How Differences among Data Collectors are Reflected in the Reliability and Validity of Data Collected by Likert-Type Scales?

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Abstract
The purpose of this study is to investigate association of data collectors’ differences with the differences in reliability and validity of scores regarding affective variables (motivation toward science learning and science attitude) that are measured by Likert-type scales. Four researchers trained in data collection and seven science teachers who did not undergo any training, gathered data from 391 ninth-grade students. The data collection instruments were the “Motivation toward Science Learning Scale” and “Science Attitude Scale.” Data collection applications were conducted in four stages, two of which were accomplished four weeks apart by the researchers. The remaining two stages were accomplished four weeks apart by the teachers. A principal component analysis, confirmatory factor analysis, Cronbach’s alpha reliability analysis, Pearson correlation test for convergent validity, and t-test for the differences between the mean scores of each data collection stage were used for the data analysis. The results showed that motivation toward science learning and attitude toward science were high but the factor structures and reliability values, which were obtained by different data collectors, were different for the two scales. As another result, the convergent validity between the scores on the scales was shown to be sufficient for the measurements. However, the results of difference tests on the mean scores of the applications showed that there was a statistically significant difference between the mean scores of the two motivation scale applications by the teachers.

Keywords
Data Collector, Motivation toward Learning Science, Science Attitude, Validity, Reliability.

In science education literature, Likert-type scales are frequently used for data collection, but researchers prefer different data collectors when they carry out research using one type of scale. Although the same scale is used in different studies, the use of different data collectors might make an important difference in the research results (Fraenkel & Wallen, 2003). The differences arising from data collectors are...
The purpose of this study is to investigate how data collector differences are reflected in the reliability and validity of scores regarding affective variables (motivation toward science learning and science attitude) that are measured using Likert scales in science education.

In education literature, motivation and attitude are frequently researched affective factors (Bong, 2001; Dede & Yaman, 2008; Douglas, 2006; Kahyaoglu, 2013; Koballa & Glynn, 2007; Oğuz Çakir, 2011; Osborne, Simon, & Collins, 2003; Pintrich, 1999; Pintrich & DeGroot, 1990; Savran & Çakiroğlu, 2001; Serin, 2009; Simpson, Koballa, Oliver, & Crawley, 1994; Temiz, 2010; Wigfield & Eccles, 2000; Yenice, Saydam, & Telli, 2012) that are measured with Likert-type scales (Çavaş, 2011; Dede & Yaman, 2008; Savran & Çakiroğlu, 2001; Tuan, Chin, & Shieh, 2005; Yılmaz & Çavaş Huygüzül, 2007; Yumuşak, Sungur, & Çakiroğlu, 2007). Motivation is an affective characteristic that is effective on acting for reaching a purpose (Brophy, 1998). For research on motivation in science education, "Students' Motivation toward Science Learning (SMTSL)" developed by Tuan et al. (2005) is an important scale because it has been applied to large samples and has high values of reliability and validity. Moreover, this scale was adapted to Turkish by Yılmaz and Çavaş Huygüzül (2007). On the other hand, the "Science Attitude Scale (SAS)" developed by Geban, Ertepınar, Yılmaz, Atlan, and Şahpaz (1994) is another Likert-type scale used frequently in Turkey (Bilgin & Karaduman, 2005; Çavaş, 2011; Kenar & Balcı, 2012; Özyılmaz & Hamurcu, 2005; Tatar & Kuru, 2009; Ünal & Ergin, 2006). Both of these affective focused studies present information about the reliability and validity values, but no information is given about data collectors. Consequently, investigating the possible effect of data collector differences on validity and reliability is an important contribution for current science education studies and future studies that will use Likert-type scales.

The purpose of this study is to investigate how data collector differences are reflected in the reliability and validity of scores regarding affective variables (motivation toward science learning and science attitude) that are measured by Likert scales.

**Method**

In this study, reliability and validity values of the data gathered by different data collector groups were investigated by utilizing a survey approach (Karasar, 1999; Wallen & Fraenkel, 2001). The data were collected from 391 (184 female, 107 male) ninth-grade Anatolian high school students. The data collectors were four researchers (2 female, 2...
male) and seven science teachers (1 female, 6 male). The researchers received a two-week training on how to apply the scale (two hours per week). The training content consisted of introducing the research subject of the scale application, explaining the purpose of the application, stating possible advantages and disadvantages of the application, and explaining ethical subjects, dress style, and use of language. However, the teachers applied the scales without undergoing any training. In this study, the applications of the four data collection processes were conducted separately. These applications included two beginning scale applications and two scale applications implemented four weeks later. Figure 1 shows the model of the scale applications.

The data collection instruments were the SMTSL and SAS. The SMTSL, the original of the first scale, was developed by Tuan et al. (2005). Then the scale was adapted into Turkish by Yılmaz and Çavaş Huyugüzel (2007). The Turkish version of the scale consists of six factors (self-efficacy, active learning strategies, science learning value, performance goal, achievement goal, and learning environment stimulation) and includes 33 items. The result of the reliability analysis of the scores showed that Cronbach's alpha values of the factors were between .54 and .85; on the other hand, the reliability analysis of the total scores on the scale was .87. Two examples of the scale items are “When I find the science content difficult, I do not try to learn it” and “In science, I think that it is important to learn to solve problems.”

Construct Validity and Reliability

Findings Regarding Construct Validity and Reliability (SMTSL): The confirmatory factor analysis results for each application indicated that although ($X^2$/sd) was between 1.58 and 2.28, the other indexes for each application were not acceptable for the proposed factor model (GFI: .62-.71; CFI: .64-.77; RMSEA: .08-.11) (Hoyle, 2000; Marsh, Balla, & McDonald, 1988; Marsh & Hocevar, 1988; Raykov & Marcoulides, 2006). On the other hand, ($X^2$/sd) and RMSEA indexes showed differences between the trained and untrained data collectors in terms of focused variables. Because of the confirmatory analysis results, an exploratory factor analysis was carried out. Before the analysis, the Kaiser-Meyer-Olkin (KMO) measure of sample adequacy and Barlett's test of sphericity values were calculated. The results (KMO > .60, $p < .05$) showed that the data were suitable for factor analysis (Sharma, 1996; Tavşancıl, 2002). According to the principal component analysis, the scores collected by different data collectors revealed different factor structures and also explained that total variances are different for each application. The item loading values and loaded factors for each application were also different for the same instrument. The reliability results showed that the reliability value of each factor was quite different and between .34 and .86. The total reliability value for each data collector group was .82 and .89, respectively.

Findings

The findings of this study are presented under three main headings: construct validity and reliability, convergent validity, and a t-test for the differences between the mean scores in each application.
Findings Regarding Construct Validity and Reliability (SAS): The confirmatory factor analysis results for each application indicated that except for "X/sd" (1.40–3.45) and CFI value (.83–.95), the other indexes for each application are not acceptable for the proposed factor model (GFI: .77-.82; RMSEA: .08-.14) (Hoyle, 2000; Marsh, Balla, & McDonald, 1988; Marsh & Hocevar, 1988; Raykov & Marcoulides, 2006).

After the confirmatory factor analysis, it was decided to carry out an explanatory factor analysis. According to the KMO measure of sample adequacy and Barlett’s test of sphericity values (KMO > .60, p < .05), the data were suitable for factor analysis (Sharma, 1996; Tavşancıl, 2002). When the results of the principal component analysis were investigated, similar results with SMTSL were found, and also, the omitted items after analyses were not common for each application. The reliability of each factor was quite different, ranging from .60 to .92. The total reliability value for each data collector was .88 and .92, respectively.

Convergent Validity
The convergent validity was examined by investigating correlations between the scores on the motivation and attitude scales. The results indicated that there was a statistically significant and positive relationship between the scores of motivation and attitude for each application (r = .56-.66, p < .05). These results showed the expected results in terms of convergent validity (Singh, Graville, & Dika, 2002; Tuan et al., 2005).

T-Test for the Differences between the Mean Scores of Each Application
The results of difference tests between the mean scores of the applications showed that there was not any statistically significant difference between the mean scores of the two motivation and attitude scale applications by the researchers (tSMTSL = 1.66, p > .006; tSAS = 0.45, p > .006). Therefore, there was no practical importance of the results in terms of effect sizes (Coe, 2002).

The non-significant difference between the mean scores of the two attitude scale applications by teachers was also determined (tSAS = 0.51, p > .006). However, there was a statistically significant difference between the mean scores of the two motivation scale applications by the teachers (Z = 3.15, p < .006). Consequently, there was not any statistically significant difference between the mean scores of the researchers’ and teachers’ first and second motivation, as well as attitude scale applications (first application: tSMTSL = .39, p > .006; tSAS = 1.09, p > .006; second application: tSMTSL = .259, p > .006; tSAS = 0.95, p > .006).

Discussion and Suggestions
This study found that reliability and validity values differed significantly across the data collection applications. According to the confirmatory and explanatory factor analyses, factor structures, items loadings in the factors, and index values differed between the two applications conducted four weeks apart by the researcher and teacher. These differences may arise from differences in the data collectors’ characteristics despite their having had the same training (Fraenkel & Wallen, 2003). Especially, definite differences were seen among the applications of the teacher data collectors. For instance, an important difference is statistically significant between the two applications by the teachers. These findings show that motivation data obtained by teachers yielded two different results when collected at different times. Consequently, it can be speculated that this is a reflection of differences in the data collectors for construct validity and data stability of SMTSL. Total reliability values regarding the motivation scales were similar between the data of researchers and teachers. However, the important point is that the reliability of different factors cannot be compared because the factors do not share a common structure.

A look at the second variable of this study shows that attitude scores are different in terms of factor structures and reliability values. Attitude is suggested as a susceptible affective variable of data collector characteristics by Pol and Ponzurick (1989). Therefore, the findings of this study also supported Pol and Ponzurick’s suggestion. These findings mean that motivation, similar to attitude, is susceptible to data collector characteristics. Also, these findings supported previous studies by Eryılmaz (2002), Behi and Nolan (1996), and Miyazaki and Taylor (2008), who explained that training on the data collection process, experience in data collection, gender, race, and age were important factors in explaining differences in the data collected by various data collectors. Moreover, Sondergeld and Johnson (2014) emphasized that factor structures in scales may differ depending on the sample, and this creates difficulties in the comparison of different study results. Thus, it can
be considered that researchers’ ignorance of data collector differences threatens the reliability and validity of data obtained from Likert-type scales. An important way to reduce these differences is to train the data collectors, but this study’s findings showed that training status alone is not sufficient to provide strong reliability and validity.

The other finding regarding convergent validity supported the literature in terms of the relationship between motivation and attitude (Singh et al., 2002; Tuan et al., 2005). In all of the applications, there was a statistically significant relationship between motivation and attitude. Therefore, this result showed that the measurements had convergent validity.

Based on the findings of this study, it was suggested that data collector characteristics should be taken into account when Likert-type instruments are used to collect data on motivation and attitude. At the same time, other affective variables such as self-efficacy and anxiety should also be examined using a similar approach.
References/Kaynaça


