

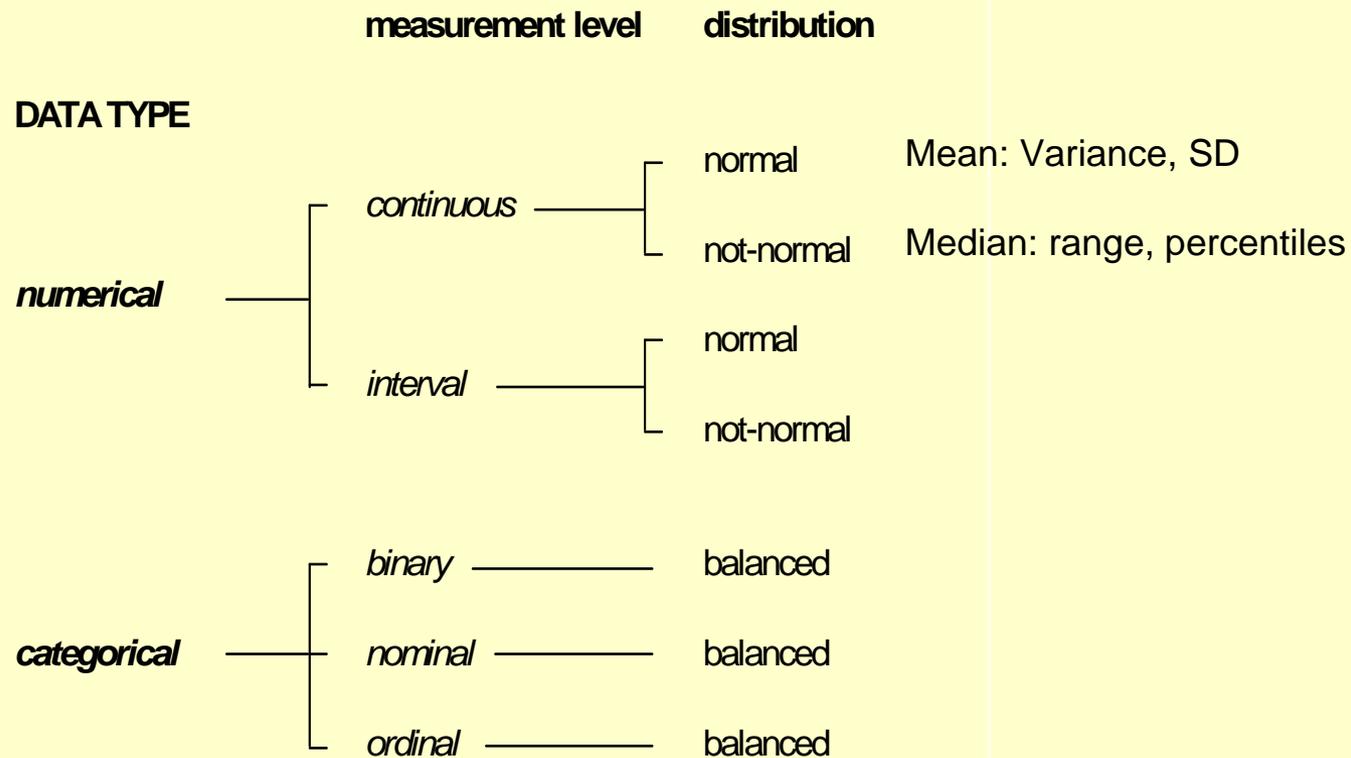
Practical Biostatistics

Department of Clinical
Epidemiology, Biostatistics and
Bioinformatics

AMC

Principles of statistical testing

Review



Statistical tests (1)

Why do we use statistical tests?



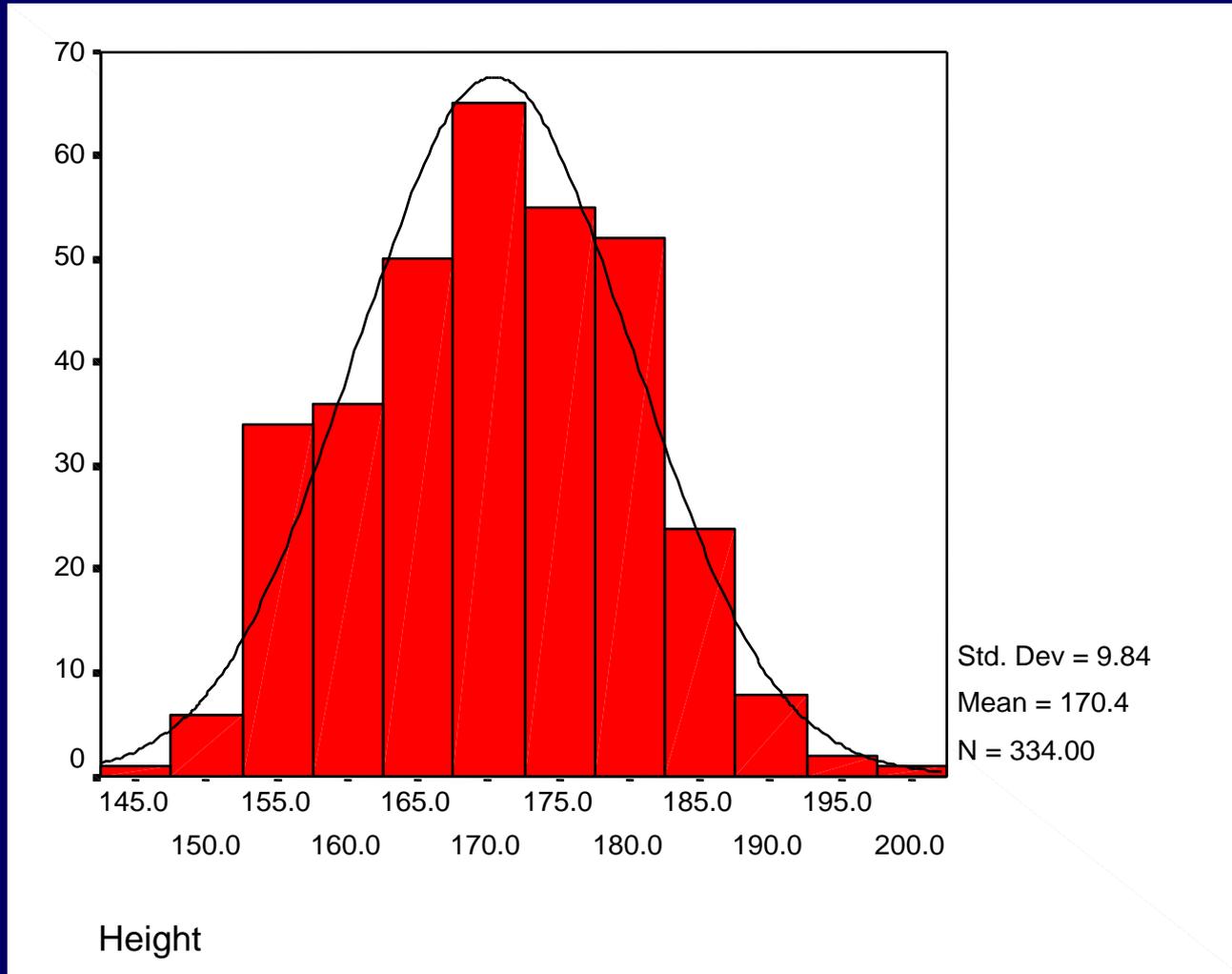
Statistical tests (2)

Statistics help provide us with information about a population, using sample information

Lecture 2

- ☒ Normal Distribution 
- ☒ Sample vs. Population
- ☒ Standardizing the normal distribution
- ☒ Confidence Intervals & P-values

Normal distribution (1)



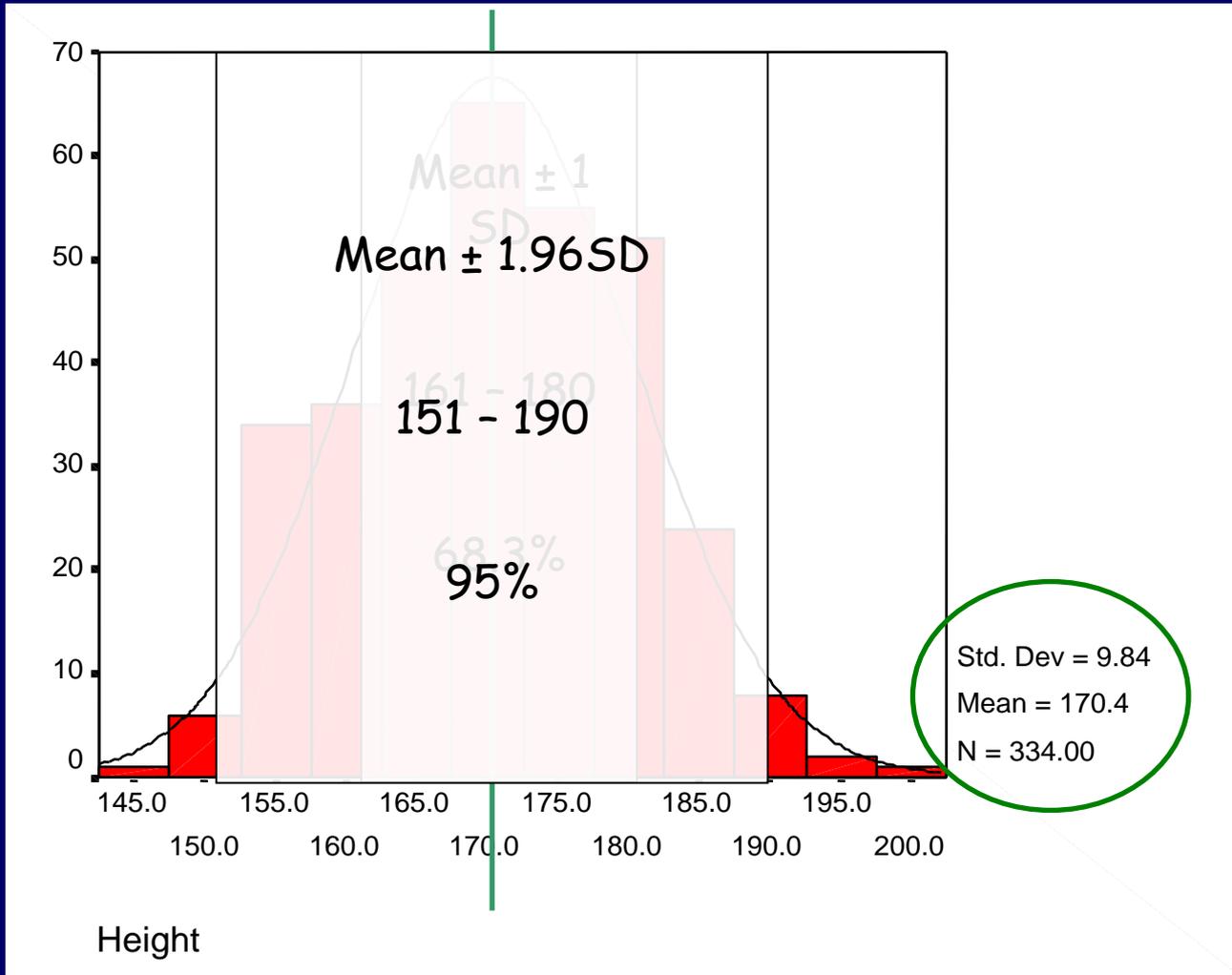
Normal distribution (2)

- Bell-shaped
- One top
- Symmetrical around its mean
- Mean and median are equal

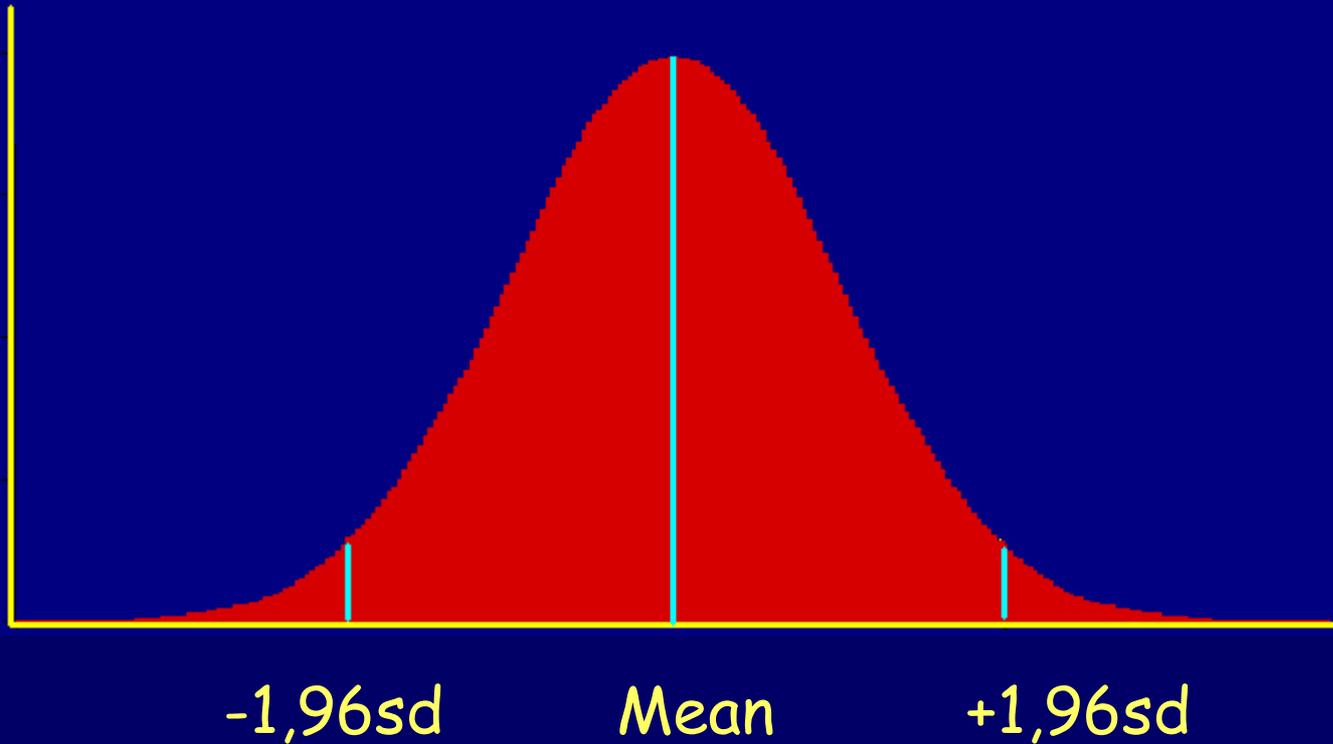
Normal distribution (3)

- mean \pm 1 SD ➤ 68,3% of all scores
- mean \pm 1.96 SD ➤ 95% of all scores
- mean \pm 3 SD ➤ 99,7% of all scores

Normal distribution



Normal Distribution



Probability that a Normally distributed random variable x , with mean μ , and SD σ , lies between $\text{Mean} \pm 1.96sd$ is 95%

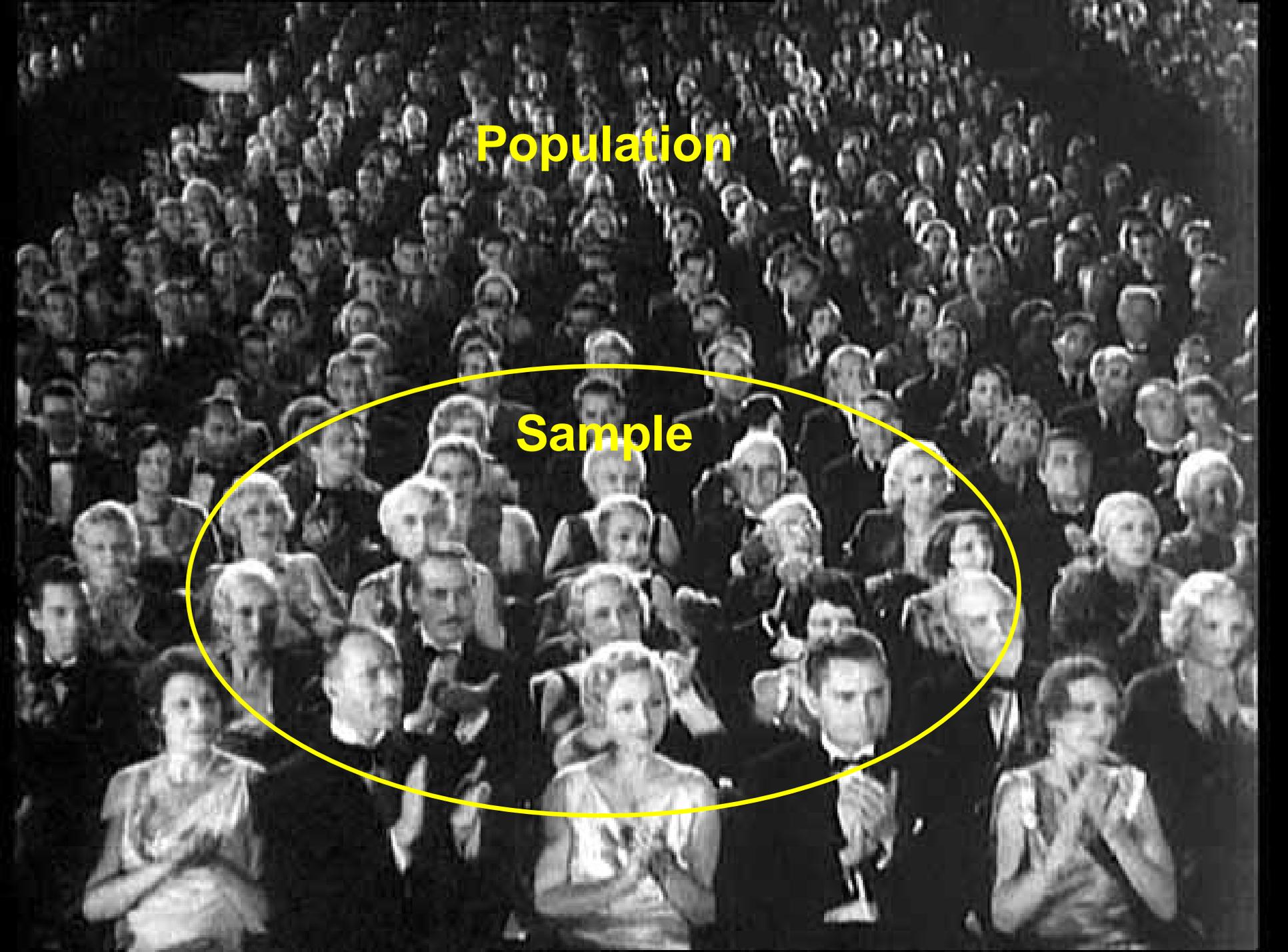
Lecture 2

- ☒ Normal Distribution
- ☒ Sample vs. Population ←
- ☒ Standardizing the normal distribution
- ☒ Confidence Intervals & P-values

Sample vs. population (1)

- ⊗ **Population** = an entire group of individuals in whom we are interested
- ⊗ **Sample** = a representative subset of the population in whom we are interested

What is a representative sample?



Population

Sample

Sample vs. Population (2)

- ☒ Based on a sample of individuals, we estimate the value for the population
- ☒ Make a statement for a larger group based on a limited number of observations

Sample vs population (3)

- ☒ **A Sample** is used to obtain knowledge about characteristics of a **Population**
- ☒ **A Sample statistic** is a value calculated from the observations from a sample
- ☒ **An inferential statistic:** is an estimate of the characteristics of the **population**

Estimate statistics (1)

- In Lecture 1 in a Normally distributed sample, we learnt:
 - Means
 - Standard deviations
- Lecture 2: we learn how well our sample data represents our population
- In second, third, fourth samples the sample statistics may differ

Estimate statistics (2)

We use inferential statistics to determine how well our sample statistic (eg. mean, SD) represents our population

Estimate Statistic (3)

- means -

- ☒ The mean in a sample can be taken as a 'point estimate' of the mean in the population

- ☒ How good is my estimation?
 - Depending on the spread in the sample
 - Depending on the size of the sample
 - Fluctuation between samples (sampling error)

Estimate statistics (4)

- ⊗ The **Standard Error** (SE) is the standard deviation (SD) of the sampling distribution of a estimate statistic
- ⊗ Spread of the means of various samples round the population mean is **Standard Error (SE)**

Estimate Statistics (5)

- Standard error -

Calculating the Standard error (SE):

- ☒ Take repeated samples of the same size from a population
- ☒ Calculate the mean of each sample
- ☒ Mean of these sample means, estimates the mean of the population
- ☒ Sampling means follow a Normal distribution

Standard error (1)

Estimate standard error (mean):

$$SE(\text{mean}) = SD/\sqrt{N}$$

SE example

- serum albumin -

⊗ $N = 216$

⊗ Mean of the sample = 34,5 g/l

⊗ $SD = 5,8 \text{ g/l}$

– Sample mean = estimate of population mean

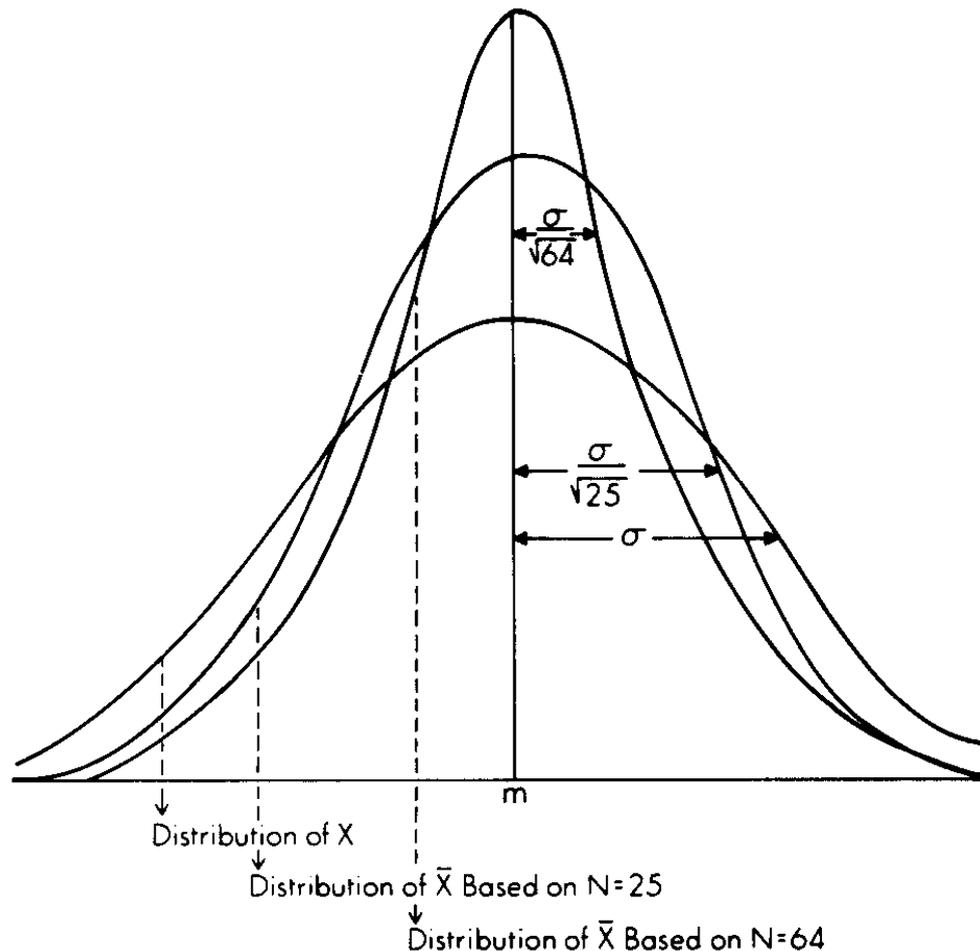
⊗ $SE = 5,8 / \sqrt{216} = 0,4 \text{ g/l}$

SD and SE

- ☒ **SD:** the variation in the data values of a sample, and should be quoted if you wish to show the spread in the sample data
- ☒ **SE:** precision of the sample mean (as estimate of the population mean) and should be quoted if you are interested in the prediction of the sample mean representing the population mean

Sample size and SE

The larger the sample size, the better the prediction of the mean of the population



Reports

- Descriptive Statistics
 - Frequencies...
 - Descriptives...
 - Explore...
 - Crosstabs...
 - Ratio...
- Tables
- Compare Means
- General Linear Model
- Mixed Models
- Correlate
- Regression
- Loglinear
- Classify
- Data Reduction
- Scale
- Nonparametric Tests
- Time Series
- Survival
- Multiple Response
- Missing Value Analysis...

pid	weight	age	sex	donset	ddiagn	death	code	bulbar0	barth0	barth1	rankin0	
1	62,0	1	1	15-DEC-85	15-JAN-88	1	NAC	10	19	14	2	
2	52,0	2	1	15-SEP-87	15-JUN-88	1	Placebo	17	20	18	2	
3	74,0	3	1	28-JUN-1922	Bulb 15-JUN-87	15-AUG-88	1	Placebo	9	19	16	2
4	75,0	4	1	24-APR-1927	Arm 15-FEB-88	15-AUG-88	1	NAC	14	19	16	2
5	81,0	5	1	06-SEP-1916	Bulb 15-SEP-86	15-AUG-88	1	Placebo	16	19	18	2
6	60,0	6	1	14-JUL-1915	Arm 15-DEC-86	15-MAY-88	1	Placebo	12	12	12	4
7	70,0	7	1	29-NOV-1948	Arm 15-APR-88	15-NOV-88	1	Placebo	22	16	17	3
8	76,0	8	1	16-AUG-1927	Leg 15-JAN-87	15-OCT-88	1	NAC	22	19	15	2
9	60,0	9	1	30-JUN-1931	Bulb 15-JUN-86	15-APR-88	1	NAC	11	20	19	2
10	72,0	10	1	16-NOV-1924	Bulb 15-JUN-86	15-MAY-87	1	Placebo	8	19	17	2
11	71,0	11	1	05-DEC-1929	Arm 15-SEP-86	15-NOV-87	1	Placebo	22	20	19	2
12	65,00	12	1	20-MAY-1926	Arm 15-JUL-88	15-DEC-88	1	Placebo	15	11	10	4
13	58,50	13	1	10-JUL-1923	Leg 15-DEC-87	15-FEB-89	1	Placebo	13	9	9	4
14	90,00	14	1	04-JUL-1926	Arm 15-JAN-88	15-JUL-88	1	Placebo	21	10	4	4
15	71,00	15	1	21-SEP-1932	Arm 15-DEC-87	15-DEC-88	1	NAC	19	14	15	3
16	70,00	16	1	07-OCT-1928	Leg 15-FEB-88	15-JAN-89	1	NAC	22	10	12	4
17	64,00	17	1	17-NOV-1938	Leg 15-JUN-88	15-SEP-88	1	Placebo	21	17	16	3
18	63,00	18	1	28-APR-1941	Leg 15-JUL-88	15-FEB-89	1	Placebo	22	15	16	3
19	89,00	19	1	09-SEP-1925	Bulb 15-SEP-88	15-FEB-89	1	Placebo	8	20	15	3
20	75,00	20	1	21-MAR-1925	Leg 15-SEP-88	15-MAR-89	1	Placebo	17	19	18	2
21	79,00	21	1	14-FEB-1924	Leg 15-OCT-86	15-MAY-89	1	Placebo	14	18	17	2
22	63,00	22	1	15-MAY-1918	Leg 15-DEC-86	15-FEB-89	1	Placebo	12	17	19	3
23	70,00	23	1	26-JAN-1948	Leg 15-JUN-88	15-MAR-89	1	Placebo	22	18	15	2
24	64,00	24	1	29-SEP-1926	Arm 15-NOV-87	15-FEB-89	1	NAC	15	16	15	3
25	65,00	25	1	25-APR-1947	Leg 15-APR-88	15-JAN-89	0	NAC	11	7	4	4
26	80,00	26	1	23-MAR-1946	Arm 15-DEC-82	15-JAN-86	0	NAC	21	20	14	2
27	88,00	27	1	01-JAN-1960	Arm 15-NOV-87	15-FEB-89	0	NAC	17	16	12	3
28	72,50	28	1	24-MAY-1933	Arm 15-JAN-88	15-MAY-89	1	NAC	13	16	14	3
29	68,00	29	1	03-JAN-1927	Arm 15-MAY-88	15-DEC-88	1	NAC	21	19	18	2
30	92,00	30	1	29-SEP-1957	Arm 15-JAN-89	15-MAY-89	1	NAC	19	18	12	2
31	78,00	31	1	12-FEB-1924	Bulb 15-JAN-88	15-MAY-89	1	NAC	13	10	10	2



	pid	weight	length	male	dbirth	site	donset	ddiagn	death	code	bulbar0	barth0	barth1	rankin0
1	1	63,00	168	1	11-MAR-1934	Arm	15-DEC-85	15-JAN-88	1	NAC	10	19	14	2
2	2	63,00	168	1	11-MAR-1934	Arm	5-SEP-87	15-JUN-88	1	Placebo	17	20	18	2
3	3	63,00	168	1	11-MAR-1934	Arm	15-JUN-87	15-AUG-88	1	Placebo	9	19	16	2
4	4	63,00	168	1	11-MAR-1934	Arm	5-FEB-88	15-AUG-88	1	NAC	14	19	16	2
5	5	63,00	168	1	11-MAR-1934	Arm	5-SEP-86	15-AUG-88	1	Placebo	16	19	18	2
6	6	63,00	168	1	11-MAR-1934	Arm	5-DEC-86	15-MAY-88	1	Placebo	12	12	12	4
7	7	63,00	168	1	11-MAR-1934	Arm	5-APR-88	15-NOV-88	1	Placebo	22	16	17	3
8	8	63,00	168	1	11-MAR-1934	Arm	15-JAN-87	15-OCT-88	1	NAC	22	19	15	2
9	9	63,00	168	1	11-MAR-1934	Arm	15-JUN-86	15-APR-88	1	NAC	11	20	19	2
10	10	63,00	168	1	11-MAR-1934	Arm	15-JUN-86	15-MAY-87	1	Placebo	8	19	17	2
11	11	63,00	168	1	11-MAR-1934	Arm	5-SEP-86	15-NOV-87	1	Placebo	22	20	19	2
12	12	63,00	168	1	11-MAR-1934	Arm	15-SEP-86	15-NOV-87	1	Placebo	22	20	19	2
13	13	63,00	168	1	11-MAR-1934	Arm	15-SEP-86	15-NOV-87	1	Placebo	22	20	19	2
14	14	63,00	168	1	11-MAR-1934	Arm	15-SEP-86	15-NOV-87	1	Placebo	22	20	19	2
15	15	71,00	173	1	21-SEP-1932	Arm	15-SEP-86	15-NOV-87	1	Placebo	22	20	19	2
16	16	70,00	160	0	07-OCT-1928	Leg	15-SEP-86	15-NOV-87	1	Placebo	22	20	19	2
17	17	64,00	172	1	17-NOV-1938	Leg	15-SEP-86	15-NOV-87	1	Placebo	22	20	19	2
18	18	63,00	168	0	28-APR-1941	Leg	15-SEP-86	15-NOV-87	1	Placebo	22	20	19	2
19	19	89,00	158	0	09-SEP-1925	Bulb	15-SEP-86	15-NOV-87	1	Placebo	22	20	19	2
20	20	75,00	183	1	21-MAR-1925	Leg	15-SEP-86	15-NOV-87	1	Placebo	22	20	19	2
21	21	79,00	176	1	14-FEB-1924	Leg	15-SEP-86	15-NOV-87	1	Placebo	22	20	19	2
22	22	63,00	167	0	15-MAY-1918	Leg	15-SEP-86	15-NOV-87	1	Placebo	22	20	19	2
23	23	70,00	172	1	26-JAN-1948	Leg	15-SEP-86	15-NOV-87	1	Placebo	22	20	19	2
24	24	64,00	172	0	29-SEP-1926	Arm	15-SEP-86	15-NOV-87	1	Placebo	22	20	19	2
25	25	65,00	172	0	25-APR-1947	Leg	15-SEP-86	15-NOV-87	1	Placebo	22	20	19	2
26	26	80,00	175	1	23-MAR-1946	Arm	15-SEP-86	15-NOV-87	1	Placebo	22	20	19	2
27	27	88,00	180	1	01-JAN-1960	Arm	15-SEP-86	15-NOV-87	1	Placebo	22	20	19	2
28	28	72,50	176	1	24-MAY-1933	Arm	15-SEP-86	15-NOV-87	1	Placebo	22	20	19	2
29	29	68,00	175	1	03-JAN-1927	Arm	15-SEP-86	15-NOV-87	1	Placebo	22	20	19	2
30	30	92,00	187	1	29-SEP-1957	Arm	15-SEP-86	15-NOV-87	1	Placebo	22	20	19	2
31	31	78,00	170	1	12-FEB-1934	Bulb	15-SEP-86	15-MAY-89	1	NAC	13	10	10	2

Frequencies

Variable(s):
 Weight at visit 0 [weigh]

Display frequency tables

Frequencies: Statistics

Percentile Values

Quartiles
 Cut points for: 10 equal groups
 Percentile(s):

Central Tendency

Mean
 Median
 Mode
 Sum

Values are group midpoints

Dispersion

Std. deviation
 Variance
 Range
 Minimum
 Maximum
 S.E. mean

Distribution

Skewness
 Kurtosis

Standard error (2)

- important concept-

- ☒ SE can be used for two statistical calculations
 - ☒ calculation of the confidence interval for the mean (CI)
 - ☒ calculation of the 'critical value' required in testing (p-value)

Standard Error (3):

NB: The SE can also be used for ordinal, nominal and binary data, but is not expressed in means and SD, but in proportions.

Lecture 2

- ☒ Normal Distribution
- ☒ Sample vs. Population
- ☒ Standardizing the normal distribution ←
- ☒ Confidence Intervals & P-values

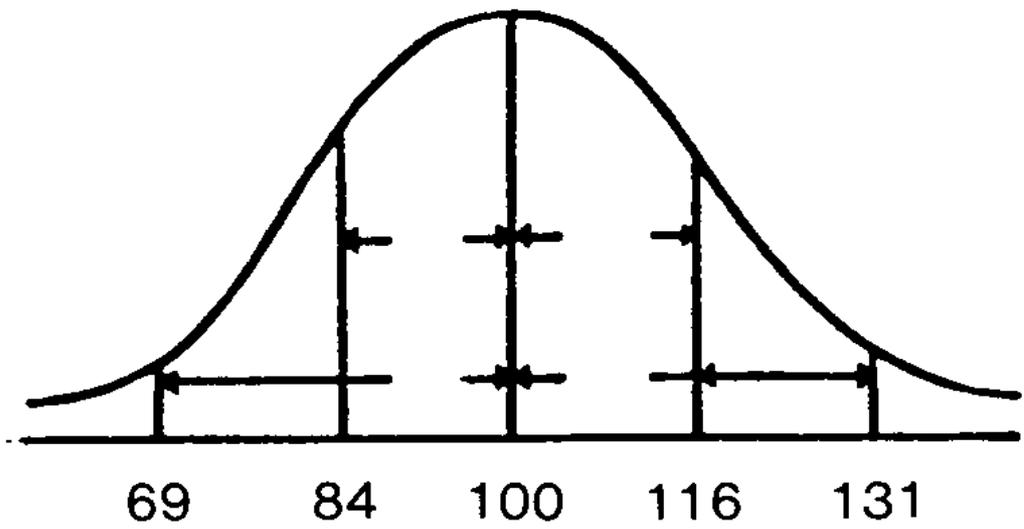
SD and SE

- ☒ **Mean and SD:** calculated mean of sample and spread in the data values of a sample
- ☒ **Mean and SE:** estimated mean of population and precision of this estimation sample mean (as estimate of the population mean)
- ☒ Both follow normal distribution

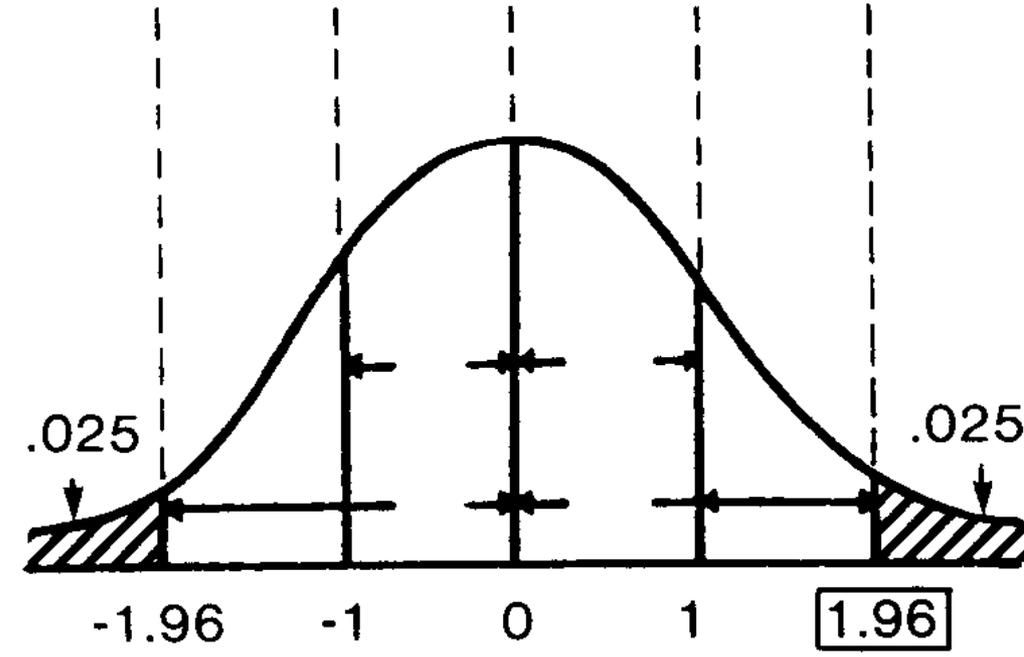
Standardize Normal distribution

- z-distribution -

- There are many different normal distributions
- But only one z-distribution where:
 - mean = 0
 - SD = 1
- Every Normal distribution can be transposed into a z-distribution



Normally distributed weight data



Z-distribution

DISTRIBUTION OF Z

Standardized Normal distribution

- z-distribution -

- z-score on a *sample* level indicates the number of SD's a score is above or below the *sample* mean
- z-score on *population* level indicates the number of SE's a sample mean is above or below the *population* mean

How?



- standard scores on *sample level*-

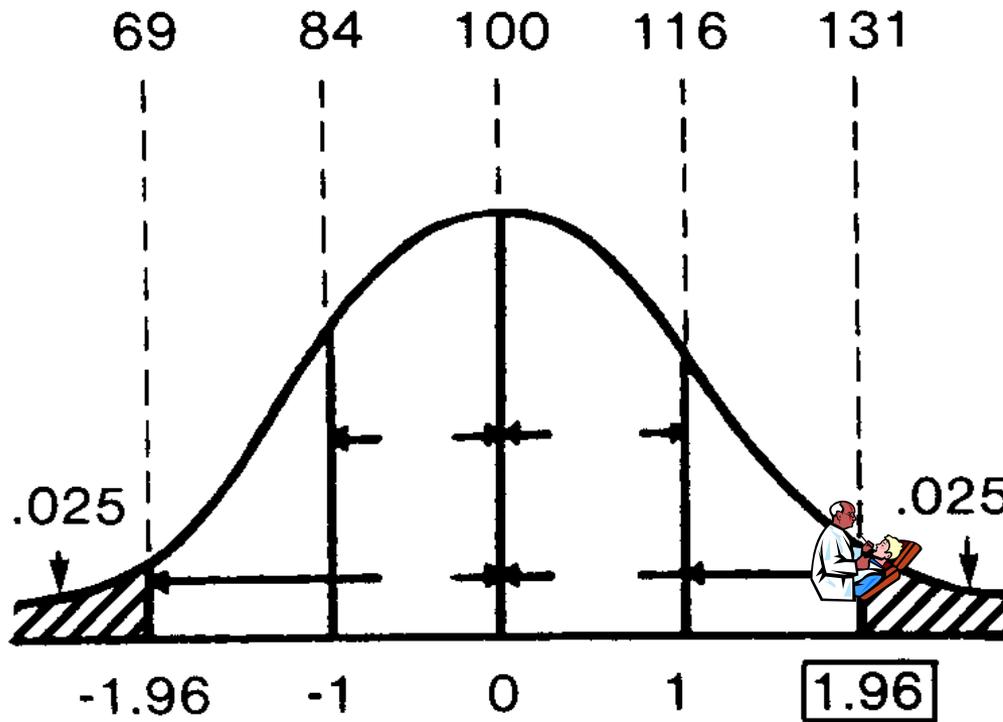
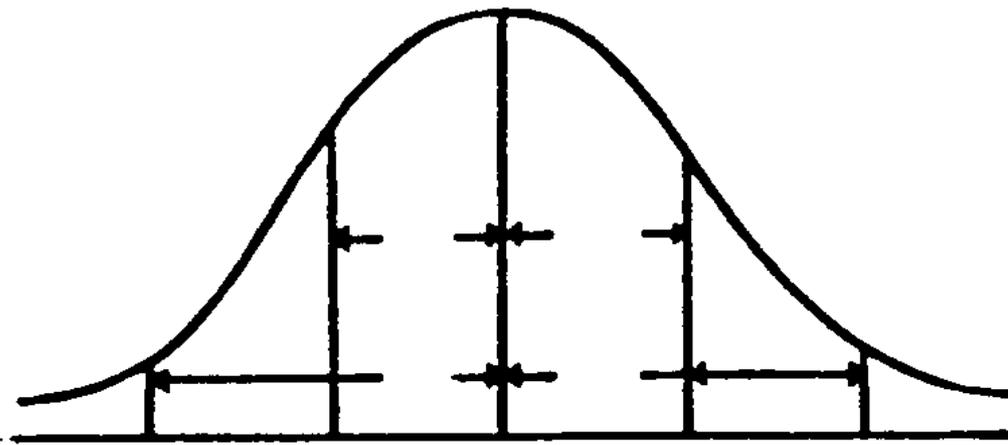
- Difference between *an individual score* and the *sample mean*
 - mean = 100; SD = 15,8; N = 25
 - Patients' score is 131 (difference = 31 points)
- z-score of the patient = $31 / 15,8 = 1,96$
- score of this patient is 1,96 SD above the sample mean

why?

- standard scores on *sample level*-

- Using a z-score, we can calculate the probability of a specific individual score related to the sample mean
- Probability of $z \Rightarrow 1,96$ or higher = 2,5%
- remark:
 - $z \leq -1,96$ is 2,5% as well

Sample

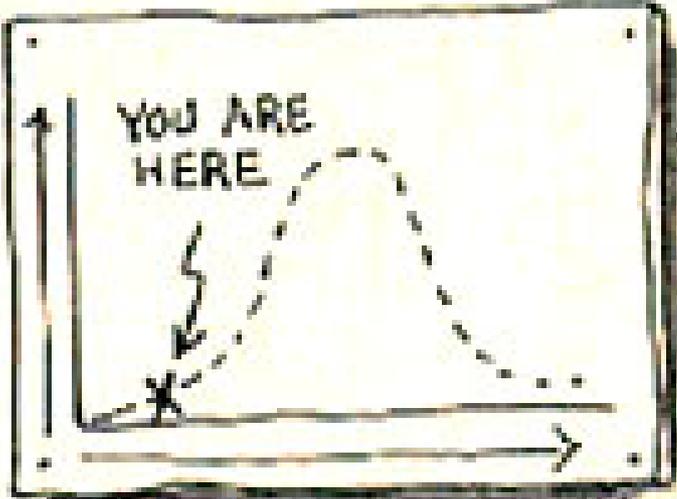
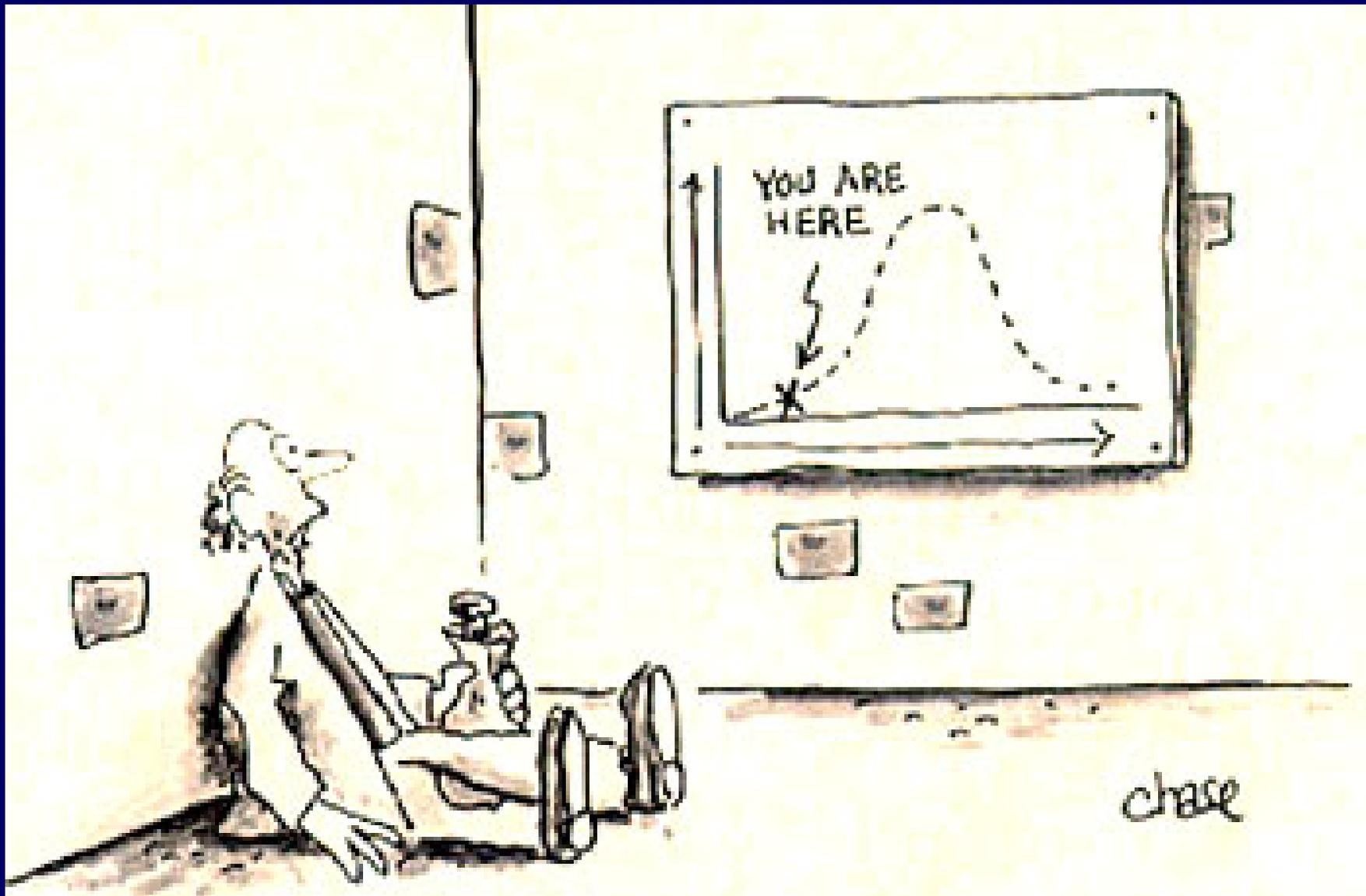


DISTRIBUTION OF Z

How?

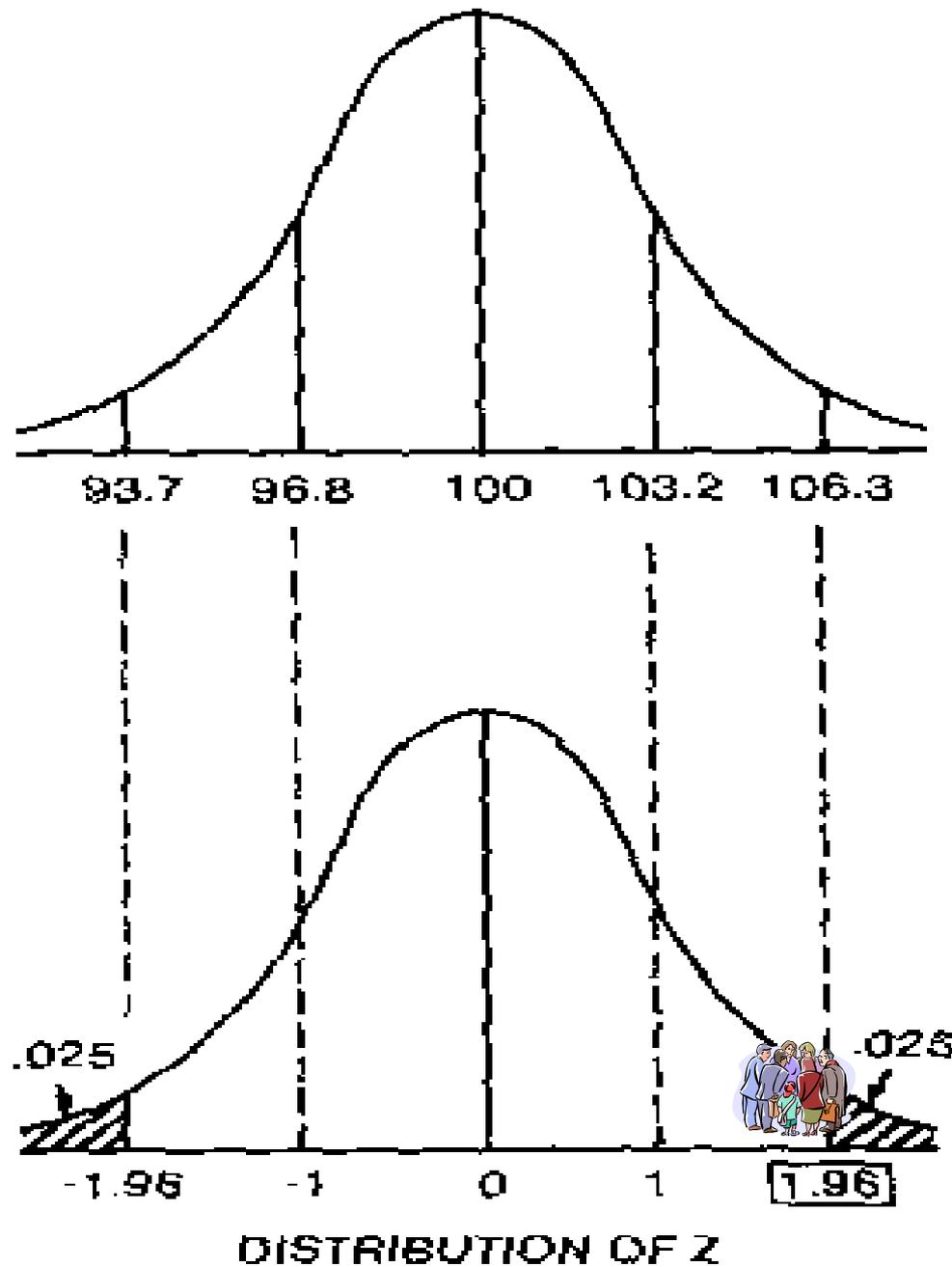
- standard scores on *population level* -
- Difference between *sample mean* and *population mean*
 - Population mean = 100
 - Sample mean = 106.3; SD = 16; N = 25
 - SE = $16 / \sqrt{25} = 3,2$
- z-score (sample mean) = $6,3 / 3,2 = 1,96$
- Sample mean is 1,96 SE above the population mean





chase

population



Lecture 2

- ☒ Normal Distribution
- ☒ Sample vs. Population
- ☒ Standardizing the normal distribution
- ☒ Confidence Intervals & P-values 

95% confidence interval of population mean - what -

- ☒ `Interval estimate': range of values around point estimate
- ☒ 95% confident that the true population mean lies within these limits

95% confidence interval - how -

- ☒ Sample mean is estimate of population mean
- ☒ SE = precision of the sample mean
- ☒ Mean \pm 1.96 SE \rightarrow 95% of sample means

= 95% Confidence Interval (95% CI)

95% confidence interval - example -

- ☒ Cohort (N = 600) cirrhosis patients
- ☒ Mean = 34,46 g/l; SE = 0,397 g/l
- ☒ 95% CI = mean \pm **1,96** * SE

– 95% CI population mean =

– $34,46 \pm 1,96 * 0,397$

– 33,68 tot 35,24 g/l

Size of confidence interval

☒ 90%, 95%, or 99% CI

- more confidence that range includes population value (high number) means wider intervals

☒ SD (dispersion in the sample)

- studies with much sample variation have wider intervals (less clinical information)

☒ N (sample size)

- studies with large sample sizes have smaller intervals (more clinical information)

95% confidence interval

- estimation -

- ☒ Cohort (N = 600) cirrhosis patients
 - ☒ Mean = 34,46 g/l; SE = 0,397 g/l
 - ☒ 95% CI = 33,68 tot 35,24 g/l
 - ☒ 5% probability population mean is outside 95% CI
-
- ☒ Normal population: < 33 g/l
-
- ☒ Probability that value of cirrhosis patients is like that of the normal population < 5% (P < 0.05)

Testing with 95% CI

- estimation of the treatment interval -

- ⊗ Calculate 95% confidence interval
- ⊗ Define the null hypothesis
 - H_0 : no difference between groups
 - H_1 : groups are different
- ⊗ If the null hypothesis value is within 95% CI → accept H_0
- ⊗ If the null hypothesis value is outside 95% CI → reject H_0 , in favour of H_1 : there is a difference

Interpreted the p-value

☒ $p < 0,05 \Rightarrow$ reject H_0

☒ $p \geq 0,05 \Rightarrow$ accept H_0

☒ $p < 0,05 \Rightarrow$ statistically significant

☒ $p \geq 0,05 \Rightarrow$ not statistically significant

p-value (1)

Is the probability of obtaining our results, or something more extreme, **assuming** that the null hypothesis is true!

p-value (2)

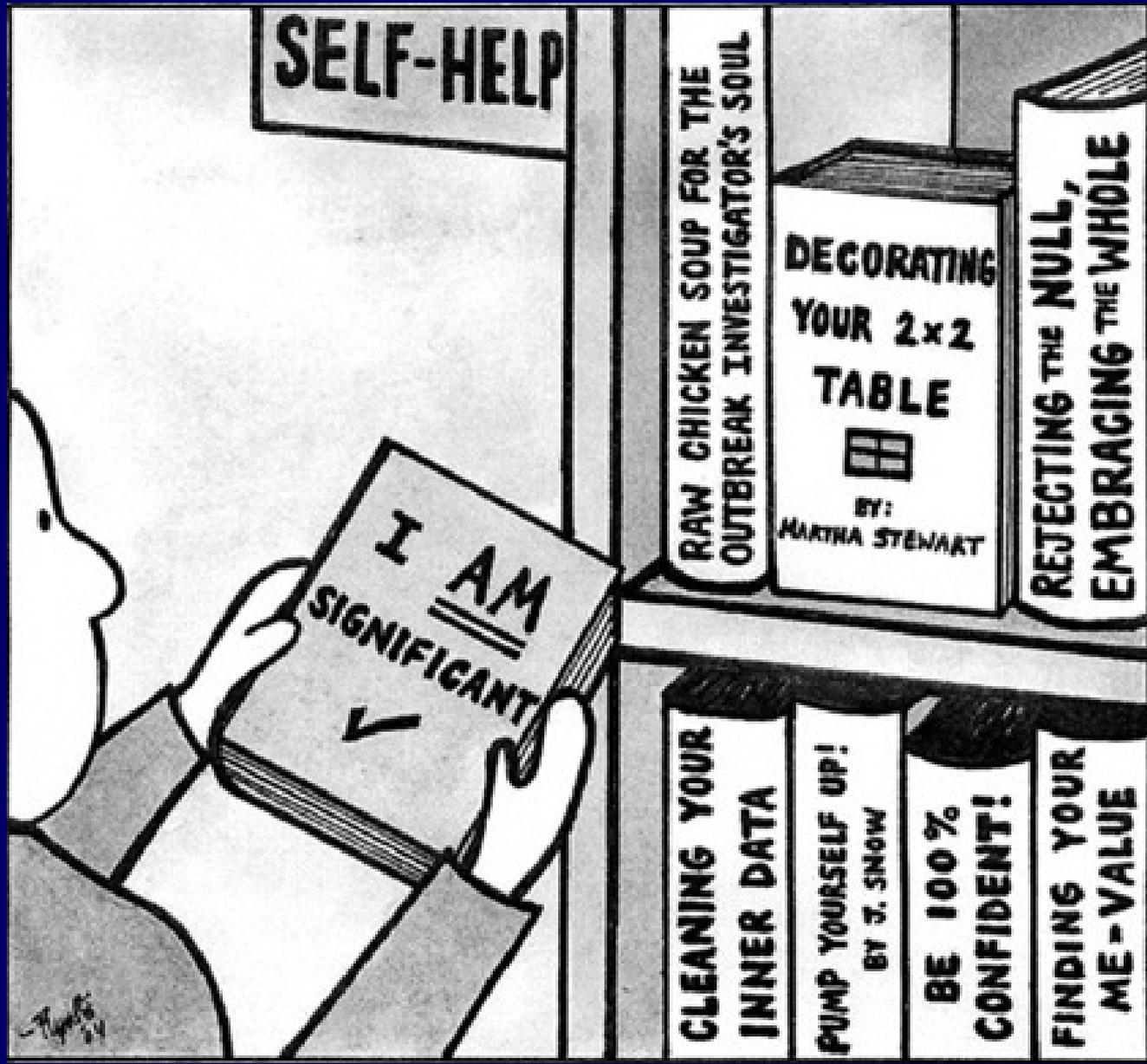
When the p-value is less than 0.05 (or 0.01) there is only a small probability that the result would have occurred when the null hypothesis was true

→ In that case, we *reject the null hypothesis* (H_0) in favour of the alternative hypothesis (H_1)

Is it, or is it not significant?

☒ Usually not a good question

- How large is the treatment effect?
- Reader wants to know the uncertainty around a treatment effect, they need concrete information



SELF-HELP

**RAW CHICKEN SOUP FOR THE
OUTBREAK INVESTIGATOR'S SOUL**

**DECORATING
YOUR 2x2
TABLE**



**BY:
MARTHA STEWART**

**REJECTING THE NULL,
EMBRACING THE WHOLE**

**I AM
SIGNIFICANT**



**CLEANING YOUR
INNER DATA**

**PUMP YOURSELF UP!
BY J. SNOW**

**BE 100%
CONFIDENT!**

**FINDING YOUR
ME-VALUE**

Summary

- ☒ Sample vs. population
- ☒ SD vs. SE(mean)
- ☒ Point estimates (population mean) vs. interval estimates (95% CI of the mean)
- ☒ Hypothesis testing using:
 - p-values (reject or accept H_0)
 - CI (more clinical information)