

# Medical Statistics, Informatics and Telemedicine

Lecture 4

Estimation and Confidence

1<sup>st</sup> October 2021

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# Topics of the Lecture

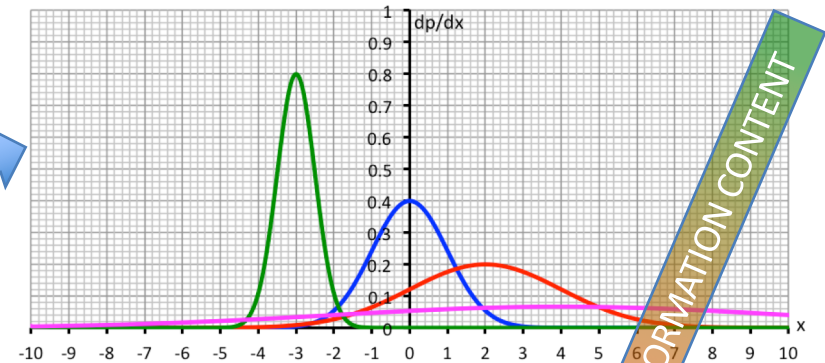
- The aim, types and process of **estimation**
- The **error of estimation** and its assessment
- The **confidence of estimation** and its assessment

# The Aim of Estimation

Population



Distributions



Parameters

Individual Probabilities

How to determine these?

# The Aim of Estimation

How to determine these?

**Creating a model**  
(only theoretical considerations)



Example: coin  
tossing

**Experiment,  
observation**





# The Process of Estimation

Population

Sample



Sampling

RANDOMNESS!



MATH

characterization of the sample

INFERENCE

drawing conclusions

UNCERTAINTY!

# Sampling and Sampling Errors

**What is a good sample like?**

**Typical sampling strategies**

**Some common problems**

# Types of Estimation

What percentage of people have an Rh+ blood type?

**Point Estimation**



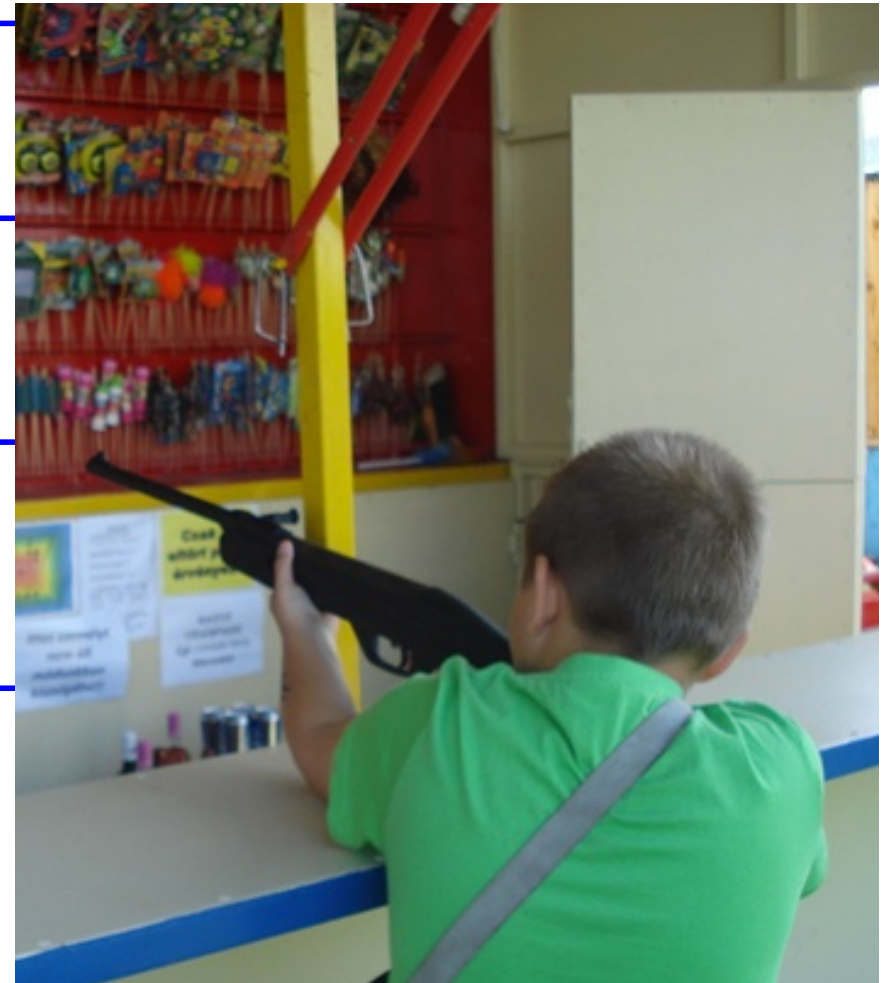
**Interval Estimation**

# Point Estimation

Theoretical values (of the population):  
„AIM”



Estimators (from the sample):  
„SHOT”



# Point Estimation

Theoretical values (of the population): „AIM”	Estimators (from the sample): „SHOT”
- probability or proportion ( $p = \text{probability}$ )	- relative frequency ( $\hat{p}$ [p hat])
- expected value, „population mean” ( $E(\xi) = \text{expected value}$ or $\mu$ [mu])	- sample mean ( $\bar{x}$ [x bar])
- theoretical variance ( $\text{Var}(\xi) = \text{variance}$ vagy $\sigma^2$ [szigma négyzet])	- corrected sample variance ( $s^2$ )
- theoretical standard deviation ( $\text{SD}(\xi) = \text{standard deviation}$ vagy $\sigma$ [szigma])	- corrected sample standard deviation ( $s$ , $\text{SD} = \text{standard deviation}$ )

# The Error of the Estimation

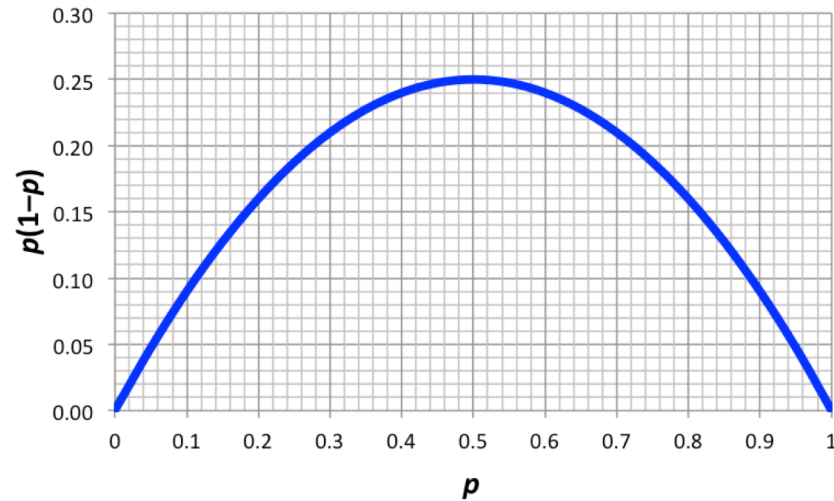
- the estimator is itself a random variable
- the theoretical standard deviation of the estimator is called **standard error**



# (Addendum: Standard Error of Proportion)

$$SE_{\text{prop}} = \sqrt{\frac{p(1-p)}{n}} \approx \sqrt{\frac{\frac{k}{n} \left(1 - \frac{k}{n}\right)}{n}}$$

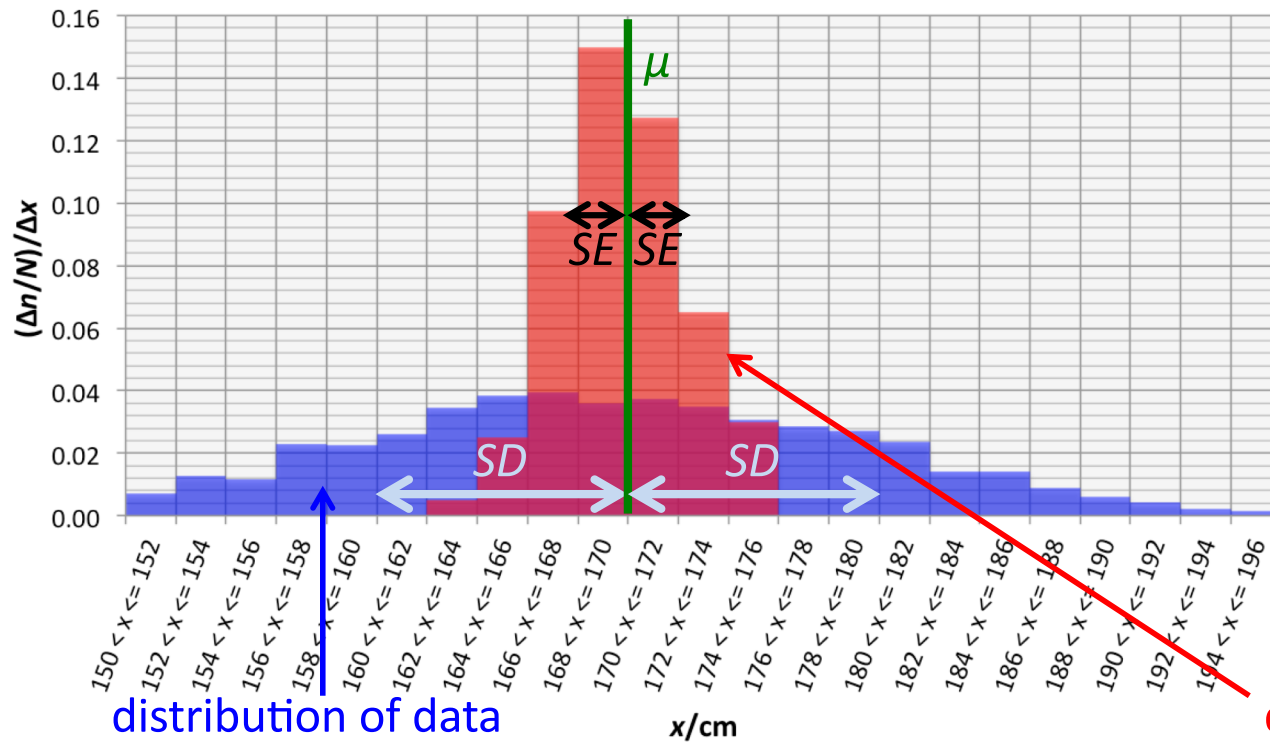
# (Addendum: Standard Error of Proportion)



$$\max(SE_{\text{prop}}) = \sqrt{\frac{0.5(1 - 0.5)}{n}} = \sqrt{\frac{0.25}{n}} = \frac{1}{\sqrt{4n}}$$

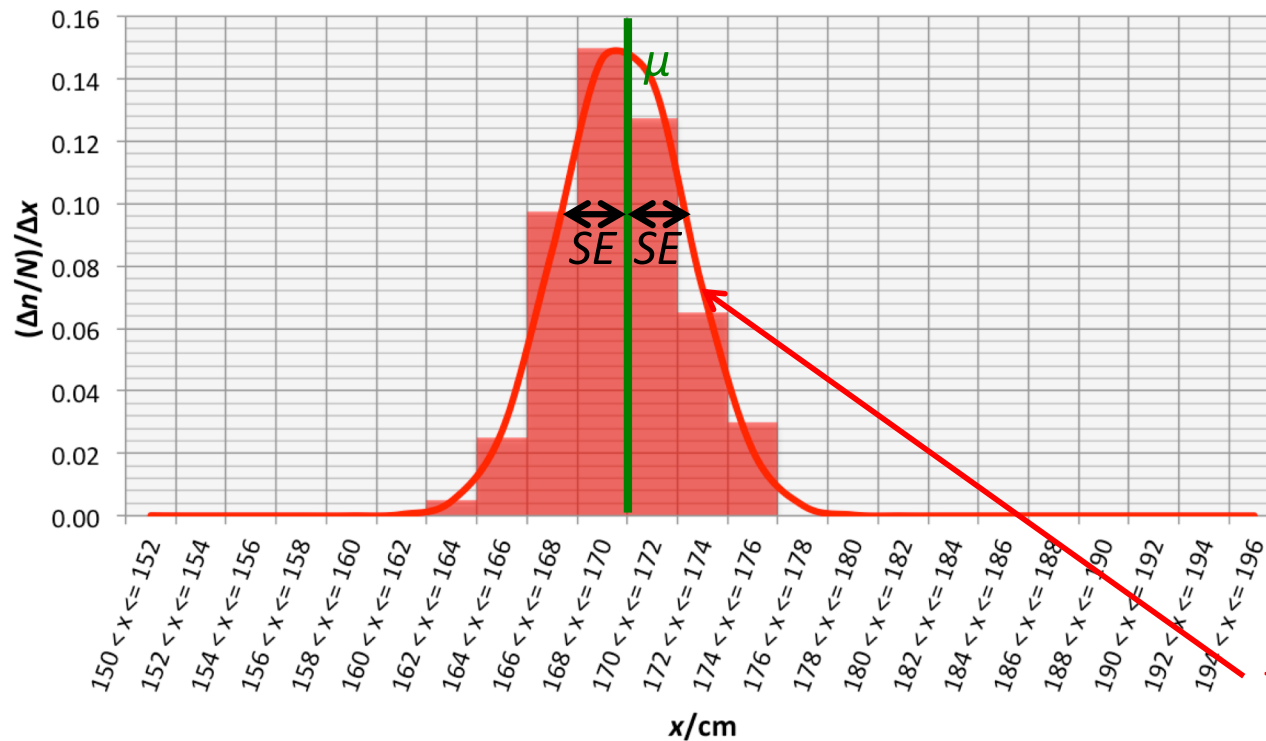


# Standard Error of the Mean



$$SE_{\text{mean}} = s_{\bar{x}} = \frac{\sigma}{\sqrt{n}}$$

# Standard Error of the Mean

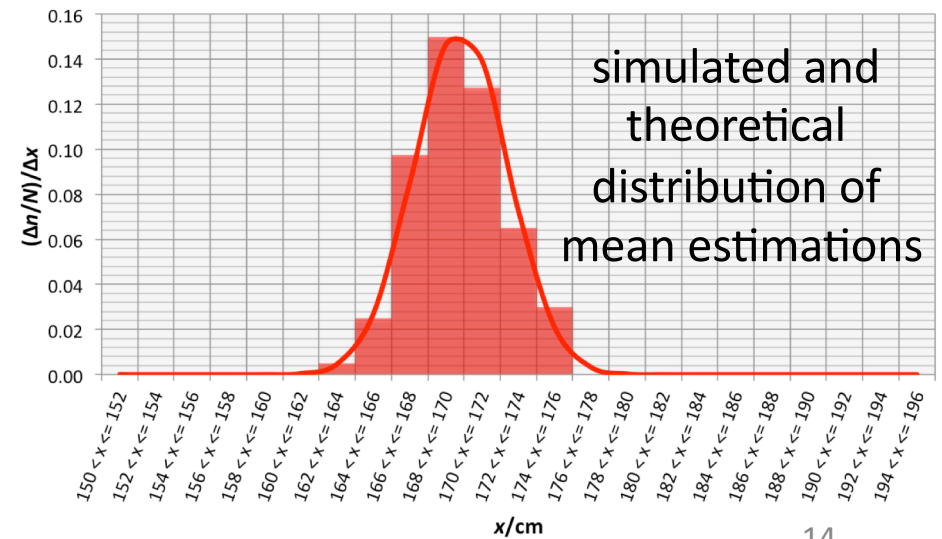
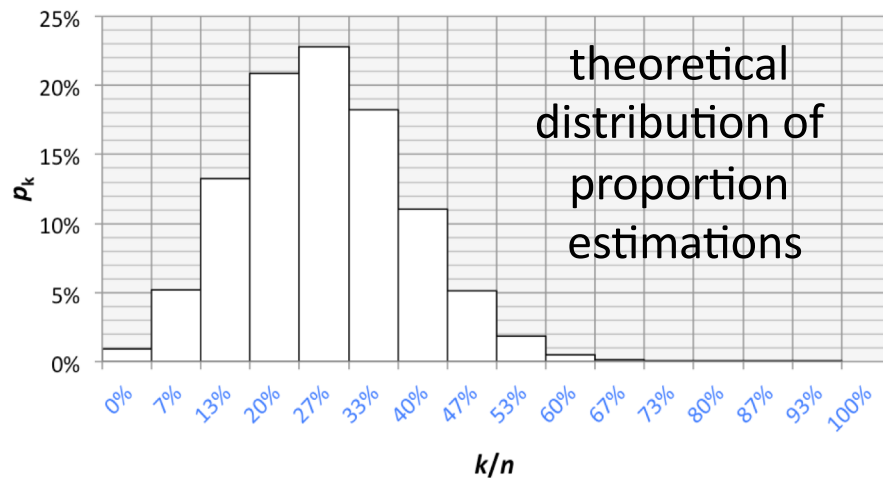


William S. Gosset  
1876–1937  
"Student"

$$SE_{\text{mean}} = s_{\bar{x}} = \frac{\sigma}{\sqrt{n}} \approx \frac{s}{\sqrt{n}}$$

theoretical model: *t*-distribution

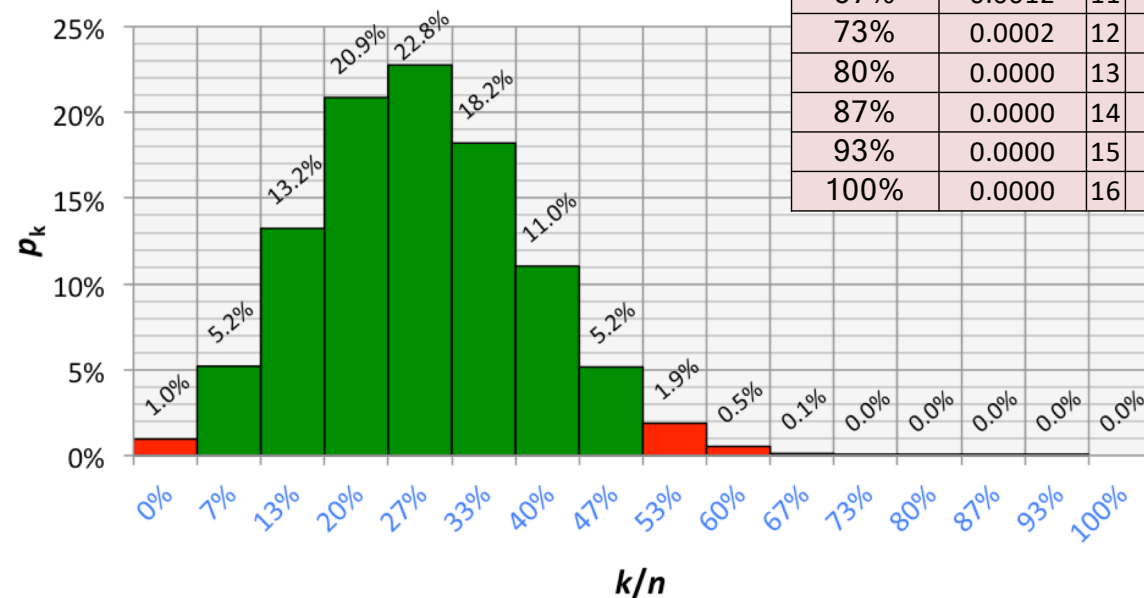
# Interval Estimation



# Interval Estimation of Proportion

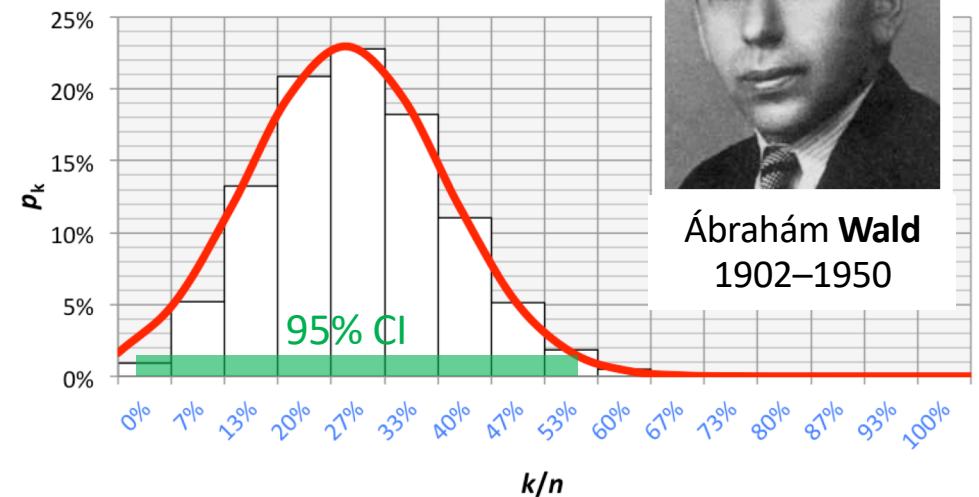
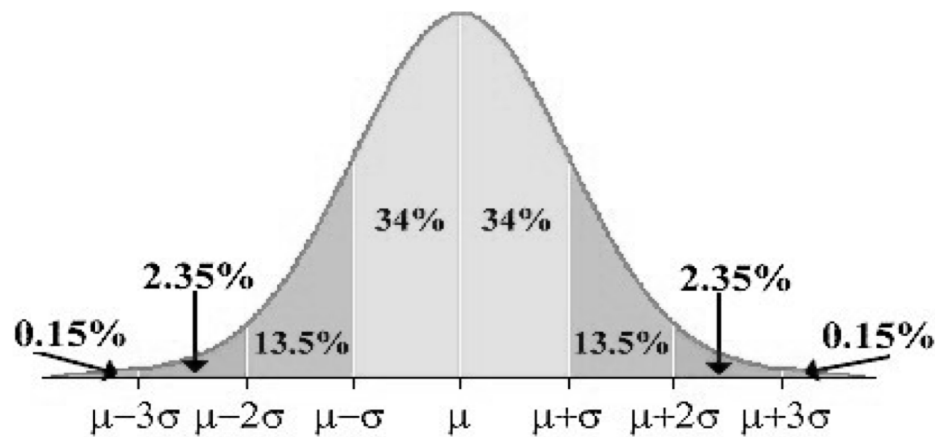
Method 1: exact binomial

$k/n$	$p_k$	#	SUMIF
0%	0.0095	9	0.9933
7%	0.0520	6	0.9134
13%	0.1324	4	0.7510
20%	0.2087	2	0.4364
27%	0.2277	1	0.2277
33%	0.1821	3	0.6185
40%	0.1104	5	0.8614
<b>47%</b>	<b>0.0516</b>	<b>7</b>	<b>0.9650</b>
53%	0.0188	8	0.9838
60%	0.0053	10	0.9986
67%	0.0012	11	0.9998
73%	0.0002	12	1.0000
80%	0.0000	13	1.0000
87%	0.0000	14	1.0000
93%	0.0000	15	1.0000
100%	0.0000	16	1.0000



# Interval Estimation of Proportion

## Method 2: normal approximation



$$95\% CI \approx \frac{k}{n} \pm 2 \cdot \sqrt{\frac{\frac{k}{n} \left(1 - \frac{k}{n}\right)}{n}}$$

# Interval Estimation of the Mean

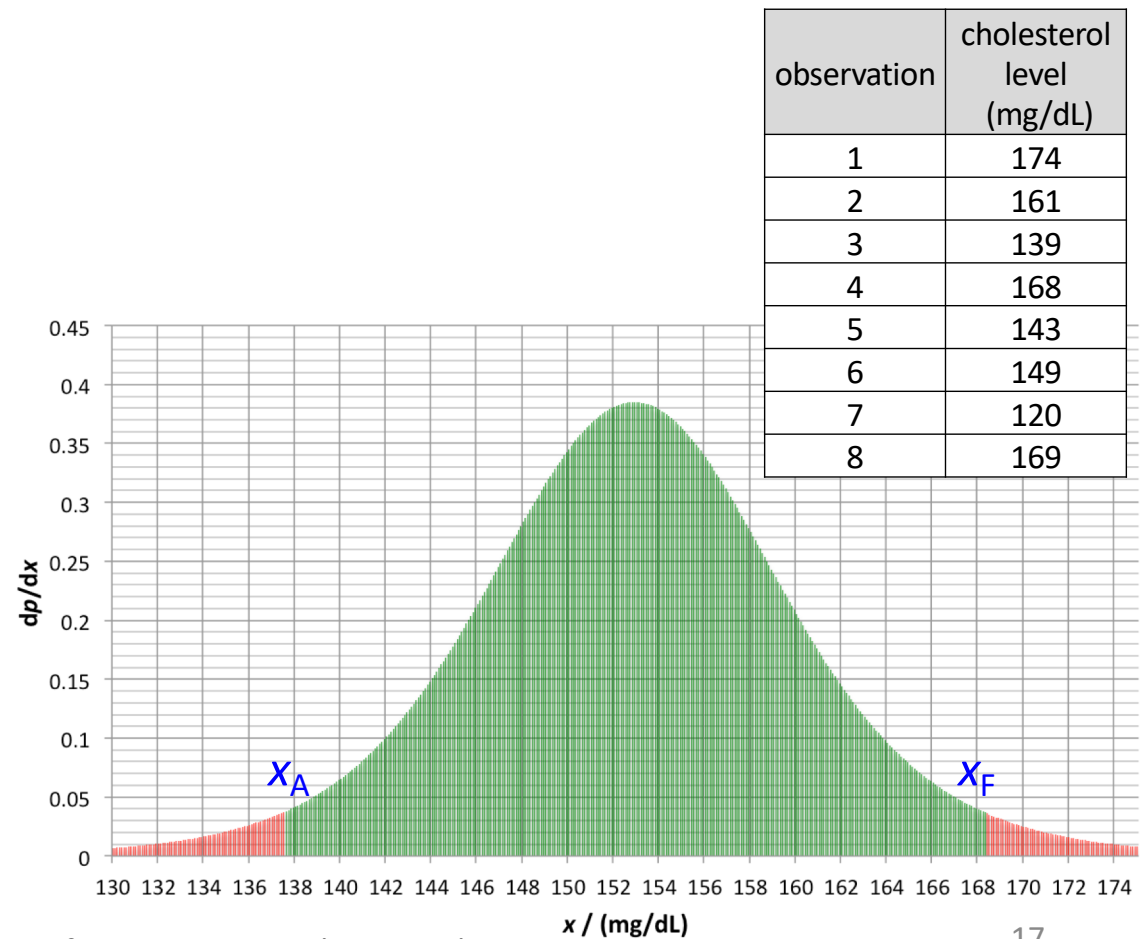


Fig.: 95% confidence interval (in green)

# Interval Estimation

**Confidence level ( $1 - \alpha$ ):** the probability that a CI calculated in a certain way will contain the estimated value.

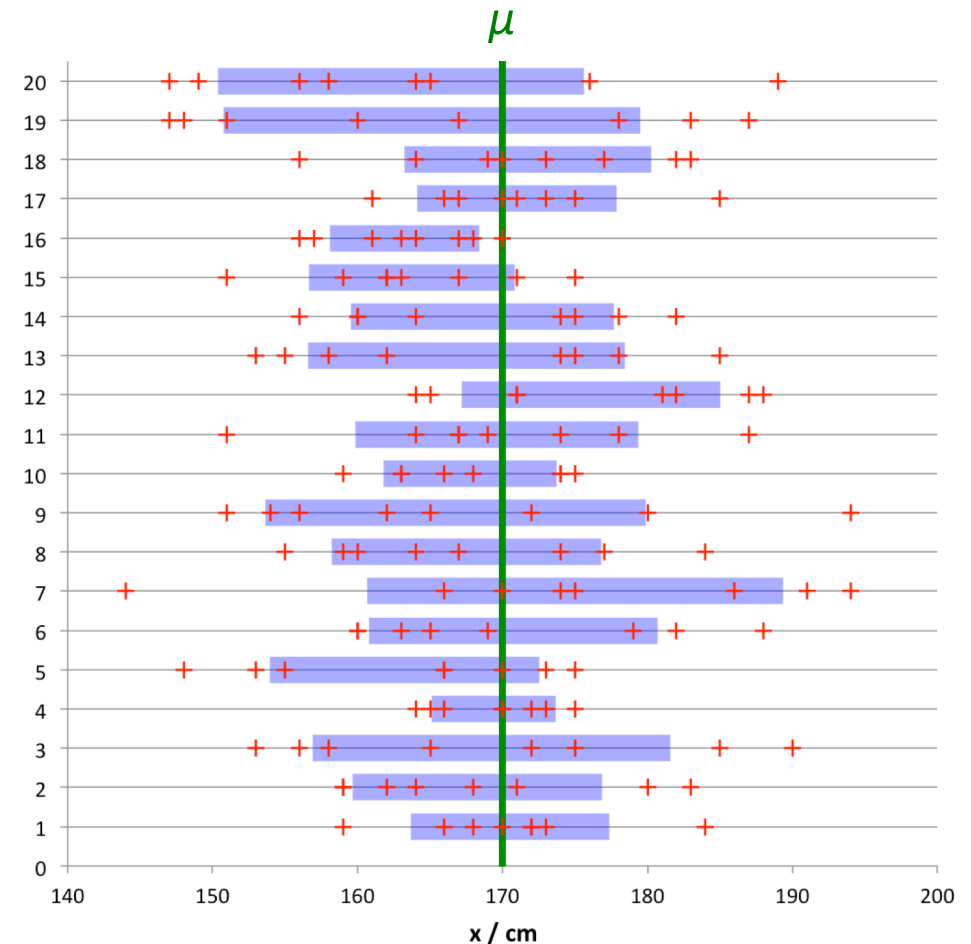
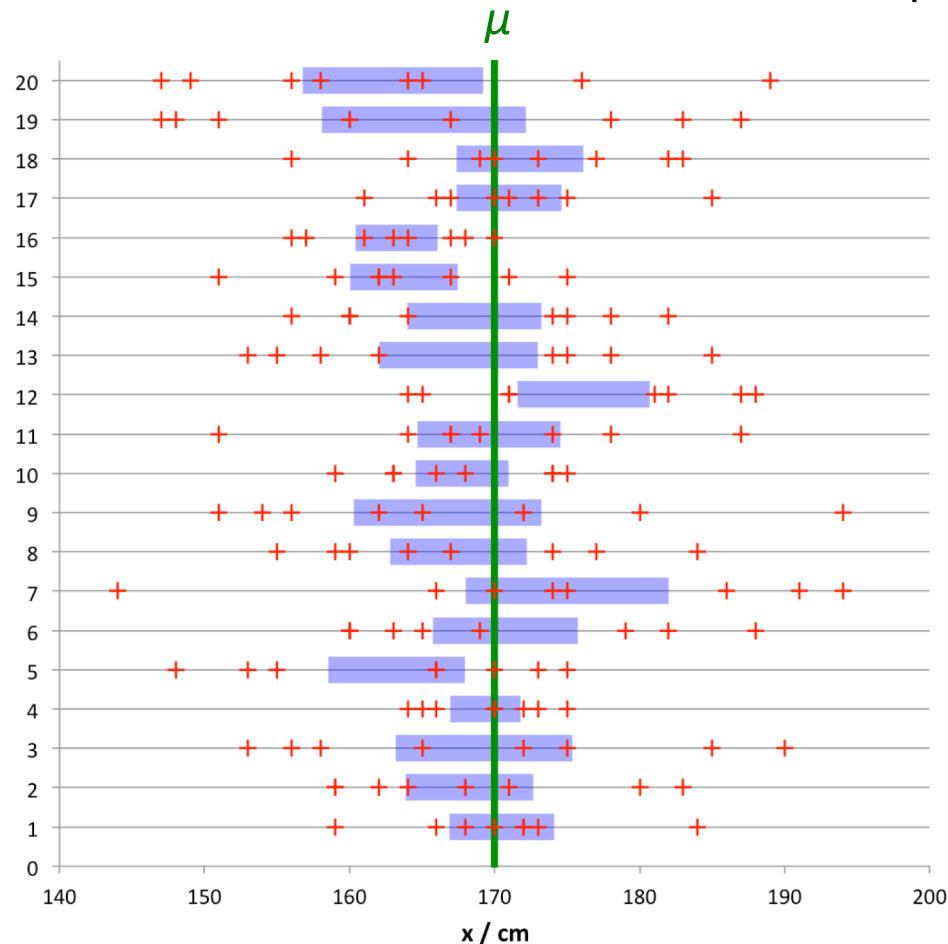


Fig: Simulation of 20 interval estimations for the expected value ( $\mu$ ) of body height using the same method: sample of 8 elements (red +), calculation of the mean and SD, then of 95% CI:  $mean \pm 2,36 \times SE$  (blue band). The estimated theoretical values are:  $\mu = 170$  cm,  $\sigma = 10$  cm.

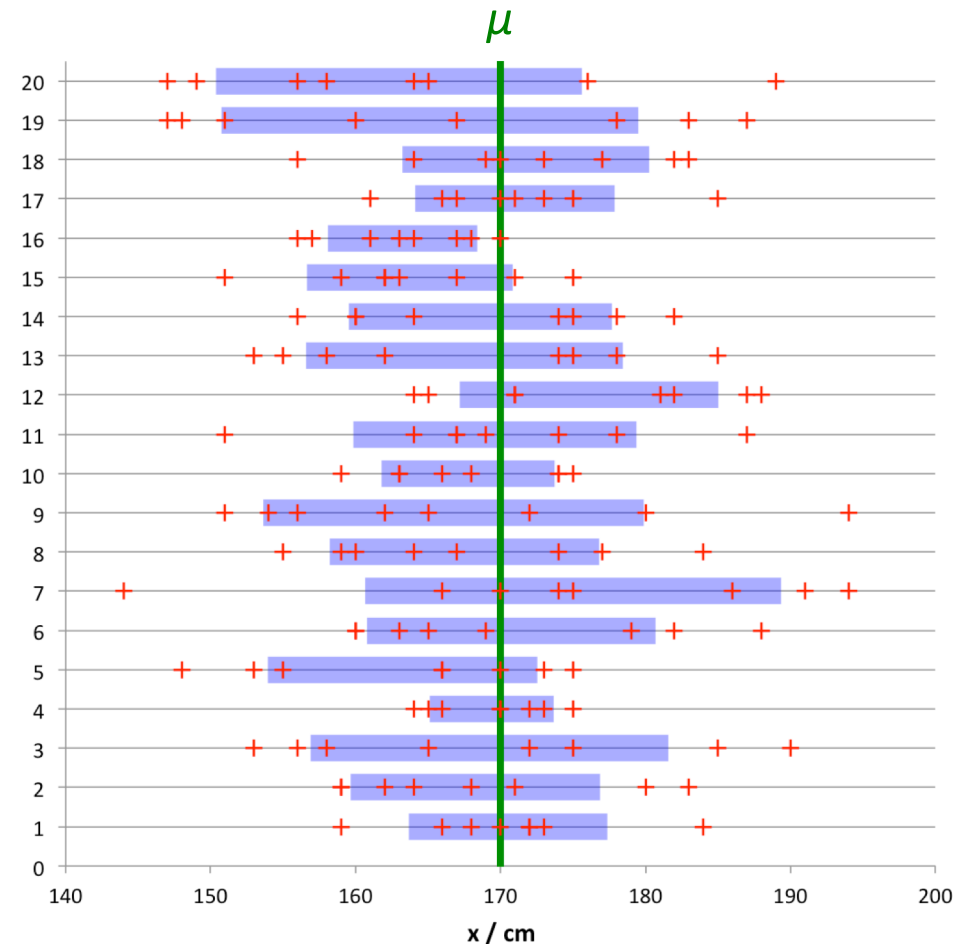
# Interval Estimation

20 CI calculated for the same 20 samples at both 68% and 95% confidence levels.



$n = 8, \mu = 170 \text{ cm}, \sigma = 10 \text{ cm}$

$1 - \alpha = 68\%$



$n = 8, \mu = 170 \text{ cm}, \sigma = 10 \text{ cm}$

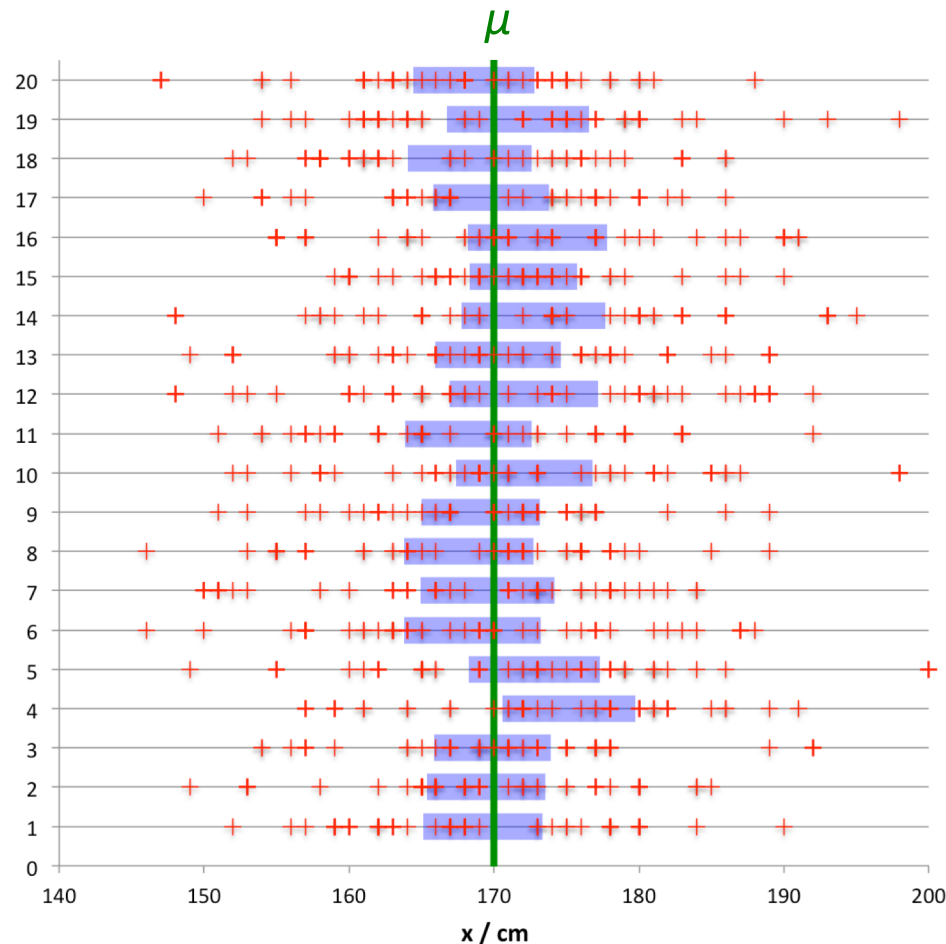
$1 - \alpha = 95\%$

Higher level =  
lower chance for the CI to miss the **estimated value**, but less information content.



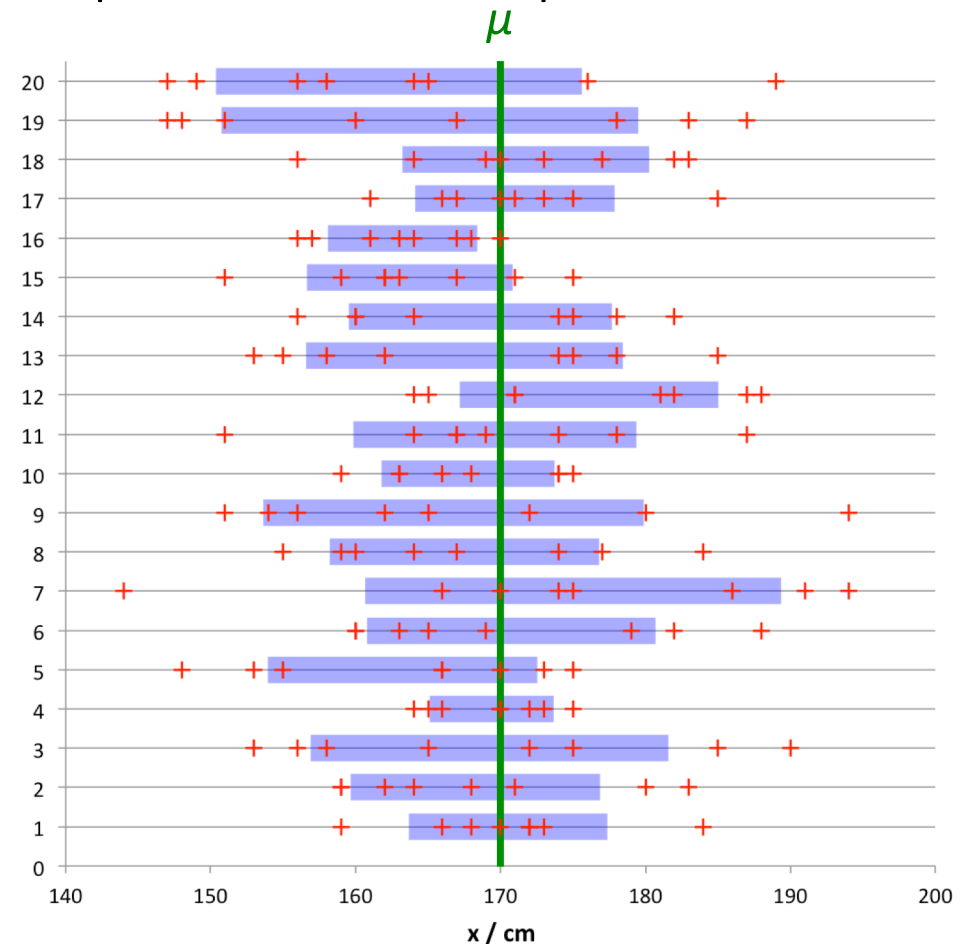
# Interval Estimation

calculation of 20–20 CIs with 95% level for 20 samples of 32 and 20 samples 8 elements.



$n = 32$  ( $df = 31$ ),  $\mu = 170$  cm,  $\sigma = 10$  cm

$1 - \alpha = 95\%$



$n = 8$  ( $df = 7$ ),  $\mu = 170$  cm,  $\sigma = 10$  cm

$1 - \alpha = 95\%$

Bigger sample size, same level => narrower CI.  
(4 times the sample size =>  $\frac{1}{2}$  width of CI)

# Appendix: Normal Range

**Normal range, reference range, or reference interval:** a range for the statistical variable, which contains a random element with **95% probability**.

TESTS	RESULT	FLAG	UNITS	REFERENCE INTERVAL	LAB
<b>CMP12+LP+6AC+CBC/D/Plt+UA</b>					
Chemistries					01
Glucose, Serum	80		mg/dL	65-99	01
Uric Acid, Serum	7.2		mg/dL	2.4-8.2	01
BUN	21		mg/dL	5-26	01
Creatinine, Serum	0.94		mg/dL	0.76-1.27	01
Glom Filt Rate, Est	>59		mL/min/1.73	>59	01
If African-American	>59		mL/min/1.73	>59	01
Note: Persistent reduction for 3 months or more in an eGFR <60 mL/min/1.73 m2 defines CKD. Patients with eGFR values >=60 mL/min/1.73 m2 may also have CKD if evidence of persistent proteinuria is present. Additional information may be found at <a href="http://www.kdoqi.org">www.kdoqi.org</a> .					
BUN/Creatinine Ratio	22			8-27	01
Sodium, Serum	142		mmol/L	135-145	01
Potassium, Serum	4.4		mmol/L	3.5-5.2	01
Chloride, Serum	100		mmol/L	97-108	01
Calcium, Serum	10.1		mg/dL	8.5-10.6	01
Phosphorus, Serum	3.9		mg/dL	2.5-4.5	01
Protein, Total, Serum	8.2		g/dL	6.0-8.5	01
Albumin, Serum	5.1		g/dL	3.5-5.5	01
Globulin, Total	3.1		g/dL	1.5-4.5	01
A/G Ratio	1.6			1.1-2.5	01
Bilirubin, Total	1.2		mg/dL	0.1-1.2	01
Bilirubin, Direct	0.20		mg/dL	0.00-0.40	01
<b>Bilirubin, Indirect</b>	<b>1.00</b>	<b>High</b>	mg/dL	0.10-0.80	01
Alkaline Phosphatase, S	70		IU/L	25-150	01
LDH	142		IU/L	100-250	01
AST (SGOT)	35		IU/L	0-40	01
<b>GGT</b>	<b>70</b>	<b>High</b>	IU/L	0-65	01
Iron, Serum	115		ug/dL	40-155	01