



Data Analysis in Empirical Research - Overview

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1. Data Collection Methods

2. Scales

3. Data Analysis



Business Research

Primary research

Observation

Survey

Secondary Research

Internal Data

External Data



Survey methods

Proven approaches

- Mail surveys
- Personal/Face-to-face surveys
- Telephone surveys (CATI)
- Online/Mobile surveys (CAWI)

New approaches

- App-based surveys
- Mixed-mode Surveys
- (N)ethnography
- Big Data Analytics
- Online-Communities
- Social Media Listening/
Monitoring



1. Data Collection Methods

2. Scales

3. Data Analysis

From a question to statistics



Satisfaction with the new car?

Levels of scale measurement

		Scale level	Permissible relations	Permissible operations	Permissible statistics
		Possibilities of Analysis	Non-metric Data	Nominal	$A = A \neq B$
Ordinal	$A < B > A$			Ordering	
	Metric Data	Intervall	$A > B > C$ and $A - B = B - C$	Common arithmetic operations	
		Ratio	Proportion $(x_1/x_2) > (x_3/x_4)$	All arithmetic operations	

Every operation/statistic appropriate to a certain scale level is suitable for a SUBORDINATE scale.

Caution: Loss of information!



Rating Scales

<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
Strongly Agree	Agree	Neutral	Disagree	Strongly Disagree

Most popular answer type in business research

Alternative: Semantic Differential

Rating Scales

<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
Strongly Agree	Agree	Neutral	Disagree	Strongly Disagree

Most popular answer type in business research

- Advantages
 - Easy to understand
 - Flexible (numeric, verbal, grafical, combinations)
 - (Nearly) metric data
 - Universal usage
- Disadvantages
 - No real metric data (actual only ordinal)
 - Answer patterns: tendency towards the middle/extremes/uniform



Rating Scales - Examples

Können Sie sich grundsätzlich vorstellen, Geld in einen Investmentfonds von _____ anzulegen?

- ganz bestimmt
- wahrscheinlich
- eventuell
- wahrscheinlich nicht
- bestimmt nicht

weiter

Wie beurteilen Sie die folgenden Websites insgesamt?

	Ausgezeichnet	Sehr gut	Gut	Weniger gut	Schlecht
ortal.de	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>
citymile.de	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>
berlin.de	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>
muenchen.de	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>
hamburg.de	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>

Weiter



1. Data Collection Methods

2. Scales

3. Data Analysis

Raw data:

Mappe1 - Excel

DATEI START EINFÜGEN SEITENLAYOUT FORMELN DATEN ÜBERPRÜFEN ANSICHT Foxit PDF

Ausschneiden Kopieren Format übertragen Zwischenablage

Calibri 11 A A Zeilenumbruch

F K U A Verbinden und zentrieren

Standard Zahl Bedingte Formatierung

A15

	A	B	C	D	E	F	G
1	Respondent #	Question 1	Question 2	Question 3	Age	Gender	
2		<i>To what extend do you like the page?</i>	<i>Which layout would you recommend?</i>	<i>Which was your first impression of this page?</i>			
3	1	2	1 nice		18	0	
4	2	3	1 chaotic		21	1	
5	3	1	2 didn't know, where to search		50	1	
6	4	2	2 confusing, don't like the colours		21	1	
7	5	2	3 askdfjaö		21	0	
8	6	1	1 a website		20	0	
9	7	3	3 good structure, company name dominant		51	0	
10	8	1	1 ok		55	1	
11	9	2	3		25	0	
12	10	5	3 fine		47	0	
13	11	2	1 looks pretty		24	1	
14	12	4	2 common, nothing special		19	0	
15							
16							

For all closed questions make a note somewhere which number is representing which answer (e.g. Value labels in SPSS)

For open questions create a **codeplan** (summarize the answers in meaningful categories)

Raw data:

Mappe1 - Excel

DATEI | START | EINFÜGEN | SEITENLAYOUT | FORMELN | DATEN | ÜBERPRÜFEN | ANSICHT | Foxit PDF

Ausschneiden | Kopieren | Einfügen | Format übertragen

Calibri 11 | A A | Zeilenumbruch | Standard | Bedingte Formatierung

Zwischenablage | Schriftart | Ausrichtung | Zahl

A16 : [X] [✓] [fx]

	A	B	C	D	E	F	G
1	Respondent #	Question 1	Question 2	Question 3	Age	Gender	
2		To what extend do you like the page?	Which layout would you recommend?	Which was your first impression of this page?			
3		1=like very much - 5 don't like at all	4 None of them			0 = male 1 = female	
4	1	2	1 nice		18	0	
5	2	3	1 chaotic		21	1	
6	3	1	2 didn't know, where to search		50	1	
7	4	2	2 confusing, don't like the colours		21	1	
8	5	2	3 askdfjaö		21	0	
9	6	1	1 a website		20	0	
10	7	3	3 good structure, company name dominant		51	0	
11	8	1	1 ok		55	1	
12	9	2	3		25	0	
13	10	5	3 fine		47	0	
14	11	2	1 looks pretty		24	1	
15	12	4	2 common, nothing special		19	0	
16							
17							



General categories of statistical Analysis

Descriptive Analysis

Univariate

Bivariate

Multivariate

Inferential
statistics



Descriptive Analysis

Descriptive
Analysis

Univariate

Bivariate

Multi-
variate

Useful Analysis

Frequency Table
Simple Means (Mode, Median)
Cross-tabulations
Histogram

Statistics of the Mean
Statistics of Deviation

Appropriate Scale Level

Nominal
Ordinal

Metric

Back to our example:

A	B	C
1	Question 1	Que
	To what extend do you like the page?	Whi
	1=like very much - 5 don't like at all	4 Ne
4	1	2
5	2	3
6	3	1
7	4	2
8	5	2
9	6	1
10	7	3
11	8	1
12	9	2
13	10	5
14	11	2
15	12	4
16		
17		

Scale level:

Frequency table:

	A	B	C
1			
2			
3	Zeilenbeschriftungen	Anzahl	
4	1		3
5	2		5
6	3		2
7	4		1
8	5		1
9	Gesamtergebnis		12
10			

Mode:

Median:

(Arithmetic) Mean:

Back to our example:

Responent #	Question 1	Qu...
	To what extent do you like the page?	Wh...
	1=like very much - 5 don't like at all	4 N
1	1	2
2	2	3
3	3	1
4	4	2
5	5	2
6	6	1
7	7	3
8	8	1
9	9	2
10	10	5
11	11	2
12	12	4

Crosstabulations

Mappe1 - Excel

	Gender	ahl
	0 = male	
	1 = female	
8	0	
21	1	
90	1	
21	1	
21	0	
20	0	
91	0	
95	1	
25	0	
47	0	
24	1	
29	0	



Per Excel...

1				
2				
3	Anzahl	Spaltenbeschriftungen		
4	Zeilenbeschriftungen		0	1
5	1		1	2
6	2		3	2
7	3		1	1
8	4		1	
9	5		1	
10	Gesamtergebnis		7	5
11				
12				
--				

Per SPSS...

Kreuztabelle Question_1*Gender

			Gender		Gesamtsumme
			0	1	
Question_1	1,00	Anzahl	1	2	3
		% in Gender	14,3%	40,0%	25,0%
		% des Gesamtergebnisses	8,3%	16,7%	25,0%
2,00		Anzahl	3	2	5
		% in Gender	42,9%	40,0%	41,7%
		% des Gesamtergebnisses	25,0%	16,7%	41,7%
3,00		Anzahl	1	1	2
		% in Gender	14,3%	20,0%	16,7%
		% des Gesamtergebnisses	8,3%	8,3%	16,7%
4,00		Anzahl	1	0	1
		% in Gender	14,3%	0,0%	8,3%
		% des Gesamtergebnisses	8,3%	0,0%	8,3%
5,00		Anzahl	1	0	1
		% in Gender	14,3%	0,0%	8,3%
		% des Gesamtergebnisses	8,3%	0,0%	8,3%
Gesamtsumme		Anzahl	7	5	12
		% in Gender	100,0%	100,0%	100,0%
		% des Gesamtergebnisses	58,3%	41,7%	100,0%

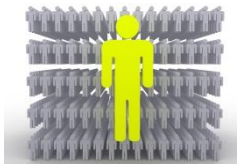


„Is there a difference between two groups?“

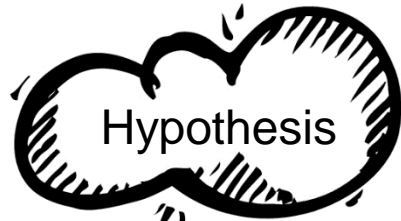
„Does a correlation exist between ... and ...?“

„Does ... influence ...?“

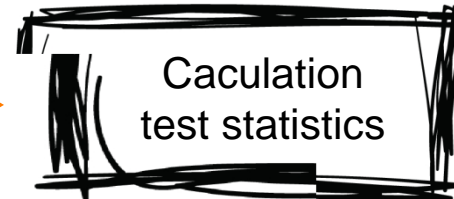
The way of testing a statistical hypothesis



Sample

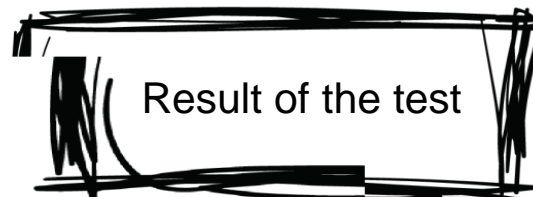


Does the relation in the sample hold in the basic population as well?



How likely is it, to find a relation in the sample, if the alternative hypothesis is true?

This is the hypotheses, the statistical test is going test!



Refusal of the alternative hypothesis, if the calculated probability is „relative“ low \Rightarrow Data are indicating, that the assumed relation is true in a more general context.

Simple t-Test in Excel: Are males and females different with regard to the favor of the page?

1	Responent #	Question 1 To what extend do you like the page?	Question 2 Which layout would you recommend?	Question 3 Which was your first impression of this page?	Age	Gender
2		1=like very much - 5 don't like at all	4 None of them			0 = male 1 = female
3						
4	1		2	1 nice	18	0
5	5		2	3 askdfjaö	21	0
6	6		1	1 a website	20	0
7	7		3	3 good structure, company	51	0
8	9		2	3	25	0
9	10		5	3 fine	47	0
10	12		4	2 common, nothing special	19	0
11	2		3	1 chaotic	21	1
12	3		1	2 didn't know, where to see	50	1
13	4		2	2 confusing, don't like the c	21	1
14	8		1	1 ok	55	1
15	11		2	1 looks pretty	24	1
16						

Sort the data with reference to the group variable

$$\bar{x}_{male} = 2,71$$

$$\bar{x}_{female} = 1,8$$



Significant difference?



Resulting p-Value: 0,22



No statistical significance attested, i.e. no difference between male and female according to the favor of the page.

Funktionsargumente

T.TEST

Matrix1 B4:B10 = (2;2;1;3;2;5;4)

Matrix2 B11:B15 = (3;1;2;1;2)

Seiten 2 = 2

Typ 2 = 2

= 0,219809855

Gibt die Teststatistik eines Studentischen t-Tests zurück.

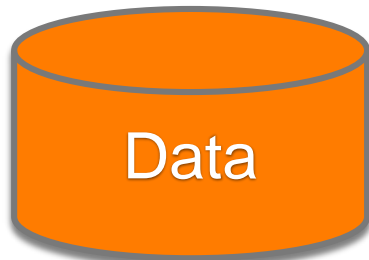
Typ bestimmt die Form des durchzuführenden t-Tests.

Formelergbnis = 0,219809855

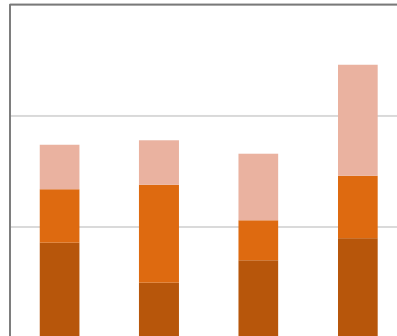
[Hilfe für diese Funktion](#)

OK Abbrechen

Visualizing results



Which statement
is intended?



Which type of
diagramm is
appropriate?



Easy and unique
interpretation

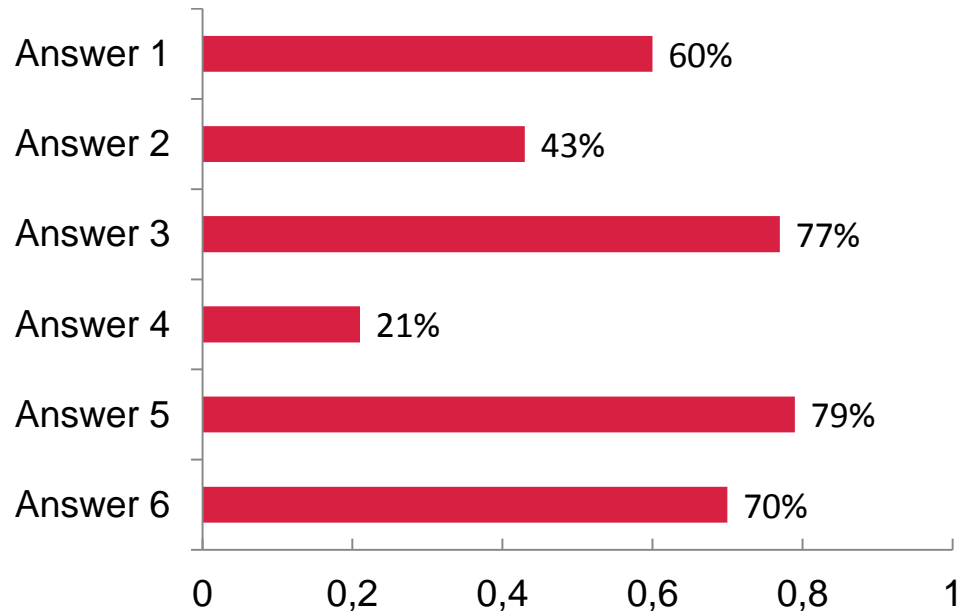


Types of diagramms

- Pie-chart
- Bar-chart
- Stacking diagramm
- Line chart
- ...

Visualizing descriptive results

„Text of the question“

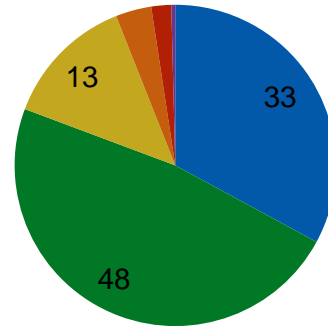


Basis: All respondents, n = 250; depiction in %

Bar charts: suitable for questions with many answers, group comparisons; frequencies, percentages, means can be shown

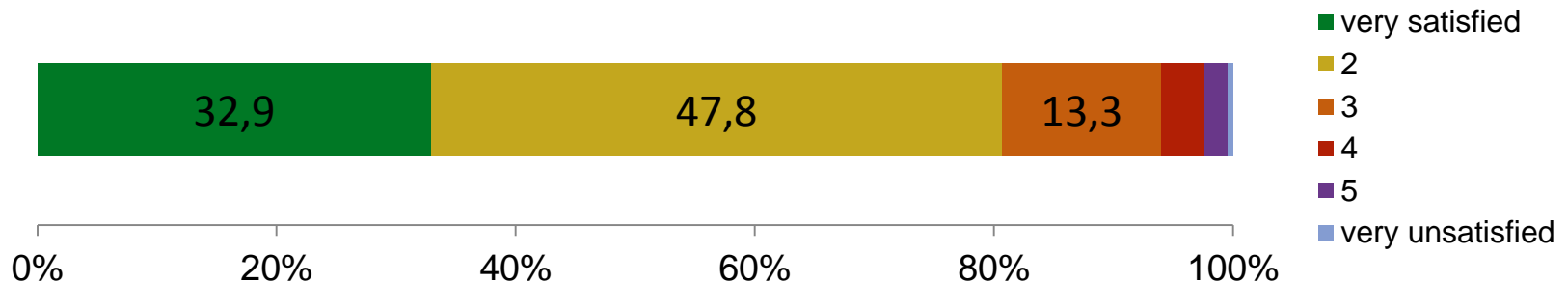
Visualizing descriptive results

„Text of the question“



Basis: All respondents, n = 250; depiction in %

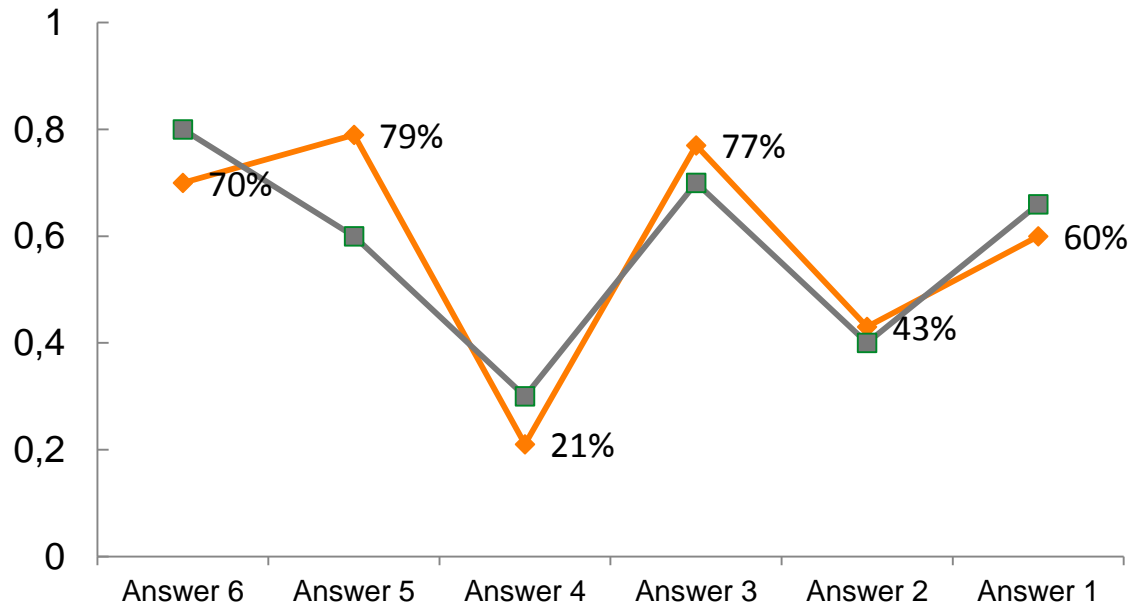
Pie charts: suitable for answers, which sum up to 100 and not to many categories.



Stacking diagrams: see pie chart; as bar chart for comparison of several answers/questions as well.

Visualizing descriptive results

„Text of the question“



Basis: All respondents, n = 250; figures in %

Line charts: suitable for questions with many answers, group comparisons; frequencies, percentages, means can be shown.
Compact graphical representation of a lot of information.

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