

Mathematical Statistics

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Lecture II, 26.02.2018

DESCRIPTIVE STATISTICS, PART II

Plan for today

1. Descriptive Statistics, part II:

- mode
- quantiles
- measures of variability
- measures of asymmetry
- the boxplot



Measures of central tendency – reminder

☐ *Classic:*

- *arithmetic mean*

☐ *Position (order, rank):*

- *median*
- **mode**
- **quartile**



Example 1 – cont.

<i>Grade</i>	<i>Number</i>	<i>Frequency</i>
2	59	31.89%
3	63	34.05%
3.5	33	17.84%
4	14	7.57%
4.5	10	5.41%
5	6	3.24%
Total	185	100%

[Mode – examples](#)
[Quartiles – example](#)
[Variance – example](#)



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Example 3 – cont.

<i>Interval</i>	<i>Class mark</i>	<i>Number</i>	<i>Frequency</i>	<i>Cumulative number</i> cn_i	<i>Cumulative frequency</i> cf_i
(30,40]	35	11	0,11	11	0,11
(40,50]	45	23	0,23	34	0,34
(50,60]	55	33	0,33	67	0,67
(60,70]	65	12	0,12	79	0,79
(70,80]	75	6	0,06	85	0,85
(80,90]	85	8	0,08	93	0,93
(90,100]	95	3	0,03	96	0,96
(100,110]	105	2	0,02	98	0,98
(110,120]	115	2	0,02	100	1
Total		100	1		

[Mode – example](#)

[Quartiles – example](#)

[Variance – example](#)

Mode

Mode

the value that appears most often

□ for grouped data:

Mo = most frequent value

□ for grouped class interval data:

$$Mo \cong c_L + \frac{n_{Mo} - n_{Mo-1}}{(n_{Mo} - n_{Mo-1}) + (n_{Mo} - n_{Mo+1})} \cdot b$$

where

n_{Mo} – number of elements in mode's class,

c_L, b – analogous to the median

Mode – examples

Example 1:

$$Mo = 3$$

[Example 1 –
cont.](#)

Example 3:

[Example 3 –
cont.](#)

the mode's interval is (50,60], with 33 elements

$$n_{Mo} = 33, c_L = 50, b = 10, n_{Mo-1} = 23, n_{Mo+1} = 12$$

$$Mo \cong 50 + \frac{33 - 23}{(33 - 23) + (33 - 12)} \cdot 10 \approx 53.23$$



Which measure should we choose?

- ☐ Arithmetic mean: for typical data series (single max, monotonous frequencies)
- ☐ Mode: for typical data series, grouped data (the lengths of the mode's class and neighboring classes should be equal)
- ☐ Median: no restrictions. The most robust (in case of outlier observations, fluctuations etc.)



Quantiles, quartiles

- p -th quantile (quantile of rank p): number such that the fraction of observations less than or equal to it is at least p , and values greater than or equal to it at least $1-p$

- Q_1 : first quartile = quantile of rank $\frac{1}{4}$
- Second quartile = median
= quantile of rank $\frac{1}{2}$
- Q_3 : Third quartile = quantile of rank $\frac{3}{4}$



Quantiles – cont.

Empirical quantile of rank p :

$$Q_p = \begin{cases} \frac{X_{np:n} + X_{np+1:n}}{2} & np \in Z \\ X_{[np]+1:n} & np \notin Z \end{cases}$$



Quartiles – cont.

- Quartiles for $p = 1/4$ and $p = 3/4$.
- For grouped class interval data – analogous to the median

$$Q_k \cong c_L + \frac{b}{n_{M_k}} \left(\frac{k \cdot n}{4} - \sum_{i=1}^{M_k-1} n_i \right)$$

for $k=1$ or 3

where M_1, M_3 – number of the quartile's class

b – length of quartile class interval

c_L – lower end of the quartile class interval



Quartiles – examples

Example 1:

[Example1 –
cont.](#)

$$185 \cdot \frac{1}{4} = 46.25 \quad 185 \cdot \frac{3}{4} = 138.75$$

so

$$Q_1 = X_{47:185} = 2, \quad Q_3 = X_{139:185} = 3.5$$

Example 3:

[Example 3 –
cont.](#)

$$100 \cdot \frac{1}{4} = 25 \quad 100 \cdot \frac{3}{4} = 75$$

$$M_1 = 2, \quad M_3 = 4 \quad \text{so}$$

$$Q_1 \cong 40 + \frac{10}{23}(25 - 11) \approx 46,09 \quad Q_3 \cong 60 + \frac{10}{12}(75 - 67) \approx 66,67$$



Variability measures

□ Classical measures

- variance, standard deviation
- average (absolute) deviation
- coefficient of variation

□ Measures based on order statistics

- range
- interquartile range
- *quartile deviation*
- *coefficients of variation (based on order stats)*
- *median absolute deviation*



Measures based on order statistics

□ Range

the most simple measure, does not take into account anything but the extreme values

$$r = X_{n:n} - X_{1:n}$$

□ Inter Quartile Range (midspread, middle fifty)

more robust than the range

$$IQR = Q_3 - Q_1$$

length of the interval that covers the middle 50% observations

may be further used to calculate **quartile deviation** $Q = IQR/2$, and coefficients of variation $V_Q = Q/Med$ or $V_{Q_1Q_3} = IQR/(Q_3 + Q_1)$ (quartile variation coefficient) or the typical range: $[Med - Q, Med + Q]$



Range, interquartile range – examples

Example 1:

$$r = 5 - 2 = 3,$$

$$IQR = 3.5 - 2 = 1.5$$

Example 3:

$$r \cong 120 - 30 = 90$$

(in reality $118,9 - 32,45 = 86,45$)

$$IQR \cong 66,67 - 46,09 = 20,58$$



Classical measures of dispersion

Variance

□ raw data $\hat{S}^2 = \frac{1}{n} \sum_{i=1}^n (X_i - \bar{X})^2 = \frac{1}{n} \sum_{i=1}^n X_i^2 - (\bar{X})^2$

□ grouped data

$$\hat{S}^2 = \frac{1}{n} \sum_{i=1}^k n_i (X_i - \bar{X})^2 = \frac{1}{n} \sum_{i=1}^k n_i X_i^2 - (\bar{X})^2$$

□ grouped class interval data

$$\hat{S}^2 \cong \frac{1}{n} \sum_{i=1}^k n_i (\bar{c}_i - \bar{X})^2 = \frac{1}{n} \sum_{i=1}^k n_i \bar{c}_i^2 - (\bar{X})^2$$

+ Sheppard's correction

$$\bar{S}^2 \cong \hat{S}^2 - \frac{c^2}{12}$$

c=length of
class
interval (for
equal
intervals)

in general

$$\bar{S}^2 \cong \hat{S}^2 - \frac{1}{12n} \sum_{i=1}^k n_i (c_i - c_{i-1})^2$$



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Variance – examples

[Example 1 – cont.](#)

Example 1:

$$\hat{S}^2 \approx \frac{1}{185} \left((2 - 2.99)^2 \cdot 59 + (3 - 2.99)^2 \cdot 63 + (3.5 - 2.99)^2 \cdot 33 + (4 - 2.99)^2 \cdot 14 + (4.5 - 2.99)^2 \cdot 10 + (5 - 2.99)^2 \cdot 6 \right) \approx 0.69$$

Example 3:

[Example 3 – cont.](#)

$$\hat{S}^2 \approx \frac{1}{100} \cdot \left((35 - 58.7)^2 \cdot 11 + (45 - 58.7)^2 \cdot 23 + (55 - 58.7)^2 \cdot 33 + (65 - 58.7)^2 \cdot 12 + (75 - 58.7)^2 \cdot 6 + (85 - 58.7)^2 \cdot 8 + (95 - 58.7)^2 \cdot 3 + (105 - 58.7)^2 \cdot 2 + (115 - 58.7)^2 \cdot 2 \right) = 331.31$$

$$\bar{S}^2 = 331.31 - \frac{10^2}{12} \approx 322.98$$

in reality

$$\hat{S}^2 = 333.85$$

distribution not normal or sample too small for Sheppard's correction – larger errors from small sample size than from class grouping.



Standard deviation

In the same units as the initial variable

$$\hat{S} = \sqrt{\hat{S}^2}, \quad \bar{S} = \sqrt{\bar{S}^2}$$

Example 1:

$$\hat{S} \approx 0.83 \text{ [grade]}$$

Example 3:

$$\hat{S} \approx 18.2 \text{ [m}^2 \text{]}$$



Average (absolute) deviation, mean deviation

Nowadays seldom used. Simple calculations.

for raw data

$$d = \frac{1}{n} \sum_{i=1}^n |X_i - \bar{X}|$$

etc...

We have: $d < S$



Coefficient of variation (classical)

For comparisons of the same variable across populations or different variables for the same population

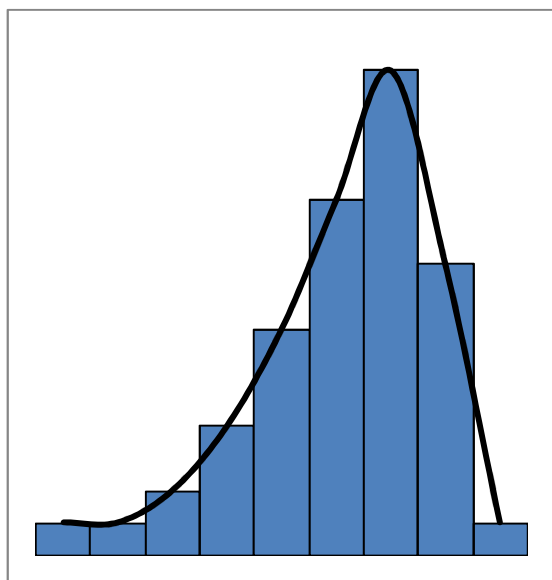
$$V_s = \frac{\hat{S}}{\bar{X}} (\cdot 100\%),$$

$$\text{or } V_d = \frac{d}{\bar{X}} (\cdot 100\%)$$



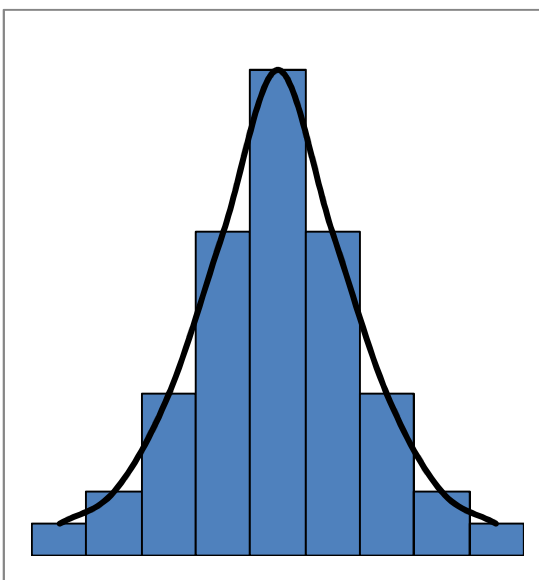
Skewness (asymmetry)

left
(negative)



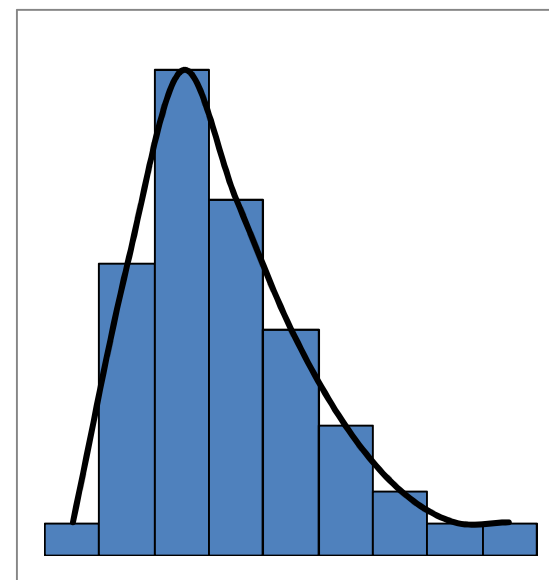
$$\bar{X} < Med < Mo$$

symmetry
(zero)



$$\bar{X} = Med = Mo$$

right
(positive)



$$\bar{X} > Med > Mo$$

(typical order)



Measures of asymmetry

□ Skewness

$$A = \frac{M_3}{\hat{S}^3}$$

where M_3 is the third central moment

□ Skewness coefficient

$$A_1 = \frac{\bar{X} - Mo}{\hat{S}} \quad \text{or} \quad A_1 = \frac{\bar{X} - Med}{\hat{S}}$$

□ Quartile skewness coefficient

$$A_2 = \frac{Q_3 - 2Med + Q_1}{Q_3 - Q_1}$$

measures skewness for the middle 50% observations only



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Interpretation

- ❑ positive values= positive asymmetry (right skewed distribution)
- ❑ negative values = negative asymmetry (left skewed distribution)
- ❑ For the skewness coefficient (with the median) and the quartile skewness coefficient the strength of asymmetry (absolute value):
 - ❑ 0 – 0.33: weak
 - ❑ 0.34 – 0.66: medium
 - ❑ 0.67 – 1: strong



Asymmetry – examples

Example 1:

$$A \approx 0.41$$

$$A_1 = \frac{2.99 - 3}{0.83} \approx -0.01 \text{ (Med)}$$

$$A_1 = \frac{2.99 - 3}{0.83} \approx -0.01 \text{ (Mo)}$$

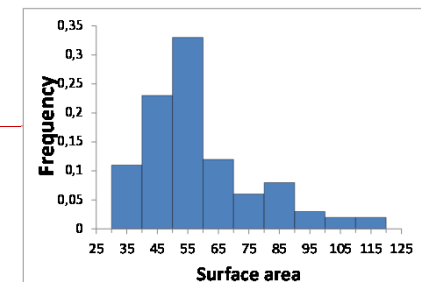
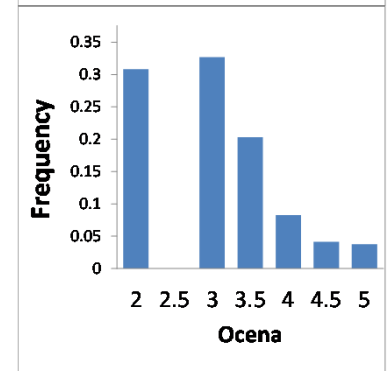
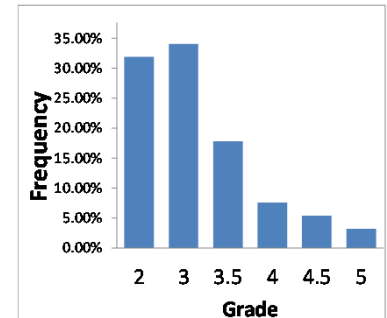
$$A_2 = \frac{3.5 - 2 \cdot 3 + 2}{3.5 - 2} = -\frac{1}{3}$$

Example 3:

$$A \cong 1.15,$$

$$A_1 \cong \frac{58.7 - 53.23}{18.2} \approx 0.3 \text{ (Mo) or } A_1 = \frac{58.7 - 54.85}{18.2} \approx 0.24 \text{ (Med)}$$

$$A_2 \cong \frac{66.67 - 2 \cdot 54.85 + 46.09}{66.67 - 46.09} \approx 0.15$$



Boxplot (Box and whisker plot)

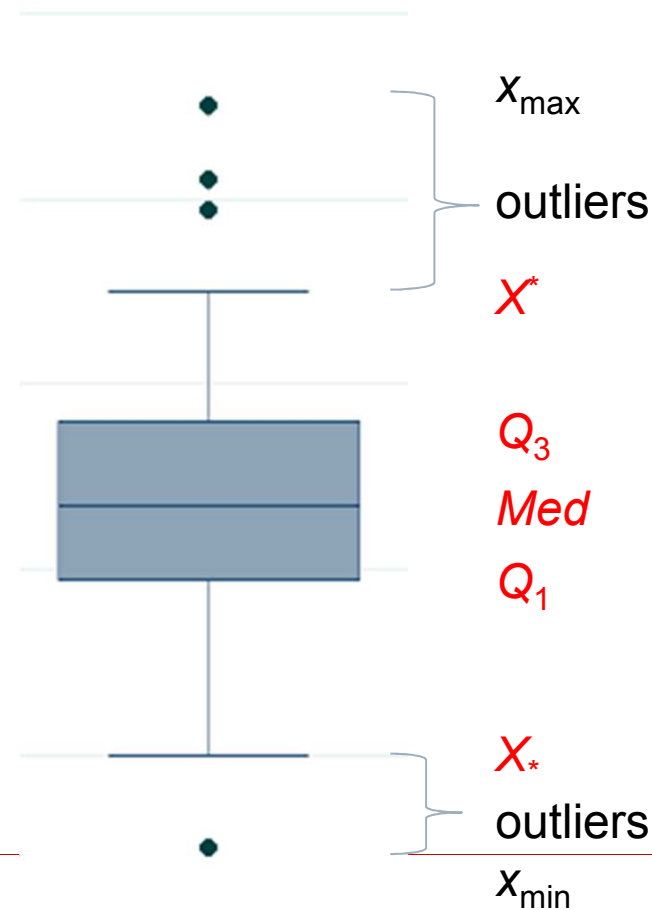
Allows to compare two (or more) populations

$$X_* = \min\{X_i : X_i \in [Q_1 - \frac{3}{2}IQR, Q_1]\}$$

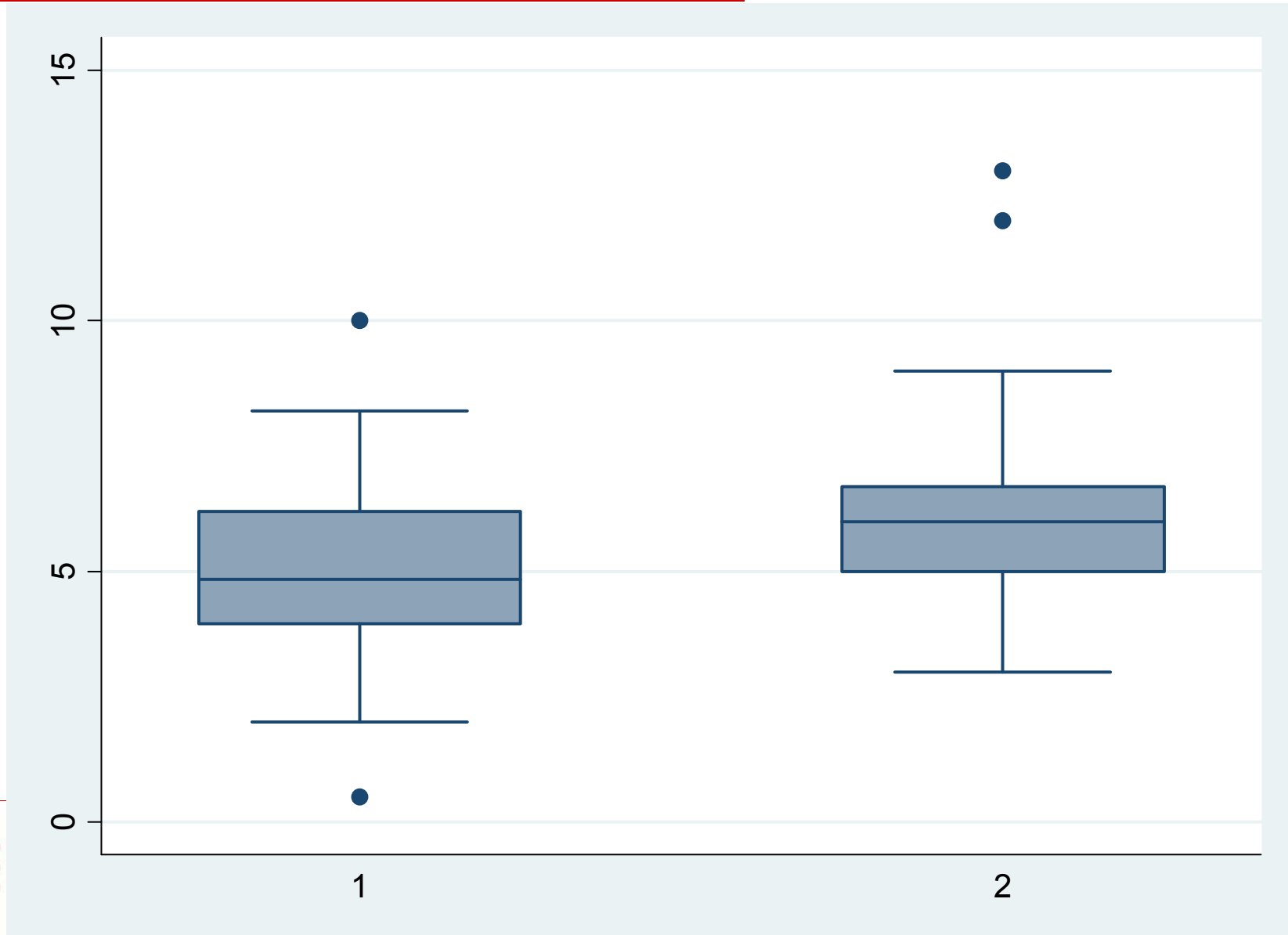
$$X^* = \max\{X_i : X_i \in [Q_3, Q_3 + \frac{3}{2}IQR]\}$$

outliers:

$$x < X_* \text{ or } x > X^*$$



Boxplot – example of comparison



Examples (1)

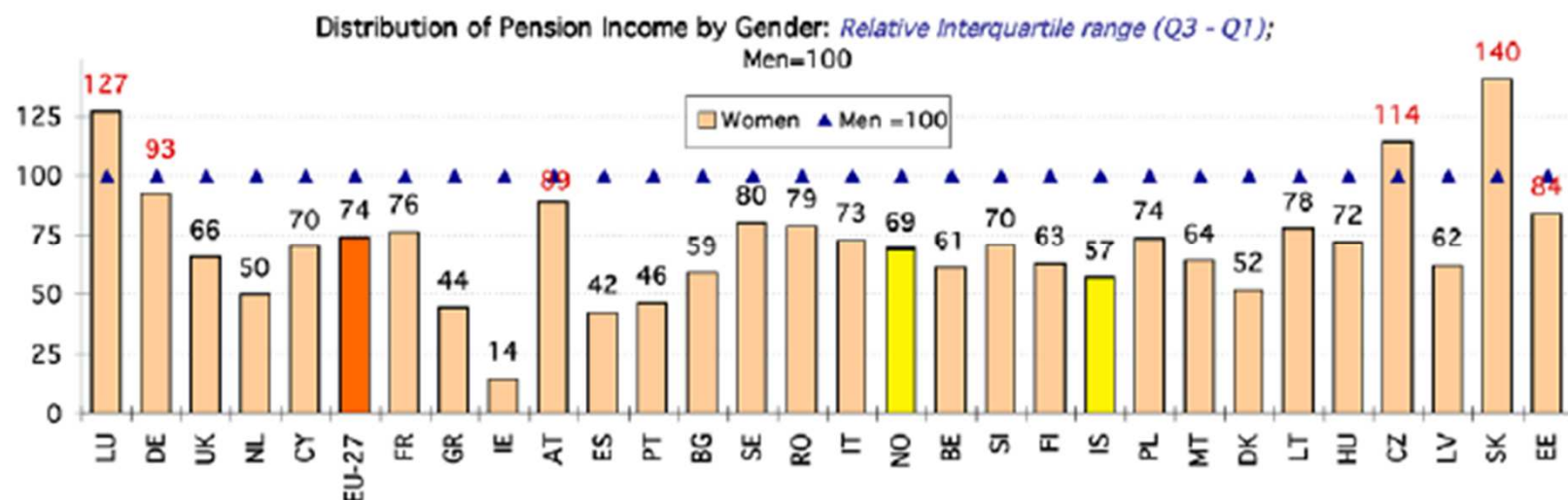
TABL. 16. CHARAKTERYSTYKI OPISOWE CEN DETALICZNYCH NIEKTÓRYCH TOWARÓW ŻYWNOŚCIOWYCH
W CZERWCU 2009 R.

DESCRIPTIVE CHARACTERISTICS OF RETAIL PRICES OF SELECTED FOODSTUFFS IN JUNE 2009

Towary Goods	Średnia cena w złotych Average price in zł				Współczynnik zmienności w % Variability coefficient in %	
	najniższa lowest	najwyższa highest	krajowa national		ogółem total	między- woje- wódzkiej interview- vodship
	województwo voivodship		arytme- tyczna arithmetic	mediana median		
Chleb pszenno-żytni - za 0,5 kg Wheat-rye bread - per 0.5 kg	1,59 świętokrzyskie	2,19 śląskie	1,88	1,86	19,6	7,6
Mąka pszenna - za 1 kg Wheat flour - per kg	1,74 lubuskie	2,19 świętokrzyskie	1,93	1,99	17,5	4,9
Kasza jęczmienna - za 0,5 kg Pearl-barley - per 0.5 kg	1,54 podkarpackie	2,13 mazowieckie	1,82	1,80	32,3	10,0
Mięso wołowe z kością (rostbief) - za 1 kg Beef meat, bone-in (roast beef) - per kg	17,93 łódzkie	23,51 kujawsko-pomorskie	19,84	19,50	15,9	6,8
Mięso wołowe bez kości (z udźca) - za 1 kg Beef meat, boneless (gammon) - per kg	21,89 małopolskie	29,63 zachodniopomorskie	26,15	25,80	15,4	9,5

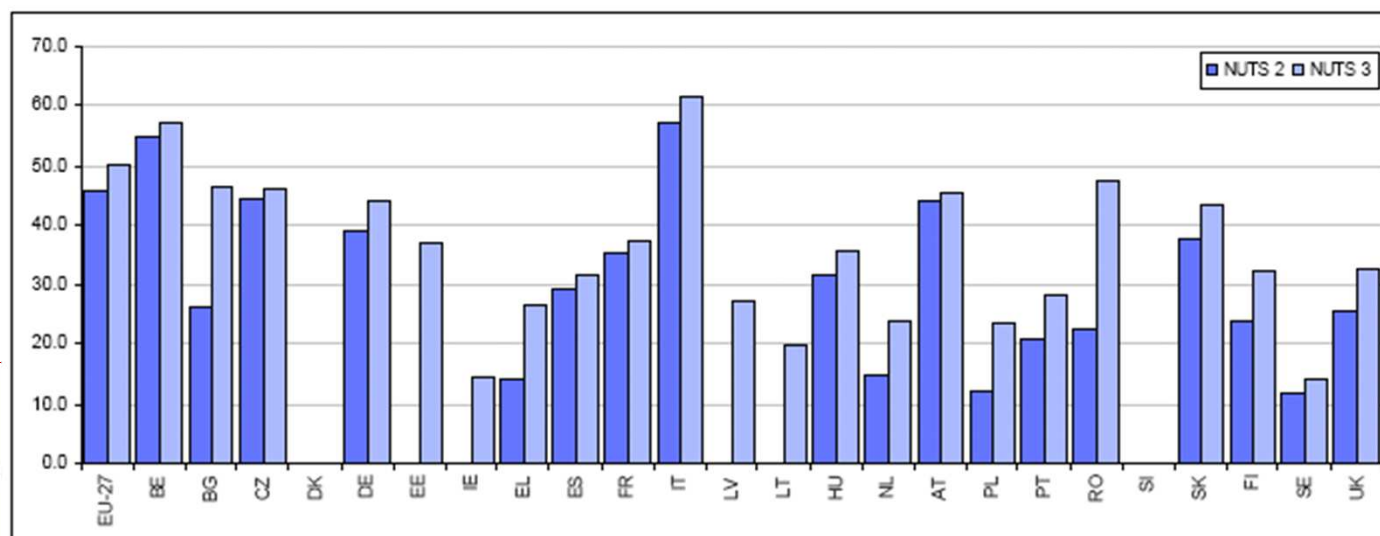


Examples (2)



Dispersion (coefficient of variability) of unemployment rates 2006

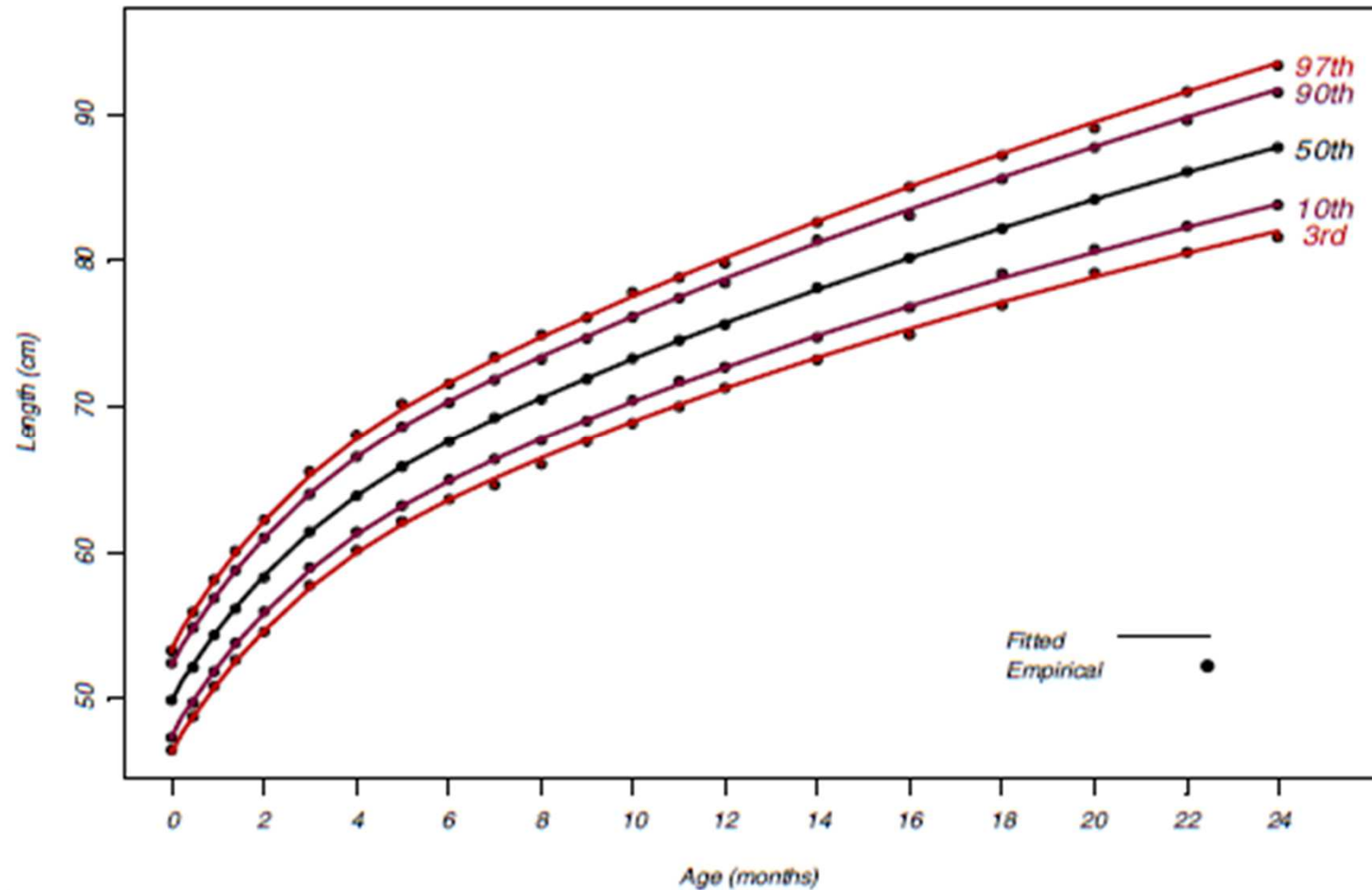
Source: European Commission



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Examples (3)

Growth charts

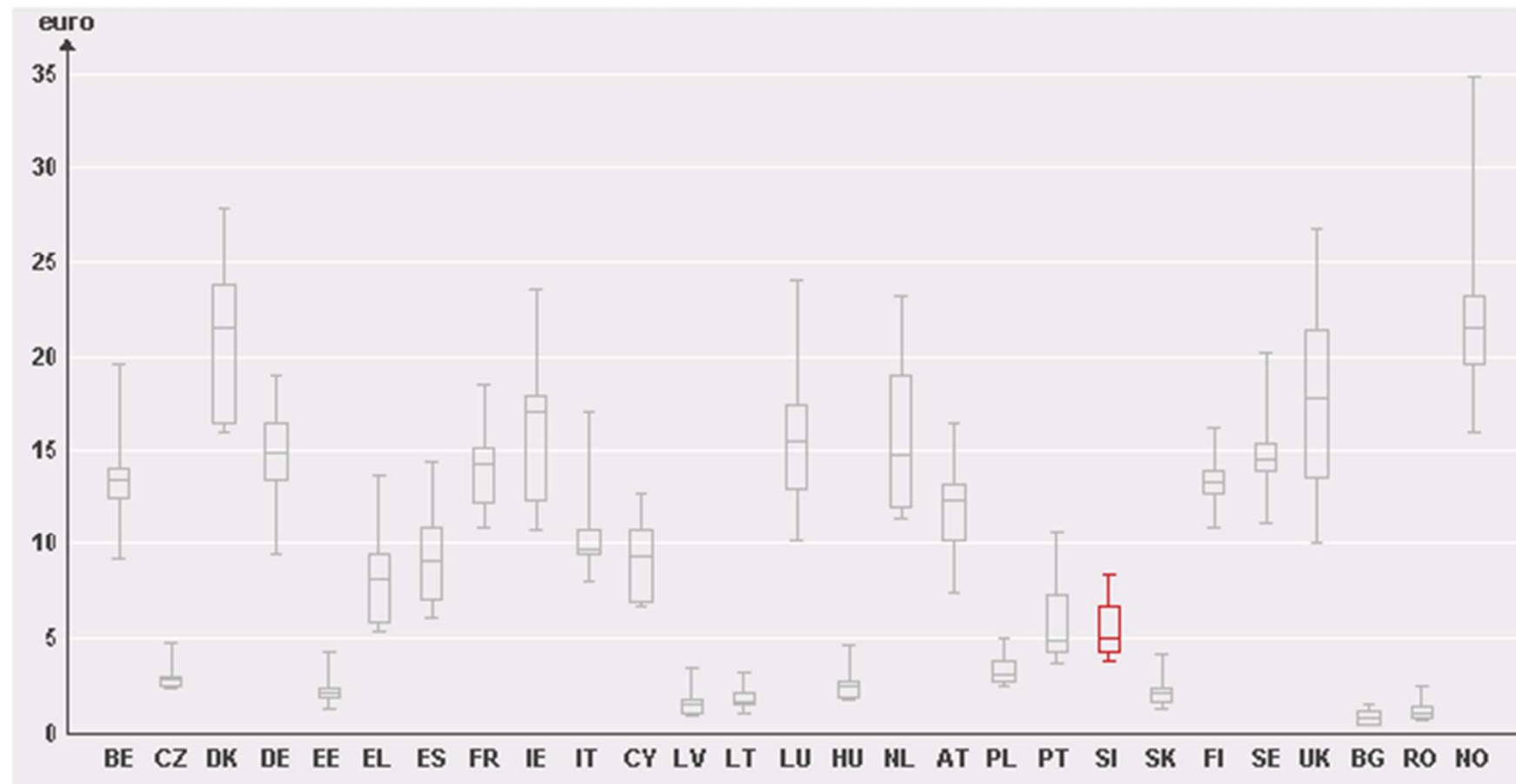


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Source: WHO

Examples (4)

Gross hourly earnings, 2002



Source: European Commission 2005



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