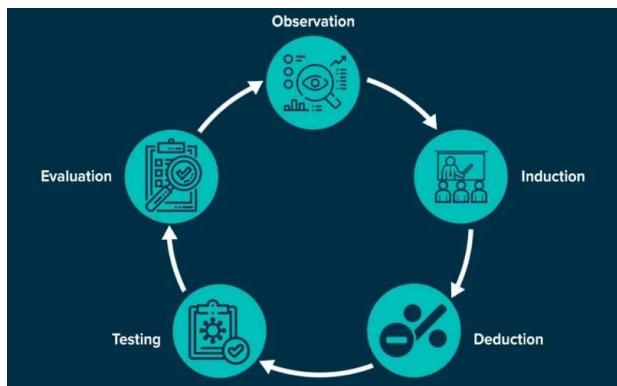


Empirical research in management and economics

Exercise

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Organizational ability questionnaire

7-point Likert scale (1 = strongly disagree, 4 = neither, 7 = strongly agree).

Item no	Item description
1	I like to have a plan to work to in everyday life
2	I feel frustrated when things don't go to plan
3	I get most things done in a day that I want to
4	I stick to a plan once I have made it
6	I enjoy spontaneity and uncertainty (*)
7	I feel frustrated if I can't find something I need
9	I find it difficult to follow a plan through (*)
10	I am an organized person
11	I like to know what I have to do in a day
12	Disorganized people annoy me
13	I leave things to the last minute (*)
14	I have many different plans relating to the same goal (*)
16	I like to have my documents filed and in order
17	I find it easy to work in a disorganized environment (*)

Item no	Item description
18	I make 'to do' lists and achieve most of the things on it
19	My workspace is messy and disorganized (*)
20	I like to be organized
21	Interruptions to my daily routine annoy me
22	I feel that I am wasting my time
23	I forget the plans I have made (*)
24	I prioritize the things I have to do
25	I like to work in an organized environment
26	I feel relaxed when I don't have a routine (*)
27	I set deadlines for myself and achieve them
28	I change rather aimlessly from one activity to another during the day (*)
29	I have trouble organizing the things I have to do (*)
30	I put tasks off to another day (*)
31	I feel restricted by schedules and plans (*)

Exercise

- Open dataset “OrganizationalAbility.csv”
→ Organizational ability questionnaire ($N = 239$)
- Conduct a principal component analysis with JASP
 - How many factors would you retain (based on scree test, based on parallel analysis)?
 - Would you use orthogonal or oblique rotation?
 - How do you interpret the extracted factors? Find a descriptive name for each factor.
 - Produce each person’s factor score on each of the extracted factors

OrganizationalAbility* (C:\Users\pachur\Documents\Work\TUM\Teaching\WS25\Empirical Research\Exercises\09_Factor analysis)

Edit Data Descriptives T-Tests ANOVA Mixed Models Regression Frequencies Factor Machine Learning Meta-Analysis Power Process Reliability

Correlation

Variables (highlighted with a red circle)

- Correlation
- Linear Regression
- Logistic Regression
- Generalized Linear Model

Partial out

Classical

Bayesian

Correlation

Linear Regression

Logistic Regression

Sample Correlation Coefficient

- Pearson's r
- Spearman's rho
- Kendall's tau-b

Additional Options

- Display pairwise
- Report significance
- Flag significant correlations
- Confidence intervals

Interval 95 %

- From 1000 bootstraps
- Vovk-Sellke maximum p-ratio
- Effect size (Fisher's z)
- Sample size
- Covariance

Alt. Hypothesis

- Correlated
- Correlated positively
- Correlated negatively

Plots

- Scatter plots
- Densities for variables
- Statistics

Confidence intervals 95 %

Prediction intervals 95 %

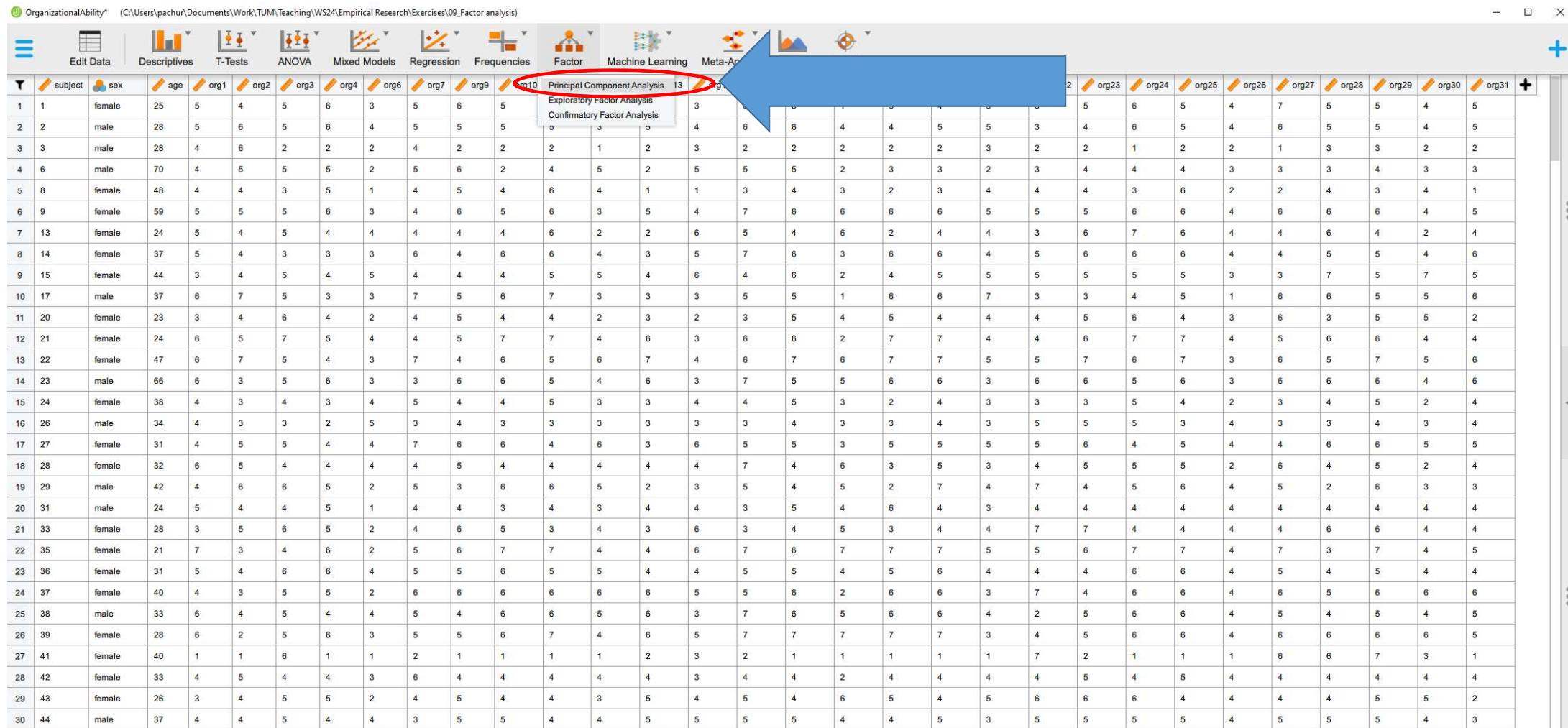
Heatmap

Assumption Checks

Options

Variable	org1	org2	org3	org4	org6	org7	org9	org10	org11	org12	org13	org14	org16	org17	org18	org19	org20	org21	org22	org23	org24	org25		
org1	Pearson's r	—																						
org2	Pearson's r	0.409	—																					
org3	Pearson's r	0.319	0.151	—																				
org4	Pearson's r	0.414	0.219	0.402	—																			
org6	Pearson's r	0.354	0.220	0.089	0.165	—																		
org7	Pearson's r	0.229	0.514	0.133	0.163	0.079	—																	
org9	Pearson's r	0.219	0.061	0.373	0.461	0.105	0.002	—																
org10	Pearson's r	0.525	0.217	0.433	0.473	0.278	0.145	0.474	—															
org11	Pearson's r	0.650	0.368	0.342	0.429	0.342	0.294	0.271	0.577	—														
org12	Pearson's r	0.278	0.271	0.189	0.240	0.253	0.295	0.143	0.417	0.367	—													
org13	Pearson's r	0.385	0.101	0.442	0.362	0.285	0.047	0.374	0.536	0.360	0.295	—												
org14	Pearson's r	0.091	-0.051	0.009	0.053	0.146	-0.016	0.036	0.039	0.029	0.037	0.082	—											
org15	Pearson's r	0.484	0.117	0.347	0.339	0.250	0.185	0.314	0.583	0.502	0.313	0.368	0.041	—										
org16	Pearson's r	0.361	0.204	0.128	0.227	0.374	0.134	0.207	0.446	0.365	0.384	0.404	0.205	0.372	—									
org17	Pearson's r	0.465	0.264	0.342	0.241	0.227	0.133	0.163	0.326	0.380	0.341	0.331	0.070	0.368	0.335	—								
org18	Pearson's r	0.370	0.082	0.186	0.239	0.220	0.033	0.314	0.544	0.371	0.307	0.476	0.058	0.463	0.584	0.353	—							
org19	Pearson's r	0.532	0.239	0.358	0.390	0.249	0.236	0.323	0.681	0.610	0.388	0.435	0.058	0.570	0.549	0.396	0.565	—						
org20	Pearson's r	0.394	0.413	0.120	0.286	0.263	0.307	-0.025	0.262	0.428	0.334	0.100	0.115	0.225	0.299	0.207	0.176	0.347	—					
org21	Pearson's r	-0.086	-0.143	0.191	0.129	-0.095	-0.126	0.231	0.203	-0.001	0.025	0.198	0.072	0.084	0.015	-0.014	0.151	0.108	-0.159	—				
org22	Pearson's r	0.162	0.051	0.174	0.372	0.098	0.049	0.348	0.310	0.205	0.157	0.318	0.111	0.300	0.122	0.150	0.240	0.267	0.060	0.330	—			
org23	Pearson's r	0.419	0.146	0.393	0.374	0.192	0.136	0.452	0.497	0.438	0.282	0.390	4.889e-10 ⁴	0.403	0.376	0.476	0.428	0.469	0.196	0.085	0.293	—		
org24	Pearson's r	0.567	0.246	0.367	0.448	0.262	0.238	0.290	0.653	0.625	0.441	0.445	0.075	0.557	0.618	0.410	0.580	0.714	0.345	-0.019	0.212	0.593	—	
org25	Pearson's r	0.297	0.266	0.142	0.288	0.474	0.148	0.173	0.281	0.374	0.233	0.231	0.183	0.160	0.241	0.229	0.185	0.249	0.345	-0.076	0.133	0.196	0.226	—
org26	Pearson's r	0.269	0.088	0.347	0.298	0.349	0.004	0.410	0.468	0.323	0.165	0.592	0.146	0.283	0.314	0.188	0.357	0.265	0.100	0.335	0.382	0.309	0.287	—
org27	Pearson's r	0.331	0.102	0.099	0.281	0.381	0.038	0.127	0.281	0.235	0.375	0.192	0.222	0.247	0.261	0.268	0.246	0.233	0.007	0.189	0.199	0.280	—	

OrganizationalAbility* (C:\Users\pachur\Documents\Work\TUM\Teaching\WS24\Empirical Research\Exercises\09_Factor analysis)



The screenshot shows the SPSS interface with a data table and a toolbar. The toolbar has various statistical analysis buttons: Edit Data, Descriptives, T-Tests, ANOVA, Mixed Models, Regression, Frequencies, Factor, Machine Learning, and Meta-Analysis. A blue arrow points to the 'Factor' button, which is currently highlighted. The data table contains 30 rows of data with columns for subject, sex, age, and various organizational variables (org1 to org31). The 'Principal Component Analysis' button is also highlighted in the toolbar.

		subject	sex	age	org1	org2	org3	org4	org5	org6	org7	org8	org9	org10	Principal Component Analysis	13	9	2	org23	org24	org25	org26	org27	org28	org29	org30	org31					
1	1	female	25	5	4	5	6	3	5	6	5	6	5	5	Principal Component Analysis	13	9	2	org23	org24	org25	org26	org27	org28	org29	org30	org31					
2	2	male	28	5	6	5	6	4	5	5	5	5	5	5	Exploratory Factor Analysis	3	3	4	6	6	4	6	5	4	6	5	4	5				
3	3	male	28	4	6	2	2	2	4	2	2	2	1	2	3	2	2	2	2	3	2	2	1	2	3	2	2					
4	6	male	70	4	5	5	5	2	5	6	2	4	5	2	5	5	5	2	3	3	2	3	4	4	3	3	3					
5	8	female	48	4	4	3	5	1	4	5	4	6	4	1	1	3	4	3	2	3	4	4	4	3	6	2	1					
6	9	female	59	5	5	5	6	3	4	6	5	6	3	5	4	7	6	6	6	6	5	5	6	6	6	4	5					
7	13	female	24	5	4	5	4	4	4	4	4	6	2	2	6	5	4	6	2	4	4	3	6	7	6	4	2	4				
8	14	female	37	5	4	3	3	3	6	4	6	6	4	3	5	7	6	3	6	6	4	5	6	6	4	5	4	6				
9	15	female	44	3	4	5	4	5	4	4	4	5	5	4	6	4	6	2	4	5	5	5	5	5	3	3	7	5	5			
10	17	male	37	6	7	5	3	3	7	5	6	7	3	3	3	5	5	1	6	6	7	3	3	4	5	1	6	6	5	6		
11	20	female	23	3	4	6	4	2	4	5	4	4	2	3	2	3	5	4	5	4	4	4	5	6	4	3	6	3	5	2		
12	21	female	24	6	5	7	5	4	4	5	7	7	4	6	3	6	6	2	7	7	4	4	6	7	7	4	5	6	6	4	4	
13	22	female	47	6	7	5	4	3	7	4	6	5	6	7	4	6	7	6	7	7	5	5	7	6	7	3	6	5	7	5	6	
14	23	male	66	6	3	5	6	3	3	6	6	5	4	6	3	7	5	5	6	6	3	6	6	5	6	3	6	6	4	6		
15	24	female	38	4	3	4	3	4	5	4	4	5	3	3	4	4	5	5	3	2	4	3	3	3	5	4	2	3	4	5	2	4
16	26	male	34	4	3	3	2	5	3	4	3	3	3	3	3	4	3	3	3	4	3	5	5	5	3	4	3	3	4	3	4	
17	27	female	31	4	5	5	4	4	7	6	6	4	6	3	6	5	5	3	5	5	5	5	6	4	5	4	6	6	5	5	5	
18	28	female	32	6	5	4	4	4	4	5	4	4	4	4	4	7	4	6	3	5	3	4	5	5	2	6	4	5	2	4		
19	29	male	42	4	6	6	5	2	5	3	6	6	5	2	3	5	4	5	2	7	4	7	4	5	6	4	5	2	6	3	3	
20	31	male	24	5	4	4	5	1	4	4	3	4	3	4	4	3	5	4	6	4	3	4	4	4	4	4	4	4	4	4		
21	33	female	28	3	5	6	5	2	4	6	5	3	4	3	6	3	4	5	3	4	4	7	7	4	4	4	6	6	4	4		
22	35	female	21	7	3	4	6	2	5	6	7	7	4	4	6	7	6	7	7	5	5	6	7	7	4	7	3	7	4	5		
23	36	female	31	5	4	6	6	4	5	5	6	5	5	4	4	5	5	4	5	6	4	4	6	6	4	5	4	5	4	4		
24	37	female	40	4	3	5	5	2	6	6	6	6	6	6	5	5	6	2	6	6	3	7	4	6	6	4	6	5	6	6		
25	38	male	33	6	4	5	4	4	5	4	6	6	5	6	3	7	6	5	6	6	4	2	5	6	4	5	4	5	4	5		
26	39	female	28	6	2	5	6	3	5	5	6	7	4	6	5	7	7	7	7	3	4	5	6	6	4	6	6	6	5	5		
27	41	female	40	1	1	6	1	1	2	1	1	1	1	2	3	2	1	1	1	1	7	2	1	1	1	1	6	6	7	3	1	
28	42	female	33	4	5	4	4	3	6	4	4	4	4	4	3	4	4	4	2	4	4	4	5	4	4	4	4	4	4	4		
29	43	female	26	3	4	5	5	2	4	5	4	4	3	5	4	5	4	6	5	4	5	6	6	4	4	4	5	5	2			
30	44	male	37	4	4	5	4	4	3	5	5	4	4	5	5	5	5	4	4	5	3	5	5	5	4	5	5	4	3			

OrganizationalAbility* (autosaved) (C:\Users\pachur\Documents\Work\TUM\Teaching\WS25\Empirical Research\Exercises\09_Factor analysis)

Results ▾

Principal Component Analysis ▾

Kaiser-Meyer-Olkin Test

	Value	Significance
Overall MSA	0.894	
org1	0.937	
org10	0.946	
org11	0.942	
org12	0.904	
org13	0.924	
org14	0.647	
org15	0.939	
org17	0.886	
org18	0.884	
org19	0.936	
org2	0.788	
org20	0.934	
org21	0.976	
org22	0.732	
org23	0.846	
org24	0.895	
org25	0.900	
org26	0.853	
org27	0.902	
org28	0.889	
org29	0.896	
org3	0.856	
org30	0.885	
org31	0.859	
org4	0.864	
org6	0.868	
org7	0.752	
org9	0.856	

Bartlett's Test

X ²	df	p
3055.515	378.000	< .001

Chi-Squared Test

Value	df	p	
Model	564.142	272	< .001

Component Loadings

	PC1	PC2	PC3	PC4	Uniqueness
org10	0.800				0.325
org25	0.783				0.237
org20	0.765				0.298
org11	0.727				0.368
org1	0.688				0.411
org13	0.578				0.459
org24	0.669				0.484
org16	0.667				0.482
org19	0.652		-0.485		0.327
org27	0.627				0.476
org17	0.620		-0.497		0.328
org4	0.607		0.417		0.438
org30	0.588				0.389
org18	0.555				0.645
org3	0.544				0.472
org29	0.542	0.499			0.410
org9	0.520				0.517
org12	0.515				0.655

Assumption checks

- KMO test
- Bartlett's test
- Mardia's test
- Anti-image correlation matrix

Add PC scores to data

Prefix: PC

OrganizationalAbility* (autosaved) (C:\Users\pachur\Documents\Work\TUM\Teaching\WS25\Empirical Research\Exercises\09_Factor analysis)

Edit Data Descriptives T-Tests ANOVA Mixed Models Regression Frequencies Factor Machine Learning Meta-Analysis Power Process Reliability

Component Loadings

	PC1	PC2	PC3	PC4	Uniqueness
org10	0.800				0.325
org25	0.783				0.237
org20	0.765				0.298
org11	0.727				0.368
org1	0.688				0.411
org13	0.678				0.459
org24	0.669				0.484
org16	0.667				0.482
org19	0.652		-0.485		0.327
org27	0.627				0.479
org17	0.620		-0.497		0.428
org4	0.607		0.417		0.438
org30	0.588				0.389
org18	0.555				0.645
org3	0.544				0.472
org29	0.542	0.499			0.410
org9	0.520				0.517
org12	0.515				0.655
org28	0.513	0.431			0.517
org31	0.477		0.531		0.484
org5	0.448		0.560		0.443
org28	0.445		0.528		0.404
org23	0.441				0.600
org21	0.411	0.549			0.598
org22	0.325				0.564
org2	-0.562				0.462
org7	-0.518				0.562
org14		0.483			0.737

Note: No rotation method applied.

Component Characteristics

	Eigenvalue	Proportion var.	Cumulative
Component 1	9.028	0.322	0.322
Component 2	2.750	0.098	0.421
Component 3	1.709	0.061	0.482
Component 4	1.504	0.054	0.535

Scree plot

Display loadings above 0.4

Order Loadings By: Size

Tables: Component correlations, Residual matrix, Parallel analysis (Based on PC, Based on FA)

Assumption checks: KMO test, Bartlett's test, Mardia's test, Anti-image correlation matrix, Add PC scores to data

Plots: Path diagram, Scree plot, Parallel analysis results

Note: Because the number of components is based on parallel analysis (which relies on simulations, that involve random variation), sometimes a solution with **only three components** is proposed

OrganizationalAbility* (C:\Users\pachur\Documents\Work\TUM\Teaching\WS25\Empirical Research\Exercises\09_Factor analysis)

Edit Data Descriptives T-Tests ANOVA Mixed Models Regression Frequencies Factor Machine Learning Meta-Analysis Power Process Reliability

Number of Components

Based on:

- Parallel analysis (selected)
- Based on PC
- Based on FA
- Repeatability
- Set seed: 1

Eigenvalues

Eigenvalues above: 1

Manual

Number of components: 1

Analysis Options

Rotation Method: Orthogonal (selected)

Base Decomposition on:

- Correlation matrix (selected)
- Covariance matrix
- Polytetrachoric correlation matrix

Rotation Method dropdown: varimax (selected)

Output Options

Display loadings above: 0.4

Order Loadings By: Size (selected)

Tables

- Component correlations
- Residual matrix
- Parallel analysis:
 - Based on PC (selected)
 - Based on FA

Assumption checks

- KMO test (checked)
- Bartlett's test (checked)
- Mardia's test
- Anti-image correlation matrix

Add PC scores to data

Prefix: PC

Component Loadings

	PC1	PC2	PC3	PC4	Uniqueness
org25	0.805				0.237
org19	0.768				0.327
org20	0.766				0.298
org11	0.746				0.328
org10	0.644	0.464			0.325
org16	0.630				0.482
org24	0.545	0.427			0.484
org11	0.518		0.518		0.368
org1	0.501		0.513		0.411
org18	0.484				0.445
org12	0.482				0.655
org13	0.421	0.530			0.459
org29	0.402	0.513			0.410
org9	0.369				0.517
org3	0.632				0.472
org27	0.613				0.476
org30	0.607		0.454		0.389
org23	0.603				0.606
org28	0.596				0.517
org4	0.585	0.431			0.438
org22	0.562				0.564
org2	0.718				0.462
org7	0.647				0.562
org21	0.577				0.598
org6			0.679		0.443
org31			0.652		0.484
org26			0.651		0.404
org14		0.501	0.737		

Note: Applied rotation method is varimax.

Component Characteristics

	Unrotated solution			Rotated solution		
	Eigenvalue	Proportion var.	Cumulative	Sum Sq. Loadings	Proportion var.	Cumulative
Component 1	9.028	0.322	0.322	5.250	0.188	0.188
Component 2	2.750	0.098	0.421	4.348	0.155	0.343
Component 3	1.709	0.061	0.482	3.003	0.107	0.450
Component 4	1.504	0.054	0.535	2.389	0.085	0.535

Scree plot

Scree plot

Eigenvalue

Component

Data

Simulated data from parallel analysis

OrganizationalAbility^ (C:\Users\pachun\Documents\Work\TUM\Teaching\WS25\Empirical Research\Exercises\09_Factor analysis)

Edit Data Descriptives T-Tests ANOVA Mixed Models Regression Frequencies Factor Machine Learning Meta-Analysis Power Process Reliability

PC_2 PC_3 PC_4

org6 org7 org9 org10 org11 org12 org13 org14 org16

Data Raw Variance-covariance matrix Sample size 200

Number of Components

Based on

- Parallel analysis (selected)
- Based on PC
- Based on FA

Repeatability

- Set seed: 1

Eigenvalues

- Eigenvalues above 1

Manual

- Number of components: 1

Analysis Options

Rotation Method

- Orthogonal
- Correlation matrix (selected)
- Covariance matrix
- Polyachototetrachoric correlation matrix

Oblique

- prom. x (selected)

Output Options

Display loadings above 0.4

Order Loadings By

- Size (selected)
- Variables

Tables

- Component correlations (selected)
- Residual matrix
- Parallel analysis
- Based on PC
- Based on FA

Assumption checks

- KMO test
- Barlett's test
- Mardia's test
- Anti-image correlation matrix

Add PC scores to data

Prefix PC

Component Loadings

	RC1	RC2	RC3	RC4	Uniqueness
org19	0.905				0.327
org17	0.880				0.328
org25	0.842				0.237
org20	0.790				0.298
org16	0.626				0.482
org10	0.562				0.325
org24	0.476				0.484
org12	0.463				0.655
org18	0.438				0.645
org9		0.700			0.517
org3		0.692			0.472
org23		0.690			0.608
org27		0.649			0.476
org23		0.644			0.554
org4		0.643	0.419		0.438
org30		0.619		0.406	0.389
org28		0.612			0.517
org13		0.468			0.459
org29		0.440	-0.422		0.410
org2		0.753			0.462
org7		0.677			0.562
org21		0.578			0.506
org11		0.462			0.368
org1		0.460			0.411
org26		0.400	0.707	0.404	
org6			0.691	0.443	
org31			0.658	0.484	
org14			0.516	0.737	

Note: Applied rotation method is promax.

Component Characteristics

	Unrotated solution			Rotated solution		
	Eigenvalue	Proportion var.	Cumulative	Sum Sq. Loadings	Proportion var.	Cumulative
Component 1	9.028	0.322	0.322	5.002	0.181	0.181
Component 2	2.750	0.098	0.421	4.525	0.162	0.343
Component 3	1.709	0.061	0.482	3.041	0.109	0.452
Component 4	1.504	0.054	0.535	2.343	0.084	0.535

Component Correlations

	Component 1	Component 2	Component 3	Component 4
Component 1	1.000	0.558	0.376	0.375
Component 2	0.558	1.000	0.160	0.246
Component 3	0.376	0.160	1.000	0.039
Component 4	0.375	0.246	0.039	1.000

Scree plot

7.5
5.0
2.5
0.0

Data Simulated data from parallel analysis

Organizational ability questionnaire

Preference for organization

19	My workspace is messy and disorganized (*)
17	I find it easy to work in a disorganized environment (*)
25	I like to work in an organized environment
20	I like to be organized
16	I like to have my documents filed and in order
10	I am an organized person
24	I prioritize the things I have to do
12	Disorganized people annoy me
18	I make 'to do' lists and achieve most of the things on it

Goal achievement

9	I find it difficult to follow a plan through (*)
3	I get most things done in a day that I want to
23	I forget the plans I have made (*)
27	I set deadlines for myself and achieve them
22	I feel that I am wasting my time (*)
4	I stick to a plan once I have made it
30	I put tasks off to another day (*)
28	I change rather aimlessly from one activity to another during the day (*)
13	I leave things to the last minute (*)
29	I have trouble organizing the things I have to do (*)

Acceptance of interruptions

2	I feel frustrated when things don't go to plan
7	I feel frustrated if I can't find something I need
21	Interruptions to my daily routine annoy me
11	I like to know what I have to do in a day
1	I like to have a plan to work to in everyday life

Preference for routine

26	I feel relaxed when I don't have a routine (*)
6	I enjoy spontaneity and uncertainty (*)
31	I feel restricted by schedules and plans (*)
14	I have many different plans relating to the same goal (*)

Factor scores

