

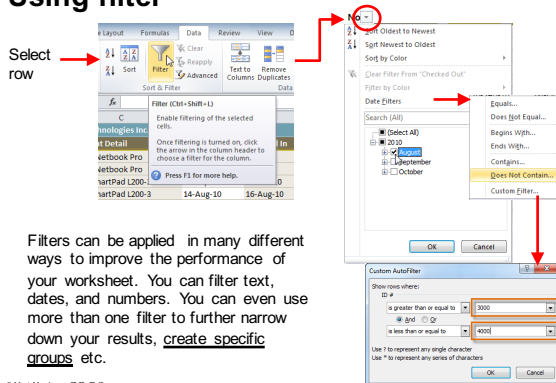


Using filter

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Using filter

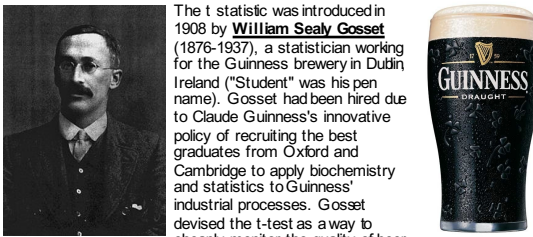
Select row



Filters can be applied in many different ways to improve the performance of your worksheet. You can filter text, dates, and numbers. You can even use more than one filter to further narrow down your results, create specific groups etc.

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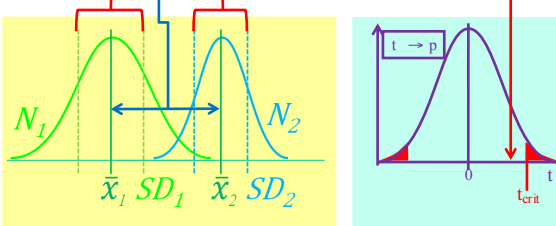
Are means of two sets of data really different? Student's t-test



The t statistic was introduced in 1908 by **William Sealy Gosset** (1876-1937), a statistician working for the Guinness brewery in Dublin Ireland ("Student" was his pen name). Gosset had been hired due to Claude Guinness's innovative policy of recruiting the best graduates from Oxford and Cambridge to apply biochemistry and statistics to Guinness' industrial processes. Gosset devised the t-test as a way to cheaply monitor the quality of beer.

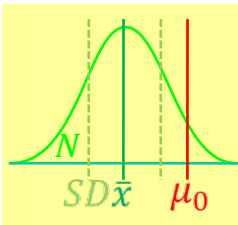
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t-statistik kahe keskmise võrdlemiseks

$$t = \frac{\text{difference of means}}{\text{difference of variability}} = \frac{x_1 - x_2}{SE(x_1 - x_2)}$$


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One-sample t-test: Student's t-test for comparison of mean with standard



Whether the sample mean differs from a standard μ_0 ?

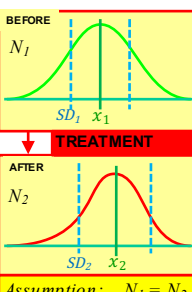
$$t = \frac{\bar{x} - \mu_0}{\frac{SD}{\sqrt{N}}}$$

$$df = N - 1$$

$t = \text{ABS}(X - M_0) / (SD / \text{SQRT}(N))$
 $p = \text{TDIST}(t; (N-1); 2)$
 $p = \text{TDIST}(\text{ABS}(X - M_0) / (SD / \text{SQRT}(N)); (N-1); 2)$

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Paired t-test: Compares (before and after) means of two paired groups



Used to compare means on the same or related subject over time or in differing circumstances; subjects are often tested in a before-after situation.

Given two paired sets X_1 and X_2 of N measured values, the paired t-test determines if they differ from each other in a significant way.

$$t = \frac{\bar{x}_d}{\frac{SD_d}{\sqrt{N}}}$$

Where:

$$x_d = x_1 - x_2$$

$$x_d = \frac{\sum x_1 - x_2}{N}$$

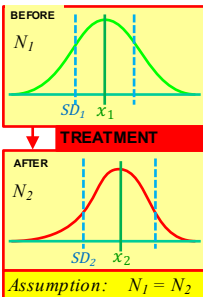
$$SD_d = \sqrt{\frac{(x_d - x_d)^2}{N - 1}}$$

Assumption: $N_1 = N_2$

$$df = N - 1$$

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Paired t-test: Compares (before and after) means of two paired groups



Function:
=T.TEST(arrayX1,arrayX2,tails,type)
=TTEST(arrayX1,arrayX2,tails,type)

Arguments:

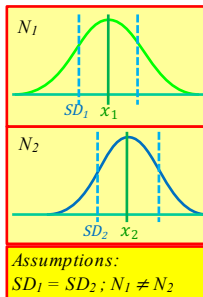
- Array1 - The first data set; X1.
- Array2 - The second data set; X2.
- Tails - Specifies the number of distribution tails
 - If = 1, one-tailed distribution is used.
 - If = 2, two-tailed distribution is used.
- **Type = 1 (Paired)**

Returns the probability (p) associated with a Student's t-Test.

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Two-sample unpaired t-test assuming equal variance (homoscedastic t-test)



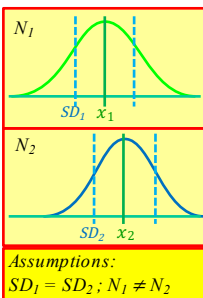
$$t = \frac{|x_1 - x_2|}{\sqrt{\left[\frac{N_1 + N_2}{N_1 \times N_2} \right] \times \left[\frac{(N_1 - 1) \times SD_1^2 + (N_2 - 1) \times SD_2^2}{N_1 + N_2 - 2} \right]}}$$

$$df = N_1 + N_2 - 2$$

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Two-sample unpaired t-test assuming equal variance (homoscedastic t-test)



Function:
=T.TEST(arrayX1,arrayX2,tails,type)
=TTEST(arrayX1,arrayX2,tails,type)

Arguments:

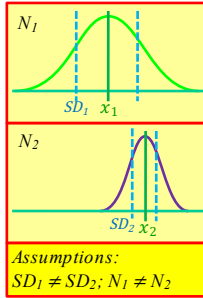
- Array1 - The first data set; X1.
- Array2 - The second data set; X2.
- Tails - Specifies the number of distribution tails
 - If = 1, one-tailed distribution is used.
 - If = 2, two-tailed distribution is used.
- **Type = 2 (Two sample equal variance (homoscedastic))**

Returns the probability (p) associated with a Student's t-Test.

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Two-sample unpaired t-test assuming unequal variance (heteroscedastic)



if the variance in the two groups are extremely different. e.g. the two samples are of very different sizes

$$t = \frac{|x_1 - x_2|}{\sqrt{\frac{SD_1^2}{N_1} + \frac{SD_2^2}{N_2}}}$$

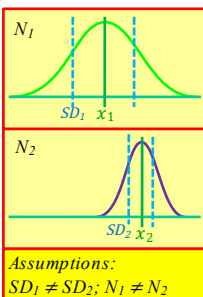
$$df = \frac{\left(\frac{SD_1^2}{N_1} + \frac{SD_2^2}{N_2} \right)^2}{\left(\frac{SD_1^2}{N_1} \right)^2 + \left(\frac{SD_2^2}{N_2} \right)^2} - 2$$

round up to integer

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Two-sample unpaired t-test assuming unequal variance (heteroscedastic)



Function:
=T.TEST(arrayX1,arrayX2,tails,type)
=TTEST(arrayX1,arrayX2,tails,type)

Arguments:

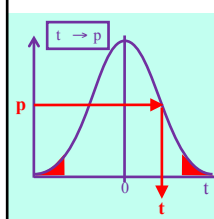
- Array1 - The first data set; X1.
- Array2 - The second data set; X2.
- Tails - Specifies the number of distribution tails
 - If = 1, one-tailed distribution is used.
 - If = 2, two-tailed distribution is used.
- **Type = 3 (Two sample unequal variance (heteroscedastic))**

Returns the probability (p) associated with a Student's t-Test.

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Obtaining t-value from p-value



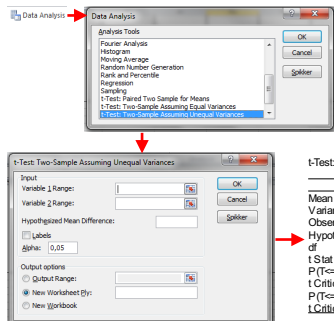
Function:
=T.INV(probability;deg_freedom)

returns the t-value of the Student's t-distribution as a function of the probability and the degrees of freedom

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t-test using Data Analysis Package



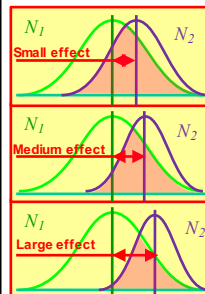
t-Test: Two-Sample Assuming Unequal Variances

	x	y
Mean	14,77	12,94
Variance	6,67	6,30
Observations	63	63
Hypothesized Mean Difference	0	
df	124	
t Stat	4,03	
P(T<=t) one-tail	0,00	
t Critical one-tail	1,66	
P(T<=t) two-tail	0,00	
t Critical two-tail	1,98	

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Effect size for difference of mean

The standardized effect size - Cohen's d:



Effect size is a standardized measure of the difference between two (or more) group means

$$d = \frac{x_1 - x_2}{SD_{1,2}}$$

$$SD_{1,2} = \sqrt{\frac{(n_1 - 1)SD_1^2 + (n_2 - 1)SD_2^2}{n_1 + n_2 - 2}}$$

Verbal Description	Effect Size (d)	Populations overlap
Small	0,20	85%
Medium	0,50	67%
Large	0,80	53%

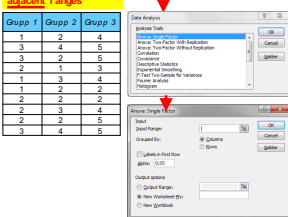
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ANOVA - Analysis Of Variance

Dispersioonanalüüs

NB! Data: two or more adjacent ranges



Anova: Single Factor

Groups	Count	Sum	Average	Variance
Grupp 1	10	20	2,0	0,67
Grupp 2	10	25	2,5	0,84
Grupp 3	10	30	3,0	1,43

ANOVA

Source of Variation	SS	df	MS	F	P-value	t-crit
Between Groups	19,4	2	9,70	9,56	0,00	3,35
Within Groups	27,4	27	1,01			
Total	46,8	29				

- Purpose of analysis of variance (ANOVA) is to test for significant differences between means.

- Excel: Data analysis - ANOVA

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Scatterplot

Hajuvusdiagramm

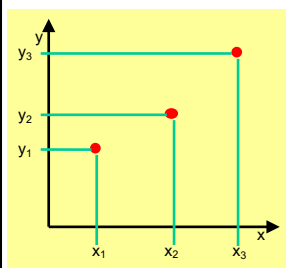
Relation of parameters

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Scatterplot

Hajuvusdiagramm



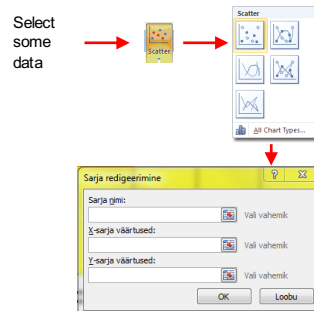
- Scatterplot graphs are used to show trends in data.
- The data is displayed as a collection of points, each having the value of one variable determining the position on the horizontal axis (x) and the value of the other variable determining the position on the vertical axis (y).

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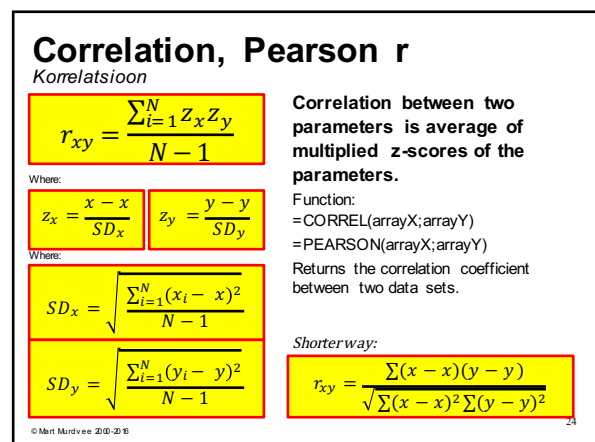
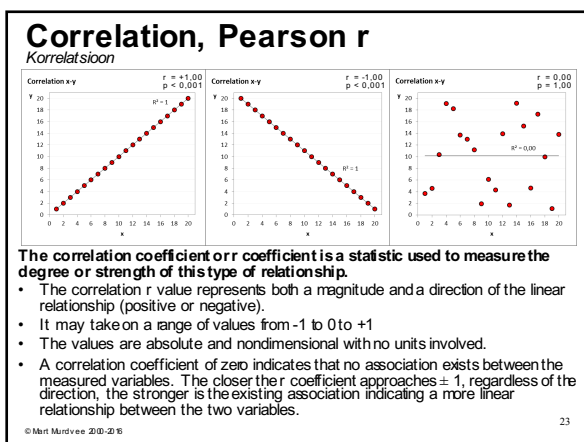
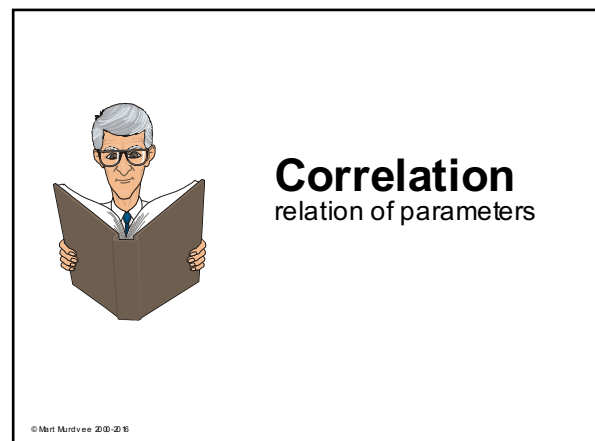
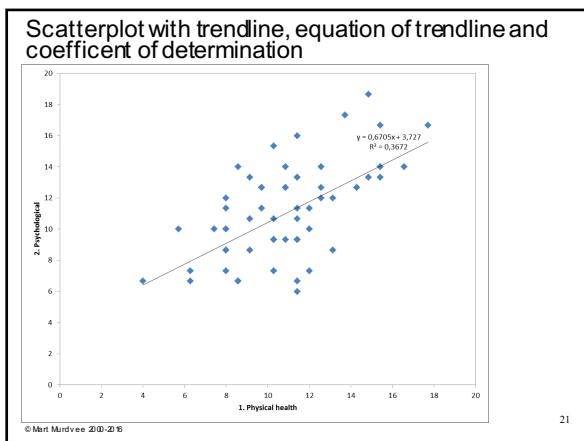
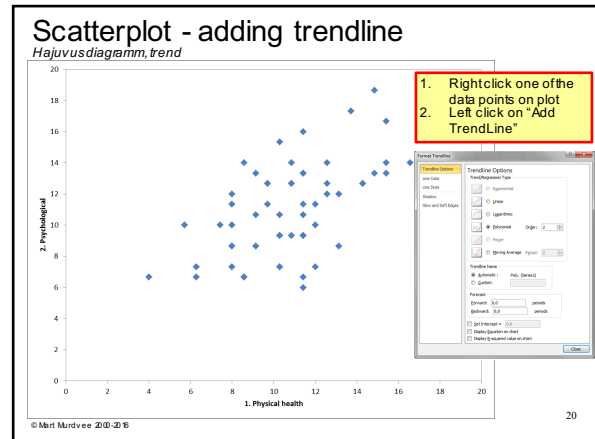
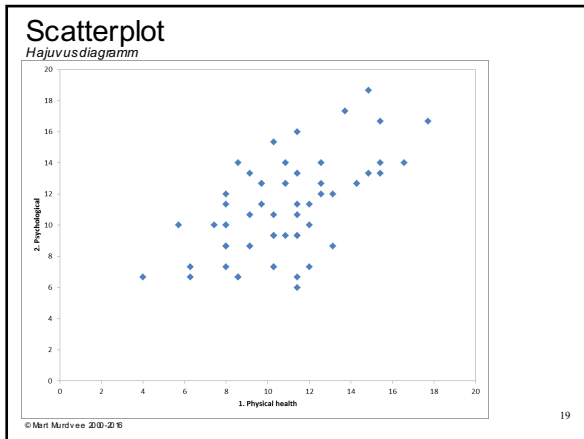
Scatterplot

Hajuvusdiagramm



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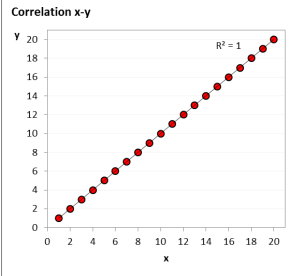
18



Correlation

No	x	y
N1	1	1
N2	2	2
N3	3	3
N4	4	4
N5	5	5
N6	6	6
N7	7	7
N8	8	8
N9	9	9
N10	10	10
N11	11	11
N12	12	12
N13	13	13
N14	14	14
N15	15	15
N16	16	16
N17	17	17
N18	18	18
N19	19	19
N20	20	20

$r = 1.00$
 $p = 0.00$
 $Mx = 10.5$
 $My = 10.5$
 $SDx = 5.9$
 $SDy = 5.9$



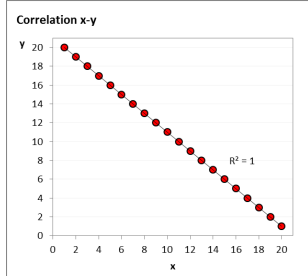
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Correlation

No	x	y
N1	1	20
N2	2	19
N3	3	18
N4	4	17
N5	5	16
N6	6	15
N7	7	14
N8	8	13
N9	9	12
N10	10	11
N11	11	10
N12	12	9
N13	13	8
N14	14	7
N15	15	6
N16	16	5
N17	17	4
N18	18	3
N19	19	2
N20	20	1

$r = -1.00$
 $p = 0.00$
 $Mx = 10.5$
 $My = 10.5$
 $SDx = 5.9$
 $SDy = 5.9$



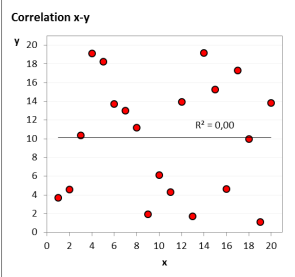
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Correlation

No	x	y
N1	1	3.7
N2	2	4.6
N3	3	10.3
N4	4	19.1
N5	5	18.3
N6	6	13.7
N7	7	13.0
N8	8	11.2
N9	9	1.9
N10	10	6.1
N11	11	4.3
N12	12	13.9
N13	13	1.7
N14	14	19.2
N15	15	15.3
N16	16	4.6
N17	17	17.3
N18	18	10.0
N19	19	1.1
N20	20	13.8

$r = 0.00$
 $p = 1.00$
 $Mx = 10.5$
 $My = 10.2$
 $SDx = 5.9$
 $SDy = 6.2$



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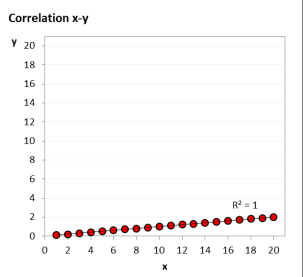
27

Correlation

NB! Correlation describes relative, not absolute change!

No	x	y
N1	1	0.1
N2	2	0.2
N3	3	0.3
N4	4	0.4
N5	5	0.5
N6	6	0.6
N7	7	0.7
N8	8	0.8
N9	9	0.9
N10	10	1.0
N11	11	1.1
N12	12	1.2
N13	13	1.3
N14	14	1.4
N15	15	1.5
N16	16	1.6
N17	17	1.7
N18	18	1.8
N19	19	1.9
N20	20	2.0

$r = 1.00$
 $p = 0.00$
 $Mx = 10.5$
 $My = 1.05$
 $SDx = 5.9$
 $SDy = 0.6$



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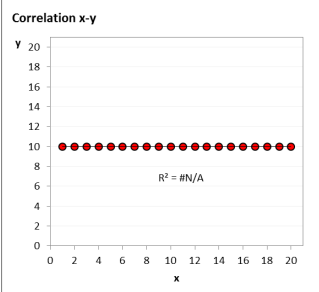
28

Correlation

NB! Correlation describes change! Therefore correlation with constant is indeterminable

No	x	y
N1	20	10.0
N2	19	10.0
N3	18	10.0
N4	17	10.0
N5	16	10.0
N6	15	10.0
N7	14	10.0
N8	13	10.0
N9	12	10.0
N10	11	10.0
N11	10	10.0
N12	9	10.0
N13	8	10.0
N14	7	10.0
N15	6	10.0
N16	5	10.0
N17	4	10.0
N18	3	10.0
N19	2	10.0
N20	1	10.0

$r = \#DIV/0!$
 $p = \#DIV/0!$
 $Mx = 10.5$
 $My = 10.0$
 $SDx = 5.9$
 $SDy = 0.0$



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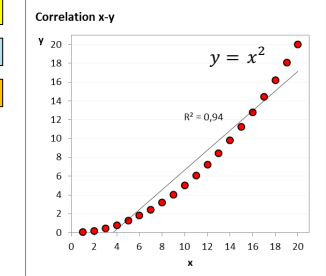
29

Correlation

NB! Correlation describes linear relationship! Therefore correlation is not the best way for detecting non-linear relationships.

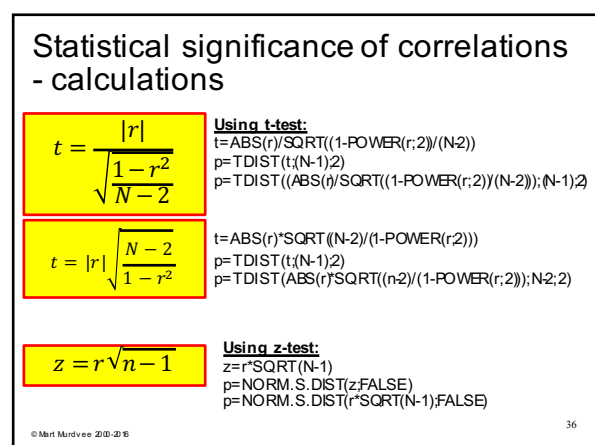
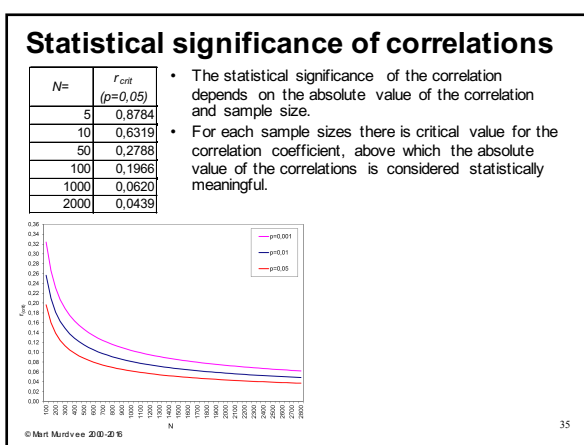
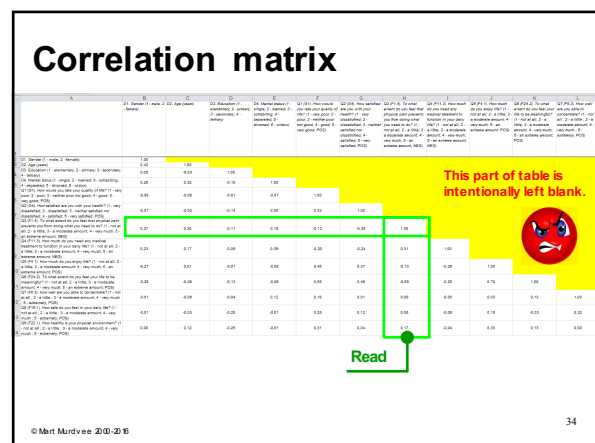
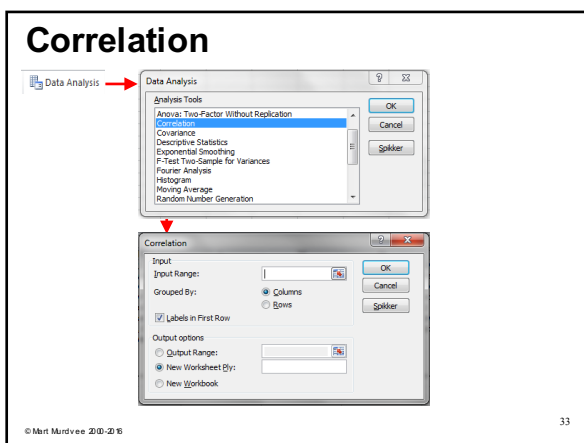
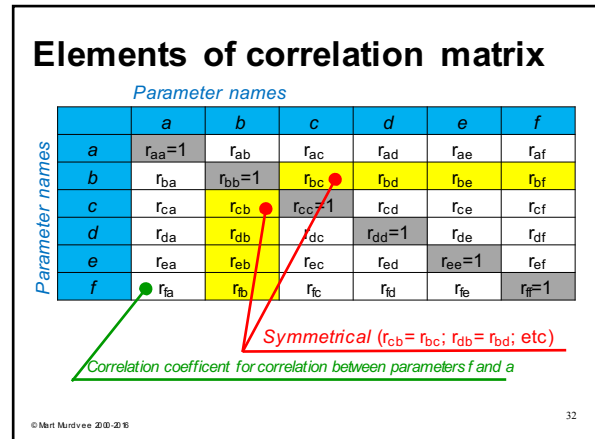
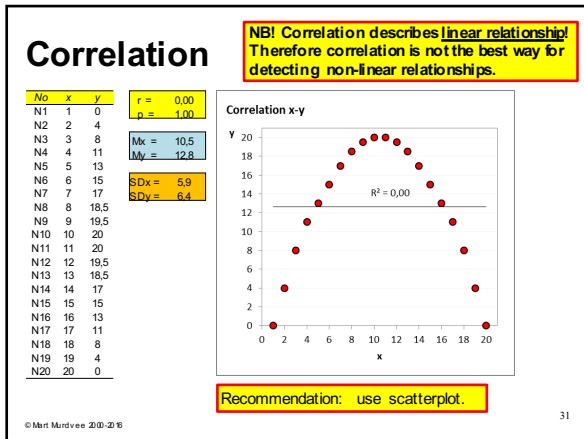
No	x	y
N1	1	0.1
N2	2	0.2
N3	3	0.5
N4	4	0.8
N5	5	1.3
N6	6	1.8
N7	7	2.5
N8	8	3.2
N9	9	4.1
N10	10	5.0
N11	11	6.1
N12	12	7.2
N13	13	8.5
N14	14	9.8
N15	15	11.3
N16	16	12.8
N17	17	14.5
N18	18	16.2
N19	19	18.1
N20	20	20.0

$r = 0.97$
 $p = 0.00$
 $Mx = 10.5$
 $My = 7.2$
 $SDx = 5.9$
 $SDy = 6.4$



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Calculating t-value from r

B2 = $f_x = \text{ABS}(YB2)/(\text{SQRT}((1-\text{POWER}(YB2,2))/(65-2)))$			
A	B	C	D
	D1. Gender (1 - male; 2 - female)	D2. Age (years)	D3. Education (1 - elementary; 2 - primary; 3 - secondary; 4 - tertiary)
1			
2	D1. Gender (1 - male; 2 - female)	#DIV/0!	
3	D2. Age (years)	3,71	
4	D3. Education (1 - elementary; 2 - primary; 3 - secondary; 4 - tertiary)	0,39	
5	D4. Marital status (1 - single; 2 - married; 3 - cohabiting; 4 - separated; 5 - divorced; 6 - widow)	2,35	

$$t = \frac{|r|}{\sqrt{\frac{1-r^2}{N-2}}}$$

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Calculating p-value from t

B2 = $f_x = \text{TDIST}(tB2,65-2,2)$			
A	B	C	D
	D1. Gender (1 - male; 2 - female)	D2. Age (years)	
1			
2	D1. Gender (1 - male; 2 - female)	#DIV/0!	0,00
3	D2. Age (years)	0,00	#DIV/0!
4	D3. Education (1 - elementary; 2 - primary; 3 - secondary; 4 - tertiary)	0,37	0,38

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Filtering significant correlations

B2 = $f_x = \text{IF}(pB2 > \text{Correlations}\$A\$1;"":YB2)$			
A	B	C	D
	D1. Gender (1 - male; 2 - female)	D2. Age (years)	
1			
2	D1. Gender (1 - male; 2 - female)	#DIV/0!	0,42
3	D2. Age (years)	0,42	#DIV/0!
4	D3. Education (1 - elementary; 2 - primary; 3 - secondary; 4 - tertiary)	-	-
5	D4. Marital status (1 - single; 2 - married; 3 - cohabiting; 4 - separated; 5 - divorced; 6 - widow)	-	-

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Generating text

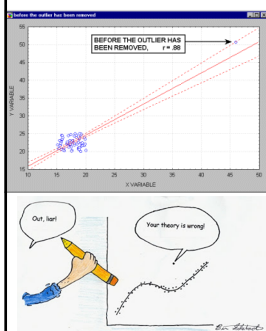
B2 = $f_x = \text{IF}(\text{Correlations}B2 < ":", "", \text{CONCATENATE}("r = ", \text{FIXED}(YB2,2), " (p = ", \text{FIXED}(pB2,2), ")")$					
A	B	C	D	E	F
	D1. Gender (1 - male; 2 - female)	D2. Age (years)	D3. Education (1 - elementary; 2 - primary; 3 - secondary; 4 - tertiary)	D4. Marital status (1 - single; 2 - married; 3 - cohabiting; 4 - separated; 5 - divorced; 6 - widow)	
1					
2	D1. Gender (1 - male; 2 - female)	#DIV/0!	r = 0,42 (p = 0,00)	-	r = 0
3	D2. Age (years)	r = 0,42 (p = 0,00)	#DIV/0!	-	r = 0
4	D3. Education (1 - elementary; 2 - primary; 3 - secondary; 4 - tertiary)	-	-	#DIV/0!	
5	D4. Marital status (1 - single; 2 - married; 3 - cohabiting; 4 - separated; 5 - divorced; 6 - widow)	r = 0,28 (p = 0,03)	r = 0,32 (p = 0,01)	-	

NB! The expression $p = 0,00$ must be later replaced with $p < 0,01$

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Outlier effect Eemalasuja efekt



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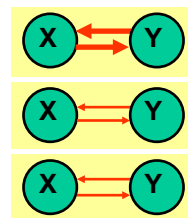
41

An outlier is a value that is very different from the other data in data set.

Outliers have a profound influence on the slope of the regression line and consequently on the value of the correlation coefficient.

- Identify outliers by examining a scatterplot of each important correlation.
- Useful: exclude values that are outside the range of ± 2 standard deviations
- Question: who or what is outlier?
 - Error?
 - Real very different person or event?

Strenght of correlation



Perfect	Perfektne	$\pm 1,0$
Strong	Tugev	$\pm 0,8$
Moderate	Mõõdukas	$\pm 0,6$
Weak	Nõrk	$\pm 0,2$
No relation	Seos puudub	$\pm 0,0$
Or		
Strong	+/- 0.7 ... +/- 1.0	
Moderate	+/- 0.5 ... +/- 0.70	
Weak	0 ... +/- 0.5	

In social sciences the correlation is considered meaningful if the absolute value of correlation is $\geq 0,2$ (Disputable!)

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Importance of small statistical effects

It is important to avoid the error of assuming that small statistical effects necessarily translate into small practical or public health effects. There are many circumstances in which statistically small effects have large practical consequences, especially when small effects accumulate over time and over large proportions of the relevant population.

Huesmann, Taylor 2005

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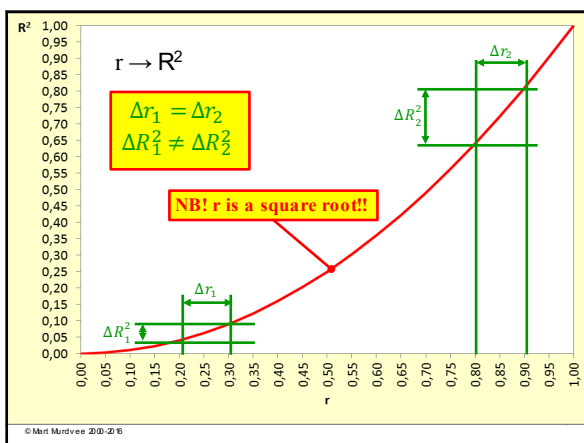


HELDUR MEERITS,
investor ja LHV nõukogu liige

Heldur Meerits: kas raha teeb riigikogu?
Postimees, 16.12.2012
<http://arvamus.postimees.ee/1076188/heldur-meerits-kas-raha-teeb-riigikogu/>
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Kui valimiskulud ja saadikukohad on kenasti ritta saanud, siis nendevahelise korrelatsiooni arvutamine on tänapäeval üllitlne. Tulemused on tabelis näha – ja need tulemused on jahmatavad, ehmatavad ning hirmutavad. Teatavasti võivad korrelatsioonikordaja arvutamisel tulemused olla vahemikus -1st kuni +1ni. Kui tulemus on +1 (ehk 100%), siis liiguvad kaks numbririda täielikult samas «rütmis». ... 1995. aastal oli korrelatsioon väga tagasihoidlik, kõigest 67%.

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Coefficient of Determination

Determinatsioonikordaja

r	R^2
1	100,0%
0,9	81,0%
0,8	64,0%
0,7	49,0%
0,6	36,0%
0,5	25,0%
0,4	16,0%
0,3	9,0%
0,2	4,0%
0,1	1,0%

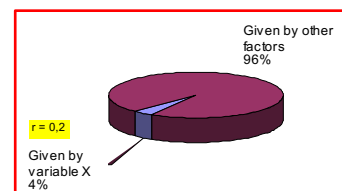
`=RSQ(arrayX,arrayY)`
returns the square of the Pearson product moment correlation coefficient

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is the square of the correlation between two variables (R^2).

It expresses the amount of common variation between the two variables.

Special case of effect size.



Effect size

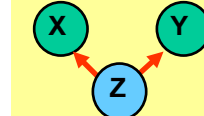
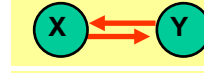
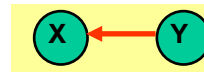
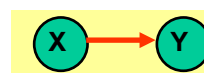
R^2	Character of size of effect
$0,01 < R^2 < 0,09$	Small
$0,09 < R^2 < 0,25$	Moderate
$0,25 \leq R^2$	Strong

Cohen, 1988

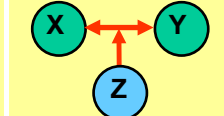
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Correlation does not imply causation!



- Establishing a correlation between two variables is not a sufficient condition to establish a causal relationship (in either direction).
- Correlation analysis measures a relationship or association; it does not define the explanation or its basis.
- Causes and explanations of the relationships must be found using other methods.



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Correlation does ...



Recent surveys shows that 100% of people who drinks water, dies.

That's a fact.

It is proven that the celebration of birthdays is healthy. Statistics show that those people who celebrate the most birthdays become the oldest.

Children with bigger feet spell better.

Height of humans is negatively correlated with hair length.

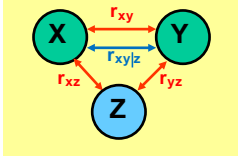
IMPORTANT WARNING for those who have been drawn suspiciously into the use of bread:

- More than 98 percent of convicted felons are bread users.
- More than 90 percent of violent crimes are committed within 24 hours of eating bread.
- Fully HALF of all children who grow up in bread-consuming households score below average on standardized tests.

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Partial correlation

Osakorrelatsioon



Partial correlation is a method used to describe the relationship between two variables (x and y) whilst taking away the effects of another variable (z).

Possible to find:

- correlations due to the influence of third variables;
- hidden correlations, ie, relationships that are masked by the impact of third variables.

If $r_{xy} \neq r_{xy|z}$ and the difference of correlation is statistically significant, then the parameter Z is influencing the relationship of XY.

$$r_{xy|z} = \frac{r_{xy} - (r_{xz} \times r_{yz})}{\sqrt{(1 - r_{xz}^2) \times (1 - r_{yz}^2)}}$$

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Cronbach's alpha

Cronbach'i alfa

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Cronbach's alpha

CONSTRUCT (FACTOR)

is a coefficient of internal consistency of measures. It is commonly used as an estimate of the reliability of a psychometric test.

Cronbach's alpha indicates how well some features (questions) fit into a single construct:

- $\alpha = 1$, practically same questions
- $\alpha = 0$, totally incompatible questions

Cronbach's alpha	Internal consistency of construct
$\alpha \geq 0.9$	Excellent
$0.8 \leq \alpha < 0.9$	Good
$0.7 \leq \alpha < 0.8$	Acceptable
$0.6 \leq \alpha < 0.7$	Questionable
$0.5 \leq \alpha < 0.6$	Poor
$\alpha < 0.5$	Unacceptable

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Cronbach's alpha

Question 1 - s_1^2
Question 2 - s_2^2
Question ... - $s_{...}^2$
Question N - s_N^2

CONSTRUCT (FACTOR)
 s_{sum}^2

Cronbach's α

$$\alpha = \frac{N}{N-1} \times 1 - \frac{\sum_{i=1}^N s_i^2}{s_{sum}^2}$$

N - number of questions
 s^2 - variance

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Standardized Cronbach's alpha

	K1	K2	...	K _N
Question 1				
Question 2	r			
Question...	r	r		
Question N	r	r	r	

CONSTRUCT (FACTOR)

Standardized α

$$\alpha = \frac{N \times \bar{r}}{1 + (N-1) \times \bar{r}}$$

N - number of correlations
 $\bar{r}$ - arithmetical mean of correlations

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Linear Regression

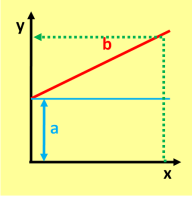
lineaarne regressioon

relationship of parameters

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Linear regression analysis

Lineaarne regressioon



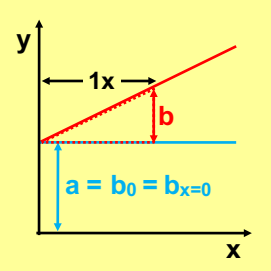
is an approach to modeling the relationship between a scalar dependent variable y and one or more explanatory variables denoted X . The case of one explanatory variable is called simple regression. More than one explanatory variable is multiple regression.

Equation:
 $y = a + bx$
 $x \rightarrow y$

The relationship between x and y is described using linear equation, although there are other options: square, polynomial, exponential, logarithm, etc equations.

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Linear regression equation



$y = a + bx$

y – dependent variable;
 x – independent variable;
 a – constant, value of y when $x = 0$;
 b – strength of relationship, when x changes 1 unit, changes y on amount of b (change of $y - \Delta y$), slope of line.

$a = b_0 = b_{x=0}$

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Example: phone bill



$y = a + bx$

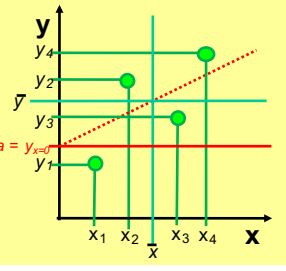
where:
 y - the size of a phone bill;
 x - the number of minutes spoken;
 a - a fixed fee (minimum bill), phone bill, if the phone is not spoken at all;
 b - price per minute.

Equation:
size of a phone bill = fixed fee + price per minute * number of minutes spoken

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Least Squares Method

Vähimruutude meetod



Johann Carl Friedrich Gauss (1777–1855), A.D. 1794

- Solution:

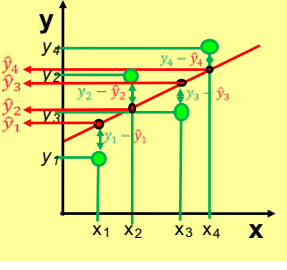
$$b = \frac{\sum_{i=1}^n (x_i - \bar{x}) * (y_i - \bar{y})}{\sum_{i=1}^n (x_i - \bar{x})^2}$$

$$a = \bar{y} - b\bar{x}$$
- EXCEL functions:
 $b = \text{SLOPE}(Y:Y;X:X)$ returns the slope of the linear regression line
 $a = \text{INTERCEPT}(Y:Y;X:X)$ returns the intercept of the linear regression line

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How precise is the model?

Standard error of regression



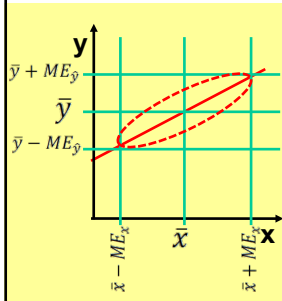
- Compute values of y from from real x -values using regression equation:
 $\hat{y}_i = a + bx_i$
- Compute differences of real y and computed y :
 $\epsilon_i = y_i - \hat{y}_i$
- Compute quadratic mean of differences = standard error of regression:

$$SE_y = \sqrt{\frac{\sum_{i=1}^n (y_i - \hat{y}_i)^2}{n - 2}}$$

Excel: $SE = \text{STEYX}(Y:Y;X:X)$ returns the standard error of the predicted y -value for each x -value in a regression

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Confidence interval of x and y



In what range are 95% or 99% of all values of x and y:

$$ME = Z_{crit} * SE$$

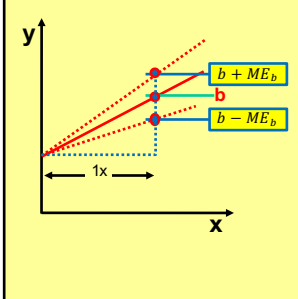
ME - margin of error

$$Z_{crit} 95\% = 1,96$$

$$Z_{crit} 99\% = 2,58$$

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Confidence interval of b



In which interval is b with probability of 95% or 99%:

$$SE_b = \frac{SE_y}{\sqrt{\sum_{i=1}^n (x_i - \bar{x})^2}}$$

or

$$SE_b = \frac{\sqrt{\sum_{i=1}^n (y_i - \hat{y}_i)^2}}{\sqrt{\sum_{i=1}^n (x_i - \bar{x})^2}}$$

$$ME_b = Z_{crit} * SE_b$$

where:

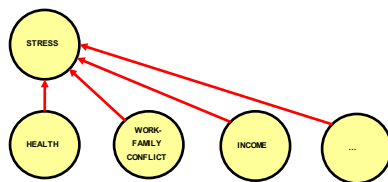
$$Z_{crit} 95\% = 1,96$$

$$Z_{crit} 99\% = 2,58$$

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Multiple Regression

Mitmene regression



- When parameter y is influenced by multiple parameters: $x_1, x_2, x_3 \dots x_n$
- $y = a + b_1x_1 + b_2x_2 + b_3x_3 + \dots b_nx_n$

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Multiple Regression

Mitmene regression



Example: phone bill

$$y = a + b_1x_1 + b_2x_2$$

where:

- y - the size of a phone bill;
- a - a fixed fee (minimum bill), phone bill, if the phone is not used at all;
- b_1 - per-minute rate
- x_1 - the number of minutes used;
- b_2 - call setup fee
- x_2 - number of calls

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Multiple Regression

y	x1	x2	x3
1	2	4	1
2	4	5	2
3	2	5	4
4	1	3	2
2	3	4	1
1	2	2	1
2	3	4	1
2	2	4	1
2	2	5	1
3	4	5	4

SUMMARY OUTPUT

Regression Statistics				
Multiple R	0.87			
R Square	0.76			
Adjusted R Square	0.64			
Standard Error	0.49			
Observations	10			

ANOVA						
	df	SS	MS	F	Significance	
Regression	3	4.55	1.52	6.27	0.03	
Residual	6	1.45	0.24			
Total	9	6				

	Coefficients	Standard Error	t Stat	P-value	Lower 95%	Upper 95%
Intercept	-0.06	0.60	-0.10	0.92	-1.52	1.40
X1	0.09	0.20	0.45	0.67	-0.40	0.58
X2	0.25	0.16	1.52	0.18	-0.10	0.65
X3	0.43	0.14	3.21	0.02	0.10	0.76

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Correlation and regression

$$b = r_{xy} \frac{SD_y}{SD_x}$$

$$r_{xy} = \frac{b}{\frac{SD_y}{SD_x}}$$

$$a = \bar{y} - b\bar{x}$$

The standardized slope of linear regression (b) has the same value as the correlation coefficient (r).

- If you are interested in simply characterizing the magnitude of the relationship between two variables, use correlation
- If you are interested in predicting or explaining your results in terms of particular values, use regression.

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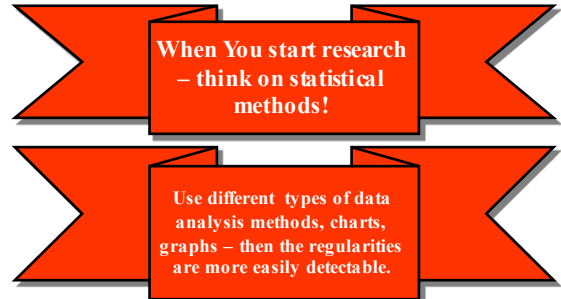
Useful:

- Collection of statistical terms and definitions:
 - <http://www.stats.gla.ac.uk/steps/glossary/index.html>
- Internet sources that may be useful for various aspects of statistics:
 - <http://www.amstat.org/> (American Statistical Association),
 - <http://www.stat.ufl.edu> (University of Florida statistics department)
 - <http://www.statsoft.com/textbook/> (covers a wide range of topics, the emphasis is on techniques rather than concepts or mathematics)
 - <http://www.york.ac.uk/depts/maths/histstat/welcome.htm> (some information about the history of statistics)
 - <http://www.isid.ac.in/> (Indian Statistical Institute),
 - <http://www.isi-web.org/30-statsoc/statsoc/282-nsslist> (The International Statistical Institute)
 - <http://www.rss.org.uk/> (The Royal Statistical Society),
 - <http://lib.stat.cmu.edu/> (an index of statistical software and routines)

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Recommendations:



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