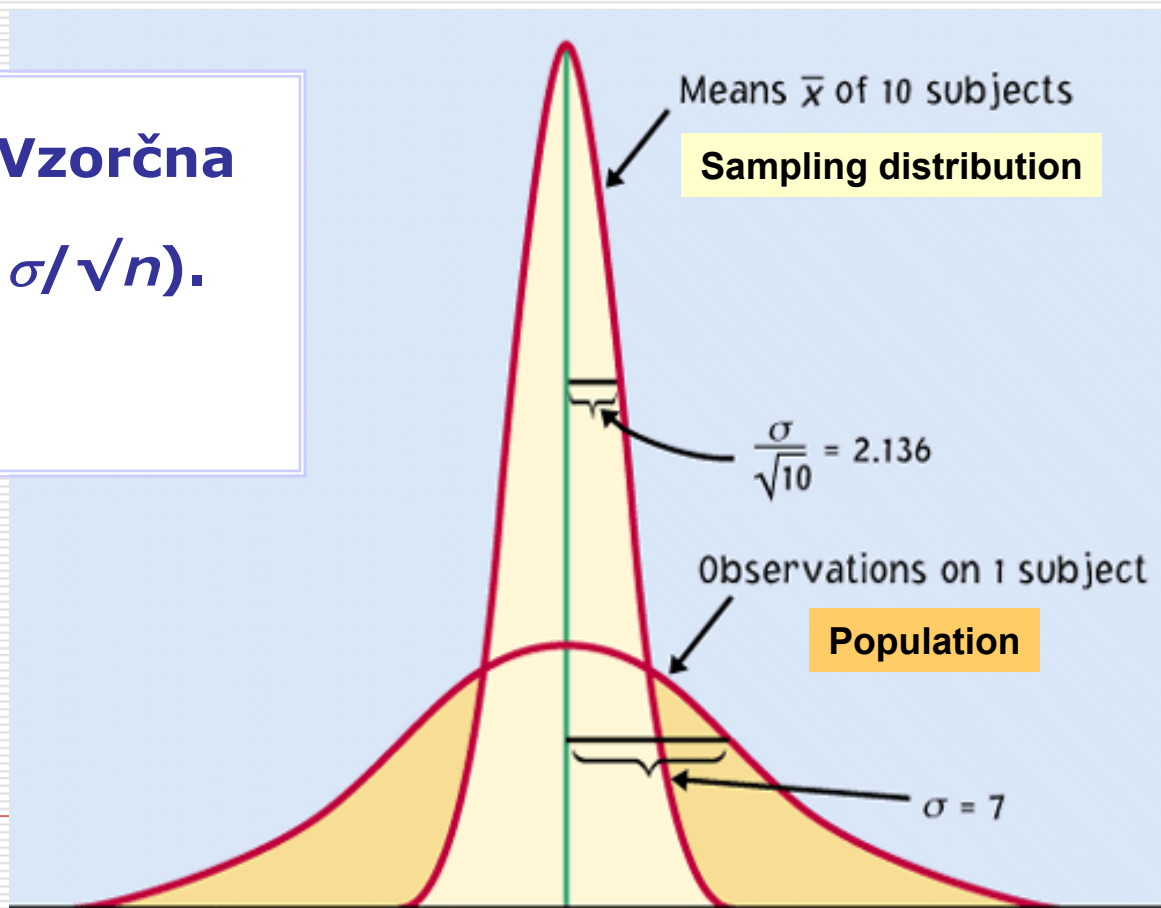
□ Standardni odklon vzorčne porazdelitve:

Standardna napaka  $\sigma / \sqrt{n}$ . → **Variabilnost povprečij je manjša od variabilnosti posameznih opazovanj.**

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# Normalno porazdeljena spremenljivka

Populacija  $N(\mu, \sigma)$  Vzorčna porazdelitev  $N(\mu, \sigma/\sqrt{n})$ .





# EXAMPLE

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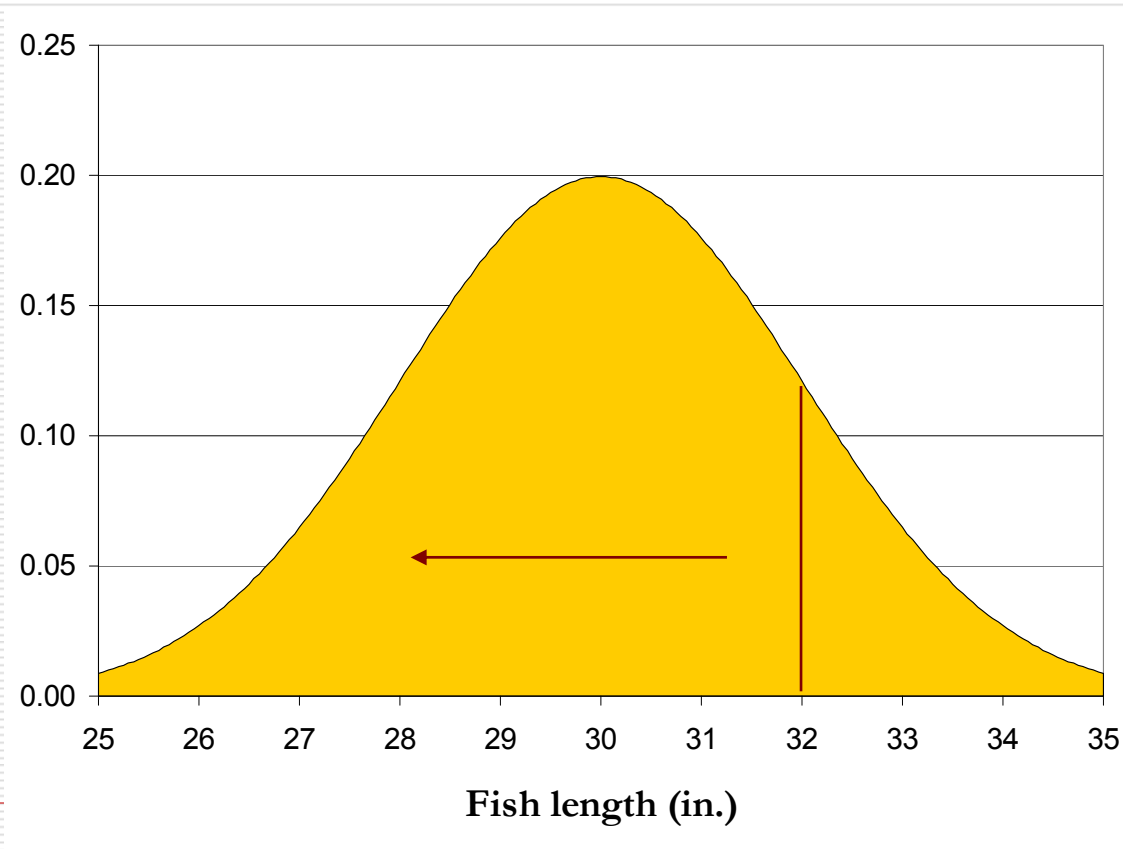
A certain brand of tires has a mean life of 25,000 miles with a standard deviation of 1600 miles.

What is the probability that the mean life of 64 tires is less than 24,600 miles?

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# Normalna porazdelitev

- Kakšna je verjetnost, da bo ujeta postrv krajša od 32 cm?



# Example continued

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The sampling distribution of the means has a mean of 25,000 miles (the population mean)

$$\mu = 25000 \text{ mi.}$$

and a standard deviation (i.e., standard error) of:

$$1600/8 = 200$$

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## Example continued

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Convert 24,600 mi. to a z-score and use the normal table to determine the required probability.

$$z = (24600 - 25000) / 200 = -2$$

$$P(z < -2) = 0.0228$$

or 2.28% of the sample means will be less than 24,600 mi.

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# ESTIMATION OF POPULATION VALUES

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- Point Estimates
  - Interval Estimates
-

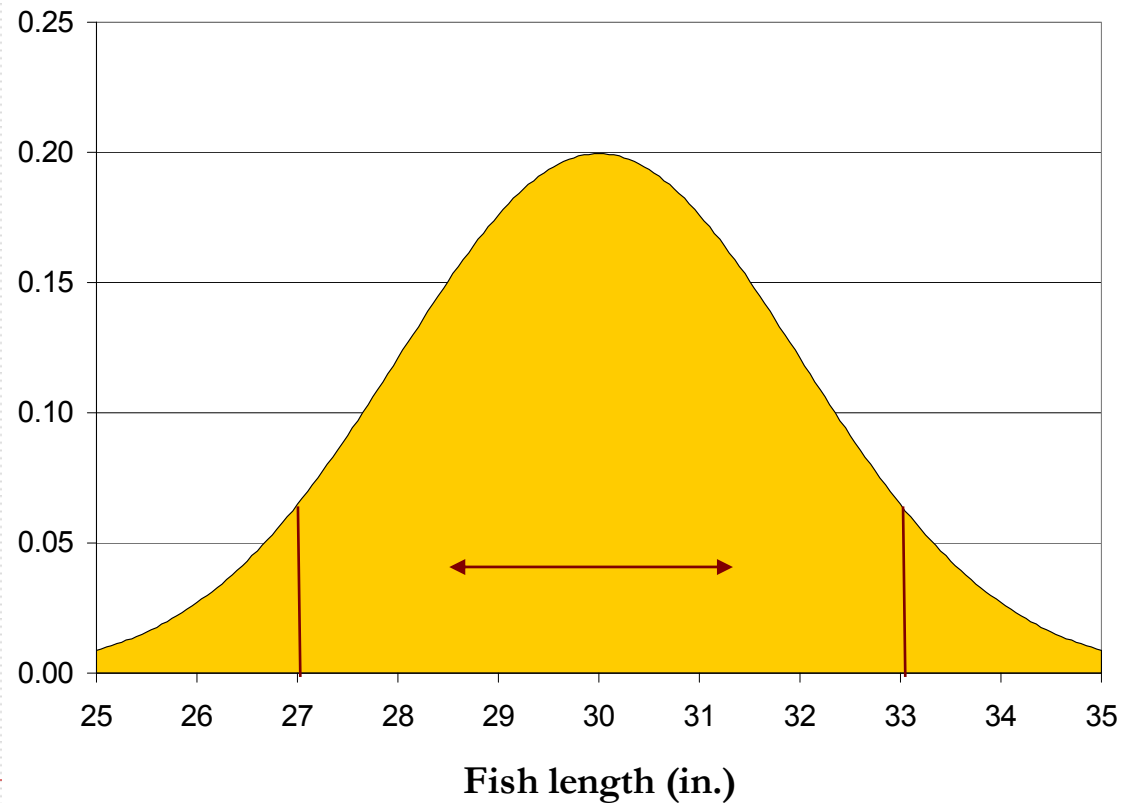
# CONFIDENCE INTERVAL ESTIMATES for LARGE SAMPLES

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- The sample has been randomly selected
  - The population standard deviation is known or the sample size is at least 30.
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# Normalna porazdelitev

- Kakšna je verjetnost, da bo ujeta postrv dolga med 26 in 29 cm?



# Interval zaupanja za aritmetično sredino populacije

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$$\bar{X} - z \frac{s}{\sqrt{n}} \leq \mu \leq \bar{X} + z \frac{s}{\sqrt{n}}$$

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$\bar{X}$ : sample mean

$s$ : sample standard deviation

$n$ : sample size

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# EXAMPLE

Estimate, with 95% confidence, the lifetime of nine volt batteries using a randomly selected sample where:

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$\bar{X}$  = 49 hours

$s$  = 4 hours

$n$  = 36

## EXAMPLE continued

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$$\begin{aligned}\text{Lower Limit: } & 49 - (1.96)(4/6) \\ & 49 - (1.3) = 47.7 \text{ hrs}\end{aligned}$$

$$\begin{aligned}\text{Upper Limit: } & 49 + (1.96)(4/6) \\ & 49 + (1.3) = 50.3 \text{ hrs}\end{aligned}$$

We are 95% confident that the mean lifetime of the population of batteries is between 47.7 and 50.3 hours.

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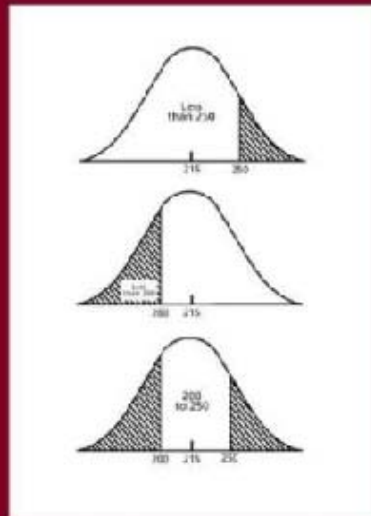
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