

Constructing Competence Scales in Graduate Tracer Studies Working Towards Theoretical Validity and Empirical Reliability

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Institutional Background of the Study

The 'Cooperation Project for Graduate Tracer Studies (KOAB)'

- initiated and coordinated by the *International Centre for Higher Education Research (INCHER) Kassel*
- 40 to 70 higher education institutions involved
- *University of Cologne* involved since 2008 – survey including graduates from the study year 2007 (1st October 2006 to 30th September 2007)
- teacher questionnaire since 2009 – survey including graduates from the study year 2008 (1st October 2007 to 30th September 2008)
- teacher questionnaire now in the field with the third version of the scale on demands of the teacher profession – survey including graduates from the study year 2011 (1st October 2010 to 30th September 2011)



Theoretical Foundation - Action Fields of the Teacher Profession

Teacher Education Standards in Germany

- 2000: *Standing Conference of the Ministers of Education and Cultural Affairs and Teachers' Unions* agreed on new principles of the teacher profession
- 2004: *Standing Conference of the Ministers of Education and Cultural Affairs* published guidelines on teacher education standards for the educational sciences based on these principles and an expertise issued by the working group on teacher education reform around Prof. Terhart (University of Munster) in 2002
- 2008: *Standing Conference of the Ministers of Education and Cultural Affairs* published guidelines regarding teacher education standards for the subject areas



Theoretical Foundation – Action Fields of the Teacher Profession

A Model of Teacher Action Fields

1 st layer	2 nd layer	3 rd layer	4 th layer
Teacher Action	Teacher Action Fields	Areas	items – specific teacher action
Teacher Action	Teaching	Planning and Design of Lessons	
		Enhancement of Pupils' Motivation and Performance	
		Support for Independent Learning Strategies in Pupils	
	Moral Education	Consideration of Pupils' Social Background	
		Conveyance of Norms and Values	
		Creation of a Pleasant Social Atmosphere	
	Student Evaluation	Diagnostics and Counselling	
		Grading and Evaluation on the Basis of Objective Standards	
	School Development	Creation of a Work-Life-Balance	
		Adapting to the Regulatory Framework	
		Evaluation	
	Subject Areas	Representation of Subject Areas	
		Application of Scientific Methods from Subject Areas	
		Use of Subject-Specific Pedagogical Knowledge	



Steps to Ensure Validity and Reliability of a Scale

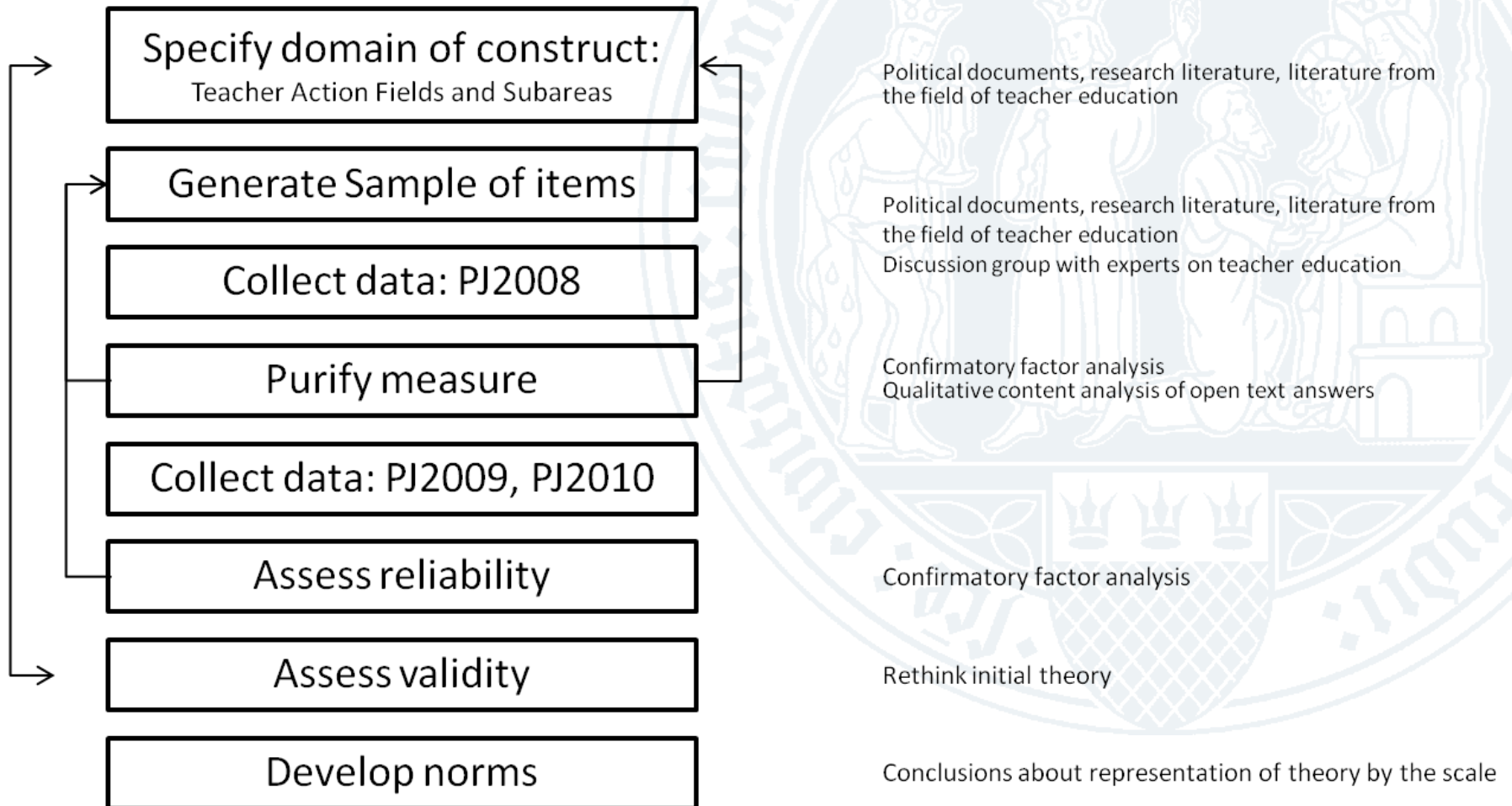


Figure based on Churchill (1979: 66) with modifications



Empirical Reliability

Confirmatory and Exploratory Factor Analysis, Cronbach's Alpha

1. CFA:

- coherent models of interrelated factors can be tested concerning factor reliability of items and overall reliability of proposed theoretical model (Kahn 2006; Guo et al. 2009; Russel 2002; Bollen 1989)
- model structure contains manifest variables and latent variables
- scores for latent constructs, measurement errors and variances of latent constructs estimated on basis of empirical scores for manifest items (Gorsuch 1983; Schreiber et al. 2006; Bollen 1989)
- fit of theoretical model estimated by contrasting empirical and estimated correlation or covariance matrix for this model

2. EFA (Principal Component Analysis):

- may be useful when a scale lacks theoretical foundation
- not adequate to test multi- or unidimensionality (Gerbing & Anderson 1988)
- restricted theory based testing as theoretical model cannot be fully depicted

3. Cronbach's Alpha:

- supposed to indicate the internal consistency of a unidimensional scale
- criticised because of its application to test reliability in terms of unidimensionality of questionnaire scales (e.g. Sijtsma 2009; Graham 2006; Schmitt 1996)
- rendering better results of consistency for scales including more items: assumed correlation mean of 0.5, a scale of 10 items would generate an Alpha value of 0.91, whereas a 5 item scale would generate an Alpha value of 0.83

$$\alpha = \frac{n * r}{(1 + r * (n - 1))}$$



Empirical Reliability – Multidimensionality

Example of the Subscale ‘Teaching’

2 nd layer	3 rd layer	4 th layer
Teacher Action Fields	Areas	items – specific teacher action
Teaching	Planning and Design of Lessons	
	Enhancement of Pupils’ Motivation and Performance	
	Support for Independent Learning Strategies in Pupils	

2 nd layer	3 rd layer	4 th layer
Teacher Action Fields	Areas	items – specific teacher action
Teaching	Planning and Design of Lessons	
	Enhancement of Pupils’ Motivation and Performance	
	Support for Independent Learning Strategies in Pupils	

- data from the 2011 graduate survey (graduate year 2010)
- data input, where cases were deleted listwise in advance, contains 1169 cases
- data for the action field ‘Teaching’ with relatively high level of non-normality with univariate skew between $-.732$ and -3.163 and univariate kurtosis between 0.023 and 12.868



Confirmatory Factor Analysis – ‘Teaching’ – I

CFA Teaching: Model 1: three layers: standardised regression weights

		factor score 'Teaching'
	factor score 'Planning and Design of Lessons'	
<i>obtaining, viewing and developing teaching materials</i>	.500	.549
<i>varying methods in the design of lessons</i>	.621	
<i>creating an obvious underlying structure for each lesson</i>	.812	
<i>creating a lesson according to the learning objective</i>	.750	
	factor score 'Enhancement of Pupils' Motivation and Performance'	
<i>including pupils' mistakes in the learning process</i>	.718	.907
<i>analysing pupils' mistakes</i>	.727	
<i>motivating pupils to learn</i>	.590	
	factor score 'Support for Independent Learning Strategies in Pupils'	
<i>supporting independent learning strategies in pupils</i>	.698	.868
<i>encouraging pupils to reflect on their individual learning process</i>	.819	
<i>guiding each pupil's learning progress by offering individual support</i>	.662	
SRMR .0508 / RMSEA .076 / TLI .920 / CFI .943		

CFA Teaching: Model 2: two layers: standardised regression weights

	factor score 'Teaching'
<i>obtaining, viewing and developing teaching materials</i>	.396
<i>varying methods in the design of lessons</i>	.544
<i>creating an obvious underlying structure for each lesson</i>	.517
<i>creating a lesson according to the learning objective</i>	.505
<i>including pupils' mistakes in the learning process</i>	.616
<i>analysing pupils' mistakes</i>	.607
<i>motivating pupils to learn</i>	.609
<i>supporting independent learning strategies in pupils</i>	.658
<i>encouraging pupils to reflect on their individual learning process</i>	.714
<i>guiding each pupil's learning progress by offering individual support</i>	.616
SRMR .0940 / RMSEA .155 / TLI .668 / CFI .742	



Confirmatory Factor Analysis – ‘Teaching’ – II

CFA Teaching: Model 1: three layers: standardised regression weights

		factor score 'Teaching'
	factor score 'Planning and Design of Lessons'	
<i>obtaining, viewing and developing teaching materials</i>	.500	.549
<i>varying methods in the design of lessons</i>	.621	
<i>creating an obvious underlying structure for each lesson</i>	.812	
<i>creating a lesson according to the learning objective</i>	.750	
	factor score 'Enhancement of Pupils' Motivation and Performance'	
<i>including pupils' mistakes in the learning process</i>	.718	.907
<i>analysing pupils' mistakes</i>	.727	
<i>motivating pupils to learn</i>	.590	
	factor score 'Support for Independent Learning Strategies in Pupils'	
<i>supporting independent learning strategies in pupils</i>	.698	.868
<i>encouraging pupils to reflect on their individual learning process</i>	.819	
<i>guiding each pupil's learning progress by offering individual support</i>	.662	
SRMR .0508 / RMSEA .076 / TLI .920 / CFI .943		

CFA Teaching: Model 3: three layers, item 1 excluded: standardised regression weights

		factor score 'Teaching'
	factor score 'Planning and Design of Lessons'	
<i>obtaining, viewing and developing teaching materials</i>		.531
<i>varying methods in the design of lessons</i>	.598	
<i>creating an obvious underlying structure for each lesson</i>	.830	
<i>creating a lesson according to the learning objective</i>	.755	
	factor score 'Enhancement of Pupils' Motivation and Performance'	
<i>including pupils' mistakes in the learning process</i>	.720	.897
<i>analysing pupils' mistakes</i>	.728	
<i>motivating pupils to learn</i>	.588	
	factor score 'Support for Independent Learning Strategies in Pupils'	
<i>supporting independent learning strategies in pupils</i>	.698	.877
<i>encouraging pupils to reflect on their individual learning process</i>	.820	
<i>guiding each pupil's learning progress by offering individual support</i>	.662	
SRMR .0549 / RMSEA .081 / TLI .920 / CFI .947		



Confirmatory Factor Analysis – ‘Teaching’ – III

CFA Teaching: Model 1: three layers: standardised regression weights

		factor score 'Teaching'
	factor score 'Planning and Design of Lessons'	
<i>obtaining, viewing and developing teaching materials</i>	.500	.549
<i>varying methods in the design of lessons</i>	.621	
<i>creating an obvious underlying structure for each lesson</i>	.812	
<i>creating a lesson according to the learning objective</i>	.750	
	factor score 'Enhancement of Pupils' Motivation and Performance'	
<i>including pupils' mistakes in the learning process</i>	.718	.907
<i>analysing pupils' mistakes</i>	.727	
<i>motivating pupils to learn</i>	.590	
	factor score 'Support for Independent Learning Strategies in Pupils'	
<i>supporting independent learning strategies in pupils</i>	.698	.868
<i>encouraging pupils to reflect on their individual learning process</i>	.819	
<i>guiding each pupil's learning progress by offering individual support</i>	.662	
SRMR .0508 / RMSEA .076 / TLI .920 / CFI .943		

CFA Teaching: Model 4: three layers, item 7 excluded: standardised regression weights

		factor score 'Teaching'
	factor score 'Planning and Design of Lessons'	
<i>obtaining, viewing and developing teaching materials</i>	.497	.532
<i>varying methods in the design of lessons</i>	.619	
<i>creating an obvious underlying structure for each lesson</i>	.814	
<i>creating a lesson according to the learning objective</i>	.751	
	factor score 'Enhancement of Pupils' Motivation and Performance'	
<i>including pupils' mistakes in the learning process</i>	.780	.807
<i>analysing pupils' mistakes</i>	.741	
<i>motivating pupils to learn</i>		
	factor score 'Support for Independent Learning Strategies in Pupils'	
<i>supporting independent learning strategies in pupils</i>	.687	.886
<i>encouraging pupils to reflect on their individual learning process</i>	.832	
<i>guiding each pupil's learning progress by offering individual support</i>	.660	
SRMR .0390 / RMSEA .058 / TLI .958 / CFI .972		



Confirmatory Factor Analysis – ‘Teaching’ – IV

CFA Teaching: Model 1: three layers: standardised regression weights

		factor score 'Teaching'
	factor score 'Planning and Design of Lessons'	
<i>obtaining, viewing and developing teaching materials</i>	.500	.549
<i>varying methods in the design of lessons</i>	.621	
<i>creating an obvious underlying structure for each lesson</i>	.812	
<i>creating a lesson according to the learning objective</i>	.750	
	factor score 'Enhancement of Pupils' Motivation and Performance'	
<i>including pupils' mistakes in the learning process</i>	.718	.907
<i>analysing pupils' mistakes</i>	.727	
<i>motivating pupils to learn</i>	.590	
	factor score 'Support for Independent Learning Strategies in Pupils'	
<i>supporting independent learning strategies in pupils</i>	.698	.868
<i>encouraging pupils to reflect on their individual learning process</i>	.819	
<i>guiding each pupil's learning progress by offering individual support</i>	.662	
SRMR .0508 / RMSEA .076 / TLI .920 / CFI .943		

results from EFA, 3 factors

CFA Teaching: Model 5: three layers, item 7 in subarea 3: standardised regression weights

		factor score 'Teaching'
	factor score 'Planning and Design of Lessons'	
<i>obtaining, viewing and developing teaching materials</i>	.499	.547
<i>varying methods in the design of lessons</i>	.622	
<i>creating an obvious underlying structure for each lesson</i>	.811	
<i>creating a lesson according to the learning objective</i>	.750	
	factor score 'Enhancement of Pupils' Motivation and Performance'	
<i>including pupils' mistakes in the learning process</i>	.768	.787
<i>analysing pupils' mistakes</i>	.753	
<i>motivating pupils to learn</i>		
	factor score 'Support for Independent Learning Strategies in Pupils'	
<i>supporting independent learning strategies in pupils</i>	.711	.944
<i>encouraging pupils to reflect on their individual learning process</i>	.786	
<i>guiding each pupil's learning progress by offering individual support</i>	.655	
<i>motivating pupils to learn</i>	.593	
SRMR .0455 / RMSEA .069 / TLI .934 / CFI .953		



Exploratory Factor Analysis – ‘Teaching’

EFA (PCA) Teaching

	component 1	component 2
Area ‘Planning and Design of Lessons’		
<i>obtaining, viewing and developing teaching materials</i>		.655
<i>varying methods in the design of lessons</i>		.678
<i>creating an obvious underlying structure for each lesson</i>		.834
<i>creating a lesson according to the learning objective</i>		.792
Area ‘Enhancement of Pupils’ Motivation and Performance’		
<i>including pupils’ mistakes in the learning process</i>	.708	
<i>analysing pupils’ mistakes</i>	.714	
<i>motivating pupils to learn</i>	.605	
Area ‘Support for Independent Learning Strategies in Pupils’		
<i>supporting independent learning strategies in pupils</i>	.699	
<i>encouraging pupils to reflect on their individual learning process</i>	.794	
<i>guiding each pupil’s learning progress by offering individual support</i>	.706	
Total of explained variance	31.5 %	2.41 %

EFA (PCA) Teaching: 3 factors

	component 1	component 2	component 3
Area ‘Planning and Design of Lessons’			
<i>obtaining, viewing and developing teaching materials</i>		.661	
<i>varying methods in the design of lessons</i>		.670	
<i>creating an obvious underlying structure for each lesson</i>		.828	
<i>creating a lesson according to the learning objective</i>		.785	
Area ‘Enhancement of Pupils’ Motivation and Performance’			
<i>including pupils’ mistakes in the learning process</i>			.781
<i>analysing pupils’ mistakes</i>			.836
Area ‘Support for Independent Learning Strategies in Pupils’			
<i>motivating pupils to learn</i>	.549		
<i>supporting independent learning strategies in pupils</i>	.810		
<i>encouraging pupils to reflect on their individual learning process</i>	.778		
<i>guiding each pupil’s learning progress by offering individual support</i>	.716		
Total of explained variance	24.05 %	23.58 %	16.31 %



Cronbach's Alpha – 'Teaching'

Cronbach's Alpha : single tests for 'Teaching', subarea 1, 2 and 3

	Subarea	Teaching
Area 'Planning and Design of Lessons' <i>obtaining, viewing and developing teaching materials</i> <i>varying methods in the design of lessons</i> <i>creating an obvious underlying structure for each lesson</i> <i>creating a lesson according to the learning objective</i>	.760	.829
Area 'Enhancement of Pupils' Motivation and Performance' <i>including pupils' mistakes in the learning process</i> <i>analysing pupils' mistakes</i> <i>motivating pupils to learn</i>	.706	
Area 'Support for Independent Learning Strategies in Pupils' <i>supporting independent learning strategies in pupils</i> <i>encouraging pupils to reflect on their individual learning process</i> <i>guiding each pupil's learning progress by offering individual support</i>	.759	



Summary

1. three different methods lead to four different outcomes

- CFA: multidimensionality in accordance to the theoretical foundation can only be tested by CFA
 - items number 1 and 7 show unsatisfactory factor loadings in the CFA of .50 and .59 in model 1
 - exclusion of item 1 leads to a worse fit of model 3
 - exclusion of item 7 in model 4 increases model fit
 - reallocation of item 7 to subarea 3 improves model fit but is below model 3
 - three layered model with three subareas should be maintained and item number 7 excluded
- EFA 1
 - two layered model where methodical demands of teaching make up one subarea and social pupil centred demands another
- EFA 2: results suggest a model which fits the empirical correlation matrix worse than a model which excludes the item
 - forced to extract three factors, EFA produces three subareas assigning item number seven to the third subarea
- Cronbach's Alpha: differing number of items for the subscales and the teaching scale as one will lead to better results for the 11 item scale
 - one layered model seems suitably represented by the 11 items of the scale, the subareas seem less consistent



Discussion

Statistical Reliability vs. Content Validity

1. CFA: three layered model with three subareas should be maintained and item number 7 excluded
2. EFA: forced to extract three factors, EFA produces three subareas assigning item number 7 to the third subarea
3. Item number 1: 'obtaining, viewing and developing teaching materials' should not be discarded on theoretical grounds
 - represents major part of the construct 'Planning and Design of Lessons'
 - represents the preparation of lessons
 - remaining three items focus on the design and realisation of lessons

→ excluding this item would lead to the exclusion of a theoretical aspect of the a priori defined meaning of the construct
4. Item number 7: 'motivating pupils to learn' should not be discarded on theoretical grounds
 - represents major aspect of the 'Enhancement of Pupils' Motivation and Performance'
 - items 5 and 6 represent the inclusion of errors in learning to motivate pupils

In these cases, the decision is pretty arbitrary and could go either way, because statistical reliability contradicts theoretical reasoning.



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