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## Students' Evaluation of Teaching at a Large Italian University: Measurement Scale Validation

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**Keywords:** validity, reliability, dimensionality, didactic activity evaluation, higher education

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## 1. Students' evaluation of teaching: issues from literature

Students' perception and evaluation of teaching quality plays a major role in higher education. Evaluations of teaching are widespread and the role of students seems relevant, as *students' evaluations of teaching* (called SETs) seem to be an almost universally accepted method of gathering information about the quality of education (Zabaleta 2007).

Moreover SETs make it possible to involve students into the higher education processes, as stated in many European documents. Specifically, the documents produced within the Bologna Process by National Unions of Students in Europe (ESIB, now ESU) underline the importance of involving students in the evaluation processes in order to promote a growth in awareness of being part of university life. The recent *Bologna with Student Eyes* (European Students' Union 2015) affirms that students participation in higher education governance has advanced slightly in recent years but many barriers are still in place, preventing or limiting the involvement of students at all levels. In most countries, they are *seen but not heard*.

Moreover, the European University Association (EUA 2006) Report on the Quality Culture Project (2002-2006) highlights some important issues related to student evaluations of teaching. The process fails when it stops right there and does not go further. This is also because of the structure of the questionnaire: it should be developed in a way that allows to produce clear and useful results. Moreover, the document suggests to organize meetings in order to discuss the evaluation results and to plan improvement actions. Scientific literature about SETs provides

relevant issues, too: the importance of involving students in evaluation processes comes to light (Svinicki & McKeachie 2011; Theall & Franklin 2007), as well as the need to obtain significant information that could be used for improvement. SETs are in fact seen as a valuable tool designed to improve both students' learning and teaching performance (Zabaleta 2007). This is possible if the results from SETs are interpreted and used in order to have an impact on teaching and if students' feedback is collected and transformed into a stimulus for improvement. This way, it can become a source of change. Nonetheless, many teachers do not find SETs very helpful for such formative purposes, so they tend to ignore the comments and suggestions given by students (Spooren et al. 2013). Finally, a general consensus concerns the need to consider multiple sources of information, as *no single source of information – including student ratings – provides sufficient information to make a valid judgment* (Benton & Cashin 2012).

Spooren et al. (2013) affirm that several thousands of research studies have appeared since the publication of the first report on SETs in 1927, addressing various elements, among which it is possible to focus the attention on two aspects. The first one is represented by the validity of students' opinions and their relationship to possible biasing factors. The second one concerns the development of the instrument: *what constitutes good teaching?, what is quality of teaching?*.

One of the major issues in the scientific literature about SETs concerns *the extent to which students are capable of providing appropriate teacher evaluations* (Spooren et al. 2013). This is mainly related to the relationship of students' perceptions to some factors that are unrelated to good teaching (Aleamoni 1999; Marsh 1987, 2007b; Marsch & Roche 1997; Centra 2003; Clayson 2009). A recent review (Spooren et al. 2013) proposes to divide the possible biasing factors in student-related, teacher-related and course related characteristics that might affect SETs. In particular, the relationship of SETs to both course workload and students' grade expectations continue to provoke discussions among researchers. The factors are the following:

- student-related factors: class attendance, students' effort, expected and final grade, gender, age, pre-course interest and motivation;
- teacher-related factors: age, gender, reputation, research productivity, teaching experience, personal traits;
- course-related factors: class size, class attendance rate, class heterogeneity, course difficulty and workload, discipline, level.

In some cases, the findings concerning the relationships between SETs and the characteristics of students, courses, and teachers are contradictory so they do not promote any conclusive idea of factors that could potentially bias SETs scores. However, the effect of the possibly biasing factors on SETs is relatively small and this has to be taken into account. Beran and Violato (2005), Spooren (2010), Smith et al. (2007) found that various characteristics explained only a minimal portion of the total variance in SETs scores. The same results are emerging in a study carried out in University of Padua (Dalla Zuanna et al. 2015)

A clear definition and understanding of what good teaching is, represents a pre-requisite for the development of reliable SETs instruments. Nevertheless, it is really complex to define the quality of something because it depends on various elements: «Quality is not a unitary concept, it is open to multiple perspectives. Different interest groups, or stakeholders, have different priorities» (Newton 2007, 15). Moreover, the meaning of quality itself seems critical. In 1993 Harvey and Green proposed five conceptions of quality: excellence, perfection, fitness for purpose, value for money and transformation. This last term gives back to quality its real meaning: the contribution to change (*quality is transformation*, Harvey 2006).

Considering the great number of instruments available to students for assessing teaching quality, it is clear that, although it has been reached some level of consensus regarding the characteristics of *effective or good teaching* (Spooren et al. 2013), existing SETs instruments vary widely in the dimensions that they try to capture.

The need for a common framework of good teaching emerges, as well as the fact that it should be shared by all stakeholders (i.e., administrators, teachers, and students) involved in the definition of the framework itself (Kember et al. 2004; Onwuegbuzie et al. 2007; Kember & Leung 2011; Pozo-Munoz et al. 2000; Goldstein & Benassi 2006). If SETs do not reflect the students' perspective concerning good teaching, the face validity of SETs instruments (i.e., the extent to which the items of a SETs instrument appear relevant to a respondent) is threatened.

As Spooren et al. (2013) affirm, several well-designed and validated instruments are available, including for example the *Instructional Development and Effectiveness Assessment* (Cashin & Perrin 1978), the *Students' Evaluation of Education Quality* (Marsh 1982; Marsh et al. 2009), the *Course Experience Questionnaire* (Ramsden 1991), the *Student Instructional Report* (Centra 1998), as well as the more recent *Students' Evaluation of Teaching Effectiveness Rating Scale* (Toland & De Ayala 2005), the *Student Course Experience Questionnaire* (Ginns, Prosser, & Barrie 2007), the *Teaching Proficiency Item Pool* (Barnes et al. 2008), the *SET37* questionnaire for student evaluation of teaching (Mortelmans & Spooren 2009), the *Exemplary Teacher Course Questionnaire* (Kember & Leung 2008), the *Teaching Quality Framework* (Chalmers 2007). The dimensions on which consensus has been reached are the following: subject knowledge, course organization, helpfulness, enthusiasm, feedback, interaction with students.

Another important issue emerging from the literature about good teaching concerns the necessity for SETs instruments to capture the multidimensionality and the complexity of teaching (Roche & Marsh 2000; Rindermann & Schofield, 2001; Saroyan & Amundsen, 2001; Domenech & Descals, 2003; Semeraro, 2006a, 2006b, 2006c; Apodaca & Grad 2005; Burdsal & Harrison 2008; Cheung 2000; Harrison, Douglas, & Burdsal 2004; Mortelmans & Spooren 2009)

## 2. Scope of the study

The early surveys on SETs have been carried out since the 1998-1999 academic year in some Faculties and Degree Courses (DCs) of the University of Padua- which is one of the ten largest public institutions (around 61,000 students and 170 DCs), and is quite representative of the Italian higher education system (42 Departments of all the scientific and didactic areas).

Since 1999-2000 the survey has been involving all students who have been attending lessons of any Faculty of the Athenaeum, and since 2010-2011 it reaches all enrolled students via web.

The purposes of the survey are: (i) to make the point of view of the students and their level of satisfaction about the didactic activity come to light; (ii) to make teachers and boards of the DCs develop processes of reflection about their work; (iii) to raise the quality of the whole University's offer and to lead to a general improvement of the didactics.

The scope of this paper is to validate the scale used by the University of Padua in the academic year 2012-2013 to measure student satisfaction. Specifically, we want to verify if the scale has the properties of validity and reliability and if it is unidimensional or more than one latent construct is measured with the items. Moreover, we want to verify the properties and the meaning of the two indicators published on the University webpage: satisfaction with organizational aspects and satisfaction with efficacy of didactics.

## 3. The items

In the academic year 2012-2013, the questionnaire proposed to the students began with two introductory questions: the first one asked if the student was available to participate in the survey (if the student was not, no other question was posed), the second one asked what percentage of the lessons of the course under judgement was attended by the student. If the student attended less than 30% of the lessons, he was asked to answer only to 7 selected items and to a question on why he attended so few classes; otherwise, all 18 items were proposed. In the following, the 18 items composing the scale to measure student satisfaction in the case of more than 30% of classes

attended is reported. Students were asked to express their level of satisfaction on a scale from 1 to 10, being 1 the lowest level.

Item 01 At the beginning of the course, were aims and topics clearly outlined?

Item 02 Were examination arrangements clearly stated?

Item 03 Was classes timetable observed?

Item 04 Is the number of lessons adequate to the course program?

Item 05 Is preliminary knowledge sufficient to understand all topics?

Item 06 Does the teacher stimulate interest towards the topic?

Item 07 Does the teacher clearly explain?

Item 08 Is the suggested material for study adequate?

Item 09 Is the teacher available to the needs of the students?

Item 10 Was the teacher available during office hours?

Item 11 Are laboratories/practical activities/workshops, if included, adequate?

Item 12 Are classrooms adequate?

Item 13 Are rooms for laboratories/practical activities/workshops adequate?

Item 14 How much are you satisfied about this course?

Item 15 Is the requested workload proportionate to the number of credits assigned to the course?

Item 16 Independently on how the course was taught, how much are you interested in the topic?

Item 17 How much is the course consistent with the whole degree?

Item 18 Does the course prepare to work?

The University of Padua publishes on its webpage part of the information collected with the above questionnaire. Specifically, for each teacher and course, the following indicators are published: the overall level of satisfaction based on item 14; an indicator related to the organizational aspects of the course, obtained as the arithmetic mean of items 01 (clarity of scopes), 02 (examination arrangements), and 08 (observance of timetable); an indicator related to efficacy of didactics, obtained as the arithmetic mean of items 06 (interest stimulation), 07 (clear explanation), and 09 (availability to needs of the students). Starting from the subsequent academic year 2013-2014, item 09 was eliminated by the indicator.

## 4. The validation protocol

In order to validate the measurement scale, we follow the traditional procedure proposed in the psychometric literature. In using, evaluating or developing multi-item scales, a number of guidelines and procedures are recommended, to ensure that the measure is psychometrically as sound as possible. These procedures have been defined in the psychometric literature since the late 1970s. Traditionally, with some exceptions, the literature follows the procedure outlined by Churchill (1979) who identified a number of steps to take in developing a measure. These steps refer to construct and domain definition, and scale validity, reliability, dimensionality and generalisability (Bassi 2010).

Validity is the degree with which the concept to be measured coincides with the phenomenon under study. In other words, a scale is valid when it measures the declared construct so that differences in the measures are due only to real differences among the objects under investigation and not to any other factor. To verify validity, external information and criteria are needed. Items should exhibit content validity - that is, they must be consistent with the theoretical domain of the construct. Usually this property is achieved by items screened by judges with expertise in the reference literature and/or pilot tests on samples from the relevant population. In this context, items are also judged on their readability, clearness and redundancy. Short and simple items are, in general, easier to understand by respondents and, as a consequence, should guarantee more reliable answers (Clark & Watson 1995). In summary, items should be clear and representative of the

construct under measurement. Criterion validity is the degree of correspondence between the measure and a criterion variable, usually assessed by their correlation. To evaluate criterion validity, we need a variable that gives us a standard with which to compare our measure. This standard is usually obtained with an item in the questionnaire that measures overall satisfaction. Univariate analysis of variance (ANOVA; for the method, see Malhotra 1999), with the total score as dependent variable and the criterion variable as factor, can also be used to confirm criterion validity. If the average total score is significantly different among the levels of the criterion variable, the scale can be considered valid. Construct validity assesses whether a measure relates to other observed variables in a way that is consistent with theoretically derived predictions (De Vellis 1991).

A measure is considered reliable to the extent that independent but comparable measures of the same trait or construct of a given object match. Reliability is a necessary but not sufficient condition of validity. Reliability indicators are calculated with the collected data. High inter-item correlations, for example, indicate that items are drawn from the domain of a single construct, whereas low inter-item correlations indicate that some items are not drawn from the appropriate domain and are producing error. High inter-item correlations, together with high item-to-total correlations, show that the scale is internally consistent. The reference literature (see, for example, Litwin 2005) suggests that a minimum level of 0.30 of the correlation coefficient is necessary to assess the property. Cronbach's alpha coefficient (Cronbach 1951) is recommended as a measure of internal consistency, together with other indexes like Guttman G and Spearman-Brown Y. Cronbach's alpha is a measure of the proportion of total variance that can be attributed to the phenomenon under measure and is shared by all items. The index varies between 0 and 1: values very near to 0 indicate a low level of reliability, the contrary is true for values near 1. The reference literature suggests that a minimum level of the coefficient of 0.70 is necessary for the scale to be considered reliable (Nunnally 1978). Other indexes are used to evaluate reliability that are based on split-half techniques. Items are split into two equivalent groups. A scale is reliable if indicators of internal consistency (correlation coefficients, alpha, G, Y) assume similar values in the two groups and if the mean values of the scale are not statistically different, applying a t-test. Another technique consists in dividing the sample at random into two subsample (the so-called split-half sample procedure) and comparing internal consistency indexes. Again, if indexes and means do not differ in the two groups of respondents, reliability is assessed. In this phase, scale dimensionality is also evaluated. The domain of a construct may be uni- or multidimensional. Various instruments are proposed in this context. Factor analysis is suggested, to determine the number of dimensions underlining the construct. Scale unidimensionality is considered a prerequisite for reliability and validity: for example, if a scale is multidimensional, reliability must be assessed for each dimension.

**Table 1.** Filled in questionnaires by percentage of classes attendance and degree of the respondent

Attendance	Type of degree				
	Erasmus	Bachelor	Master	5-years long	Total
<b>Non-attendant</b>	19.2	6.4	12.6	7.8	7.9
<b>Less than 30%</b>	6.3	3.0	2.8	2.3	2.9
<b>Between 30 and 50%</b>	9.5	4.8	4.2	3.4	4.5
<b>Between 50 and 70%</b>	18.9	11.3	11.4	10.0	11.2
<b>More than 70%</b>	46.1	74.5	69.1	76.5	73.4
<b>Total</b>	3,496	124,445	33,548	34,614	196,103

In the academic year 2012-2013, 253,318 questionnaires were proposed to the students. Only 196,103 (77.4% of total) were effectively filled in, while 57,215 were reused. Table 1 reports the filled in questionnaires classified by the percentage of classes and the degree attended by the respondent on the basis of the answer to the introductory question. Table 2 lists the number of

evaluated didactic activities and the average number of filled in questionnaires by degree of the respondent.

**Table 2.** Number of evaluated didactic activities and average number of filled in questionnaires by degree of the respondent

Bachelor	Master	5-years long	Total
Number of activities			
4,543	2,035	1,889	8,467
With at least 15 filled in questionnaires			
2,408 (53%)	783 (38%)	664 (35%)	3,855 (46%)
Average number of filled in questionnaire per didactic activity			
27.9	16.6	18.5	23.1

All items are sufficiently correlated among each other (inter-item correlation coefficients are all greater than 0.30 and statistically significant) and with item 14, which measures overall satisfaction. The highest levels of correlation regard clearness of exposition by the teacher, that comprises clear course aims, exam arrangements, explanation and study material.

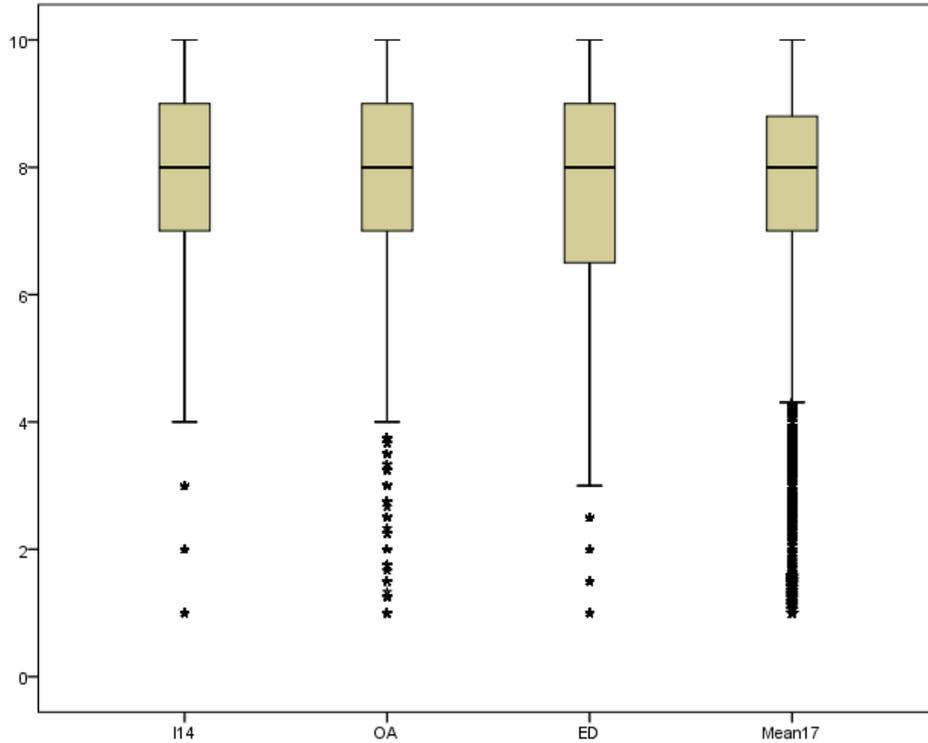
It is important to state that the validation procedure refers to the data coming from 163,626 questionnaires (65% of the total). We eliminated all questionnaires filled in by students who attended less than 50% of classes (8,412), by Erasmus students (2,272), and with evident errors (8). Table 3 lists the number of questionnaires, the mean, the median value and the standard error for item 14 (overall satisfaction), the mean level of satisfaction with the 17 items, and the two indicators of satisfaction with organizational aspects (OA) and efficacy of didactics (ED) by the degree of the respondent student.

**Table 3.** Number of questionnaires, mean, median and standard deviation of the main indicators of satisfaction by degree of the student

	Degree	Questionnaires	Mean	Median	Standard dev.
<b>Overall satisfaction</b>	5-years	28,852	7.63	8.00	1.97
	Master	26,195	7.58	8.00	1.94
	Bachelor	104,757	7.46	8.00	1.97
	Total	159,804	7.51	8.00	1.96
<b>Organisational aspects</b>	5-years	29,091	7.98	8.25	1.61
	Master	26,312	7.99	8.00	1.53
	Bachelor	105,398	7.91	8.00	1.57
	Total	160,801	7.94	8.00	1.57
<b>Efficacy of didactics</b>	5-years	29,020	7.85	8.00	1.85
	Master	26,288	7.90	8.00	1.78
	Bachelor	105,166	7.69	8.00	1.87
	Total	160,474	7.75	8.00	1.85
<b>Mean over the 17 items</b>	5-years	29,108	7.88	8.00	1.47
	Master	26,316	7.89	8.00	1.36
	Bachelor	104,455	7.71	8.00	1.46
	Total	160,879	7.77	8.00	1.45

The overall satisfaction (item 14) is always lower than the mean level obtained with the 17 items and lower than the other two indicators OA and ED. Comparing mean and median values, it appears that the distribution of the answers to the items is asymmetric, this is also due to the presence of a non-negligible number of outliers (see, Figure 1). Table 4 lists descriptive statistics of all 18 items. It is important to notice that all items suffer from missing data, especially, items 10, 11 and 13; we will take this into account in the following analyses. Specifically, we will use two

strategies: (i) pairwise, i.e., only cases with a missing data on a variable under treatment are eliminated, this means that each statistical analysis is performed on a different sample; (ii) listwise, i.e., all cases with at least one missing value are eliminated, in this case a sample of 54,777 questionnaires (33% of total) is used. Another interesting result, not reported for sake of space, is that as the percentage of attendance by the respondent student increases, also the level of satisfaction with all items increases.



**Figure 1.** Boxplot of the distributions of the four indicators of student satisfaction

**Table 4.** Descriptive statistics of the 18 items.

Item	Questionnaires	Mean	Standard deviation
Item 01 aims	158,944	7.92	1.82
Item 02 examination	158,027	8.00	1.90
Item 03 timetable	160,230	8.34	1.77
Item 04 lessons	146,599	7.71	1.97
Item 05 knowledge	160,196	7.36	1.98
Item 06 stimulus	160,195	7.55	2.13
Item 07 clearness	160,189	7.61	2.09
Item 08 material	159,806	7.49	2.05
Item 09 availability	159,728	8.11	1.86
Item 10 office	78,302	8.21	1.86
Item 11 workshops	98,248	7.75	2.00
Item 12 rooms	160,139	7.53	2.11
Item 13 laboratories	100,206	7.54	2.09
Item 14 overall	160,084	7.51	1.96
Item 15 workload	159,889	7.34	2.09
Item 16 interest	160,018	7.99	1.88
Item 17 consistency	157,240	8.19	1.85
Item 18 work	148,954	7.71	2.01

Item internal consistency aims at verifying if items measure the same underlying construct, in this case, student satisfaction. We performed this analysis on the 17 items constituting our scale, without item 14, which evaluates overall satisfaction and that we will use as a golden standard to assess validity. Table 5 lists item-to-total correlation coefficients; these, together with correlation coefficients, indicate that our measurement instrument is reliable. Item-to-total correlation coefficients are all greater than 0.60 and statistically significant; they are calculated on the subsample of questionnaires without missing data on the 17 items.

**Table 5.** Item-to-total correlation coefficients

Item	Coefficients
Item 01 aims	0.864
Item 02 examination	0.830
Item 03 timetable	0.791
Item 04 lessons	0.813
Item 05 knowledge	0.718
Item 06 stimulus	0.877
Item 07 clearness	0.877
Item 08 material	0.855
Item 09 availability	0.862
Item 10 office	0.848
Item 11 workshops	0.851
Item 12 rooms	0.618
Item 13 laboratories	0.673
Item 15 workload	0.784
Item 16 interest	0.832
Item 17 consistency	0.807
Item 18 work	0.788

**Table 6.** Factor analysis on the 17 items. Loadings of the 3-component solution

Item	Component 1	Component 2	Component 3
Item 01 aims	<b>0.757</b>	0.355	
Item 02 examination	<b>0.758</b>		
Item 03 timetable	<b>0.720</b>		
Item 04 lessons	<b>0.706</b>		
Item 05 knowledge	0.422	0.403	
Item 06 stimulus	<b>0.688</b>	0.524	
Item 07 clearness	<b>0.753</b>	0.434	
Item 08 material	<b>0.712</b>	0.372	
Item 09 availability	<b>0.785</b>		
Item 10 office	<b>0.793</b>	0.360	
Item 11 workshops	<b>0.687</b>	0.382	0.332
Item 12 rooms			<b>0.914</b>
Item 13 laboratories			<b>0.866</b>
Item 15 workload	<b>0.570</b>	0.349	
Item 16 interest	0.384	<b>0.801</b>	
Item 17 consistency		<b>0.858</b>	
Item 18 work		<b>0.834</b>	

Pairwise elimination, only coefficients > 0.30 are reported

Table 6 lists the results of factor analysis on the 17 items composing our scale. Factors are obtained through principal component analysis and a Varimax rotation is applied (Hair et al. 2006). Three components show an eigenvalue greater than 1, which explain 71% of total variance. Looking

at factor loadings, it is clear that the first factor is linked to items 01 (aims), 02 (examination), 03 (timetable), 04 (lessons), 06 (stimulus), 07 (clearness), 08 (material), 09 (availability), 10 (office), 11(workshops) and 15 (workload), representing satisfaction with organizational aspects and efficacy of didactics. The second factor is linked to items 16 (interest), 17 (consistency) and 18 (work), related to course contents. The third factor is linked to items 12 and 13 (rooms and laboratories). Table 7 compares the descriptive statistics of the indicators of satisfaction obtained as the arithmetic mean of the items linked to the three factors by the degree followed by the responding student. As it appears, the lowest level of satisfaction is related to the logistic aspects of the course (third factor), the highest to the contents of the course (second factor). The students in the Bachelor Degrees are the least satisfied.

**Table 7.** Descriptive statistics of the items related to the three factors by degree

Factor	Degree	Questionnaires	Median value	Mean value	Standard deviation
<b>1. Organisational aspects and efficacy of didactics</b>	5-years	29,106	8.00	7.83	1.55
	Master	26,316	8.00	7.84	1.47
	Bachelor	105,438	7.92	7.71	1.55
	Total	160,860	8.00	7.75	1.54
<b>2. Contents</b>	5-years	28,966	8.33	8.17	1.69
	Master	26,277	8.33	8.08	1.70
	Bachelor	105,059	8.00	7.88	1.77
	Total	160,302	8.33	7.97	1.75
<b>3. Logistics</b>	5-years	28,933	8.00	7.66	1.98
	Master	26,244	8.00	7.85	1.89
	Bachelor	104,968	8.00	7.42	2.07
	Total	160,145	8.00	7.53	2.03

**Table 8.** Factor analysis on the 17 items. Loadings of the four-component solution

Item	Component 1	Component 2	Component 3	Component 4
Item 01 aims	<b>0.694</b>	0.319	0.348	
Item 02 examination	<b>0.740</b>			
Item 03 timetable	<b>0.775</b>			
Item 04 lessons	<b>0.559</b>		0.527	
Item 05 knowledge			<b>0.776</b>	
Item 06 stimulus	<b>0.590</b>	0.469	0.433	
Item 07 clearness	<b>0.654</b>	0.377	0.440	
Item 08 material	<b>0.603</b>	0.310	0.451	
Item 09 availability	<b>0.780</b>			
Item 10 office	<b>0.784</b>	0.357		
Item 11 workshops	<b>0.589</b>	0.326	0.432	0.303
Item 12 rooms				<b>0.911</b>
Item 13 laboratories				<b>0.856</b>
Item 15 workload	0.378		<b>0.628</b>	
Item 16 interest	0.339	<b>0.776</b>		
Item 17 consistency		<b>0.858</b>		
Item 18 work		<b>0.825</b>		

Pairwise elimination, only coefficients > 0.30 are reported

If we consider also the fourth factor, which explains another 4.4% of total variance, the factor loadings are those listed in Table 8. The fourth factor is linked to items 05 (preliminary knowledge)

and 15 (workload). Table 9 compares the descriptive statistics for the four factors by degree. The highest level of satisfaction is still with the contents of the course, the lowest with the aspects related to the fourth factor. Again, students in the Bachelor Degrees are the least satisfied.

**Table 9.** Descriptive statistics of the items related to the four factors by degree

Factor	Degree	Questionnaires	Median value	Mean value	Standard deviation
<b>1. Organisational aspects and efficacy of didactics</b>	5-years	29,099	8.10	7.91	1.61
	Master	26,313	8.14	7.95	1.52
	Bachelor	105,416	8.00	7.80	1.60
	Total	160,828	8.00	7.85	1.59
<b>2. Contents</b>	5-years	28,966	8.33	8.17	1.69
	Master	26,277	8.33	8.08	1.70
	Bachelor	105,059	8.00	7.88	1.77
	Total	160,302	8.33	7.97	1.75
<b>3. Previous knowledge and workload</b>	5-years	29,018	7.50	7.51	1.70
	Master	26,296	7.50	7.38	1.68
	Bachelor	105,252	7.50	7.29	1.77
	Total	160,566	7.50	7.34	1.75
<b>4. Logistics</b>	5-years	28,933	8.00	7.66	1.98
	Master	26,244	8.00	7.85	1.89
	Bachelor	104,968	8.00	7.42	2.07
	Total	160,145	8.00	7.53	2.03

The above results help in explaining the difference between overall satisfaction measured with item 14 and with the arithmetic mean of the 17 items (see Table 4). Factor analysis, in fact, suggests the following considerations:

- The 17-item measurement scale is not unidimensional.
- The scale is composed by a first and main dimension linked to items more strictly related to the teacher and his/her organizational activity and efficacy of didactics.
- This first dimension is composed by the two indicators published by the University of Padua (OA and ED).
- The component of the measurement scale associated to the contents of the course shows the highest level of student satisfaction.
- The component of the measurement scale associated to preliminary knowledge and workload has the lowest level of student satisfaction.

The items associated to the second factor (contents) are proposed to the respondent after the question on overall satisfaction; this may, at least partially, explain why satisfaction measured with item 14 is systematically lower than that obtained with the arithmetic mean of the 17 items.

The values of the Cronbach's alpha index is equal to 0.971, indicating a high level of internal consistency of the 17 items composing the measurement scale. Table 10 lists the value of the coefficient when an item is deleted. If eliminating one item, the alpha index increases, it means that the item is not sufficiently correlated with all others. In our case, the only item that shows this problem is 12, measuring satisfaction with classrooms. Items 13 (laboratories) and 05 (preliminary knowledge), if eliminated, do not affect the value of the alpha index.

To evaluate internal consistency, it is also necessary to calculate other specific measures such as the split-half item coefficients, Spearman-Brown Y and Guttman G. These indexes imply a random partition of the items, following the hypothesis that if all items measure the same underlying

construct, random subgroups of items should give measures that are correlated and not statistically different.

In our application, the 17 items are divided into two random groups (one with 8 and the other with 9 items) and Table 11 lists split-half coefficients calculated on the two independent partitions. All these indexes are high and very similar in the two groups. Moreover, the mean satisfaction in the two groups is 7.88 and 7.85, respectively. These values are not statistically different.

**Table 10.** Cronbach's alpha if item is deleted

Item	Coefficient
Item 01 aims	0.969
Item 02 examination	0.969
Item 03 timetable	0.970
Item 04 lessons	0.969
Item 05 knowledge	0.971
Item 06 stimulus	0.968
Item 07 clearness	0.969
Item 08 material	0.969
Item 09 availability	0.969
Item 10 office	0.969
Item 11 workshops	0.969
Item 12 rooms	0.972
Item 13 laboratories	0.971
Item 15 workload	0.970
Item 16 interest	0.969
Item 17 consistency	0.969
Item 18 work	0.970

Listwise elimination

**Table 11.** Split-half item analysis

Cronbach's alpha	Partition 1	Value	0.944
		Number of items	9
	Partition 2	Value	0.938
		Number of items	8
Correlation coefficient			0.971
Spearman-Brown Y			0.985
Guttman G			0.982

Listwise elimination

Partition 1: items 01, 03, 05, 07, 09, 11, 13, 15, 17

Partition 2: items 02, 04, 06, 08, 10, 12, 14, 16, 18

The split-half sample procedure is a statistical technique which is traditionally employed to evaluate the reliability of a measurement scale. It is based on the hypothesis that a reliable instrument has to obtain equal results on random subsamples from the same population or on equivalent populations. To perform this analysis, the sample of respondents is randomly divided into two partitions with approximately the same dimension. It is of fundamental importance that the two subgroups are obtained with a random procedure to guarantee that the two groups are equivalent subsamples. It is then possible to analyze each item constituting the scale in order to verify if it behaves consistently in the two subsamples. In other words, the mean values registered by each item in the two groups of respondents are compared applying a t-test to evaluate if there are statistically significant differences.

For each of the 18 items, the means in two equivalent subsamples of respondents were compared, obtaining that couples of means are not statically different, except for item 12 (classrooms).

For what concerns content validity, the property is guaranteed by the fact that, as already mentioned, the items were judged by a group of experts operating in various committees of employees of the University of Padua who worked following the guidelines of National Agency for University Evaluation (ANVUR).

To verify criterion validity, we use the answers to item 14, which refers to overall satisfaction, as a golden standard. The correlation coefficient among this item and the mean value of satisfaction obtained with the other 17 items in our sample is 0.875 and it is statistically significant. This result shows that the measurement scale is valid. This evidence is also confirmed performing an Analysis of Variance (ANOVA) that shows that the mean of the 17 items has statistically different values for different responses to the item 14.

The University of Padua publishes every year three indicators of student satisfaction related to every teacher who teaches a course or a part of it: the mean over the sample of respondents of overall satisfaction (item 14) and the indicators OA and ED, obtained considering items 01 (clearness of aims), 02 (examination arrangements), 03 (timetable observation), 08 (study material) and 06 (teacher stimulated interest), 07 (teacher explains clearly), 09 (teacher available to students' needs), respectively. To validate these indicators, we consider the sample of questionnaires filled in by students who attended at least 50% of classes, excluding Erasmus students. 155,330 questionnaires are available to validate indicator OA and 158,821 to validate indicator ED. The values of the Cronbach's alpha coefficient for indicator OA is 0.855. Eliminating one item at the time, the new coefficient ranges from 0.781 to 0.849, showing internal consistency. The same conclusion can be drawn looking at item-to-total correlation coefficients (Table 12).

**Table 12.** Arithmetic mean, item-to-total correlation coefficients and Cronbach's alpha if item is deleted, indicators OA and ED

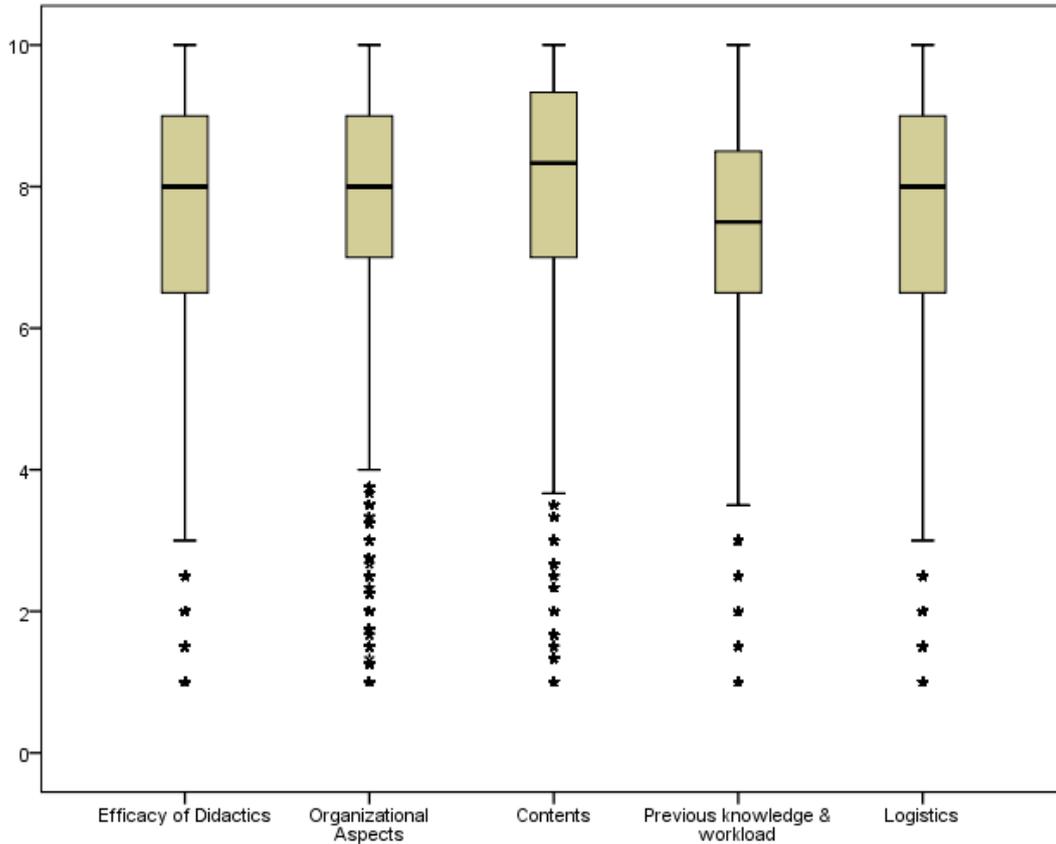
Item	Mean	Item.to-total correlation	Cronbach's alpha if deleted
Indicator OA			
Item 01 aims	7.91	0.775	0.781
Item 02 examination	8.00	0.732	0.798
Item 03 timetable	8.34	0.607	0.849
Item 08 material	7.49	0.677	0.824
Indicator ED			
Item 06 stimulus	7.55	0.842	0.819
Item 07 clearness	7.62	0.846	0.815
Item 09 availability	8.11	0.724	0.919

For the indicator ED, the value of the Cronbach's alpha coefficient is 0.899. Deleting one item at the time, it ranges from 0.815 to 0.918 (Table 12). Elimination of item 09 would increase the internal consistency of the indicator. The same adjustment is suggested by the value of the item-to-total correlation coefficient. The University of Padua decided not to include item 09 in the ED measure starting from the academic year 2013-2014.

For what concerns validity, the correlation coefficient among each indicator and the golden standard, item 14, is equal to 0.800 for OA and to 0.876 for ED, confirming in both cases the property. This result, moreover, shows that the two indicators are strictly related to overall satisfaction with the course. Factor analysis identifies for both these measures one underlying main factor explaining 80 per cent of total variance in the case of OA and 83 per cent, in the case of ED.

Stimulated by the above evidences, we decided to estimate a linear regression model in order to verify to what extent the two indicators of satisfaction with organizational aspects and efficacy of didactics explain the measure of overall satisfaction (item 14). Table 13 lists model estimation

results. The dependent variable is overall satisfaction, predictors are the two measures of OA and ED and the indicators obtained with the items linked to the latent factors measuring satisfaction with course contents, logistics, previous knowledge and workload. The models explains over 80% of total variance ( $R^2=0.812$ ).



**Figure 2.** Boxplot of the distributions of the explanatory variables of the regression model

**Table 13.** Linear regression with item 14 as dependent variable

	<b>Coefficients</b>	<b>Standardized coefficients</b>	<b>t statistics</b>
Intercept	-0.721		-58.091
OA	0.543	0.560	286.616
ED without item 09	0.247	0.198	103.249
Contents	0.155	0.138	89.430
Previous knowledge & workload	0.094	0.084	54.174
Logistics	0.031	0.032	26.552

As model estimation shows, the distinctive aspects of a course have a different impact on overall satisfaction. Figure 2 contains the boxplot of the explanatory variables of our estimated regression model: distributions are clearly asymmetric and outliers are present.

The indicator of organizational aspects has the highest impact on overall satisfaction, followed by that of efficacy of didactics. These two indicators are strictly related to the teacher and his/her capabilities. The other aspects have a statistically significant but minor effect. Logistics has the lowest impact on student satisfaction. It is important also to notice that the intercept of the estimated linear regression model is statistically significant and negative. This result shows that there are factors, negatively related to satisfaction, that are not included in the measurement scale.

## 5. Conclusions

The scale used by the University of Padua to measure student satisfaction is valid and reliable. Specifically, it satisfies the properties of content and criterion validity. The two indicators of satisfaction with organizational aspects and efficacy of didactics are also valid and reliable. Our analysis confirms the opportunity to delete item 09 (availability to students' needs) from the ED indicator. The two indicators are highly correlated with overall satisfaction.

Some items show problems that deserve attention. For example item 12 that measures satisfaction with classrooms, if eliminated, produces a higher value of the Cronbach's alpha coefficient for the measurement scale. Items referring to rooms for laboratories and preliminary knowledge (13 and 05), if eliminated, produce the same value of the Cronbach's alpha index. The item measuring satisfaction with rooms for laboratories is critical also because it shows the lowest item-to-total correlation. Other items, especially that evaluating the presence in office-hours by teachers and the workshops and other practical activities (10 and 11) have a high percentage of missing data.

Factor analysis shows that the measurement scale is not uni-dimensional: there are four underlying latent factors. The main one explains 57% of total variance and it is linked to satisfaction with organizational aspects and efficacy of didactics. The other three factors, explaining 8, 7 and 4 additional per cent of variance, represent course contents, preliminary knowledge and workload, and logistics, respectively.

Student satisfaction with organizational aspects has the highest impact on overall satisfaction, as the estimation of a linear multiple regression model shows.

The above evidences, together with the results comparing satisfaction obtained as the arithmetic mean of the 17 items (7.77 in our sample), as answers to item 14 that measures overall satisfaction (7.51) and as arithmetic mean of the items associated to each of the four latent factors (7.84 for the principal factor, 7.97 for course contents, 7.53 for logistics, 7.34 for previous knowledge and workload), lead to the following considerations:

- 1) The scale to measure student satisfaction is valid and reliable, appropriate to evaluate didactics at our university.
- 2) The scale is multi-dimensional, only one dimension is strictly related to the teacher and activity with the students
- 3) It is, in this sense, necessary to better define the scopes of this evaluation exercise.
- 4) The arithmetic mean of the 17 items composing the scale measures a multi-dimensional concept, therefore it is not appropriate to evaluate overall satisfaction. Moreover, the fact that some items show a high percentage of missing data restricts significantly the sample of questionnaires for which this indicator can be computed.
- 5) The overall level of satisfaction shows systematically lower values than the other indicators of satisfaction that we consider. This might be due to the fact that some aspects linked to student satisfaction are not included in the 17 items. Another explanation for this result might be the position of the item measuring overall satisfaction in the questionnaire, before the items related to course contents which is an aspect, on average, evaluated with high scores.
- 6) The actual position in the scale of the item measuring overall satisfaction is not adequate to measure the different dimensions of student satisfaction, especially that linked to course contents.
- 7) Only the first latent factor is strictly linked to the teacher's activity.
- 8) This main dimension of satisfaction may be decomposed into two indicators, one due to organizational aspects and the other to efficacy of didactics.

A last comment is related to the choice of the best descriptive statistics to be used to communicate student satisfaction results to the public. At the moment, the arithmetic mean is used but, as Figures 1 and 2 outline, the distributions are asymmetric and the presence of outliers is non-negligible.

Taking into account these results about the validity and reliability of the scale used by the University of Padua, the need to improve the entire process of teaching evaluation emerges. The validated scale could be a good starting point to begin a discussion between teachers and students about “good teaching”: the results of the survey about students’ satisfaction could be analyzed together in order to understand each one’s position, by sharing and comparing different points of view.

This could activate mechanisms of real involvement of the principal stakeholders of teaching and learning activities, through which they could experience new kinds of participation in university life, and contribute to its change. It could be a process with the aim of transforming students' perceptions about their learning approach as well as teachers' conceptions about their role. This way, the results of an evaluation questionnaire could really become the basis for teaching quality improvement.

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