Comparison of Different Forms of a Test with or without Items that Exhibit DIF

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Abstract

Purpose: This research investigates Tests that include DIF items and which are purified from DIF items. While doing this, the ability estimations and purified DIF items are compared to understand whether there is a correlation between the estimations.

Method: The researcher used to R 3.4.1 in order to compare the items and after this situation; according to manipulated factors, we carried out the data production under different circumstances with the help of simulation study. The manipulated factors were determined levels of sample size (1000, 2000), test length (40, 60) and percentage of DIF (%5, %10). By using the new data each condition’s DIF items’ ability estimations were carried out. Afterward, DIF items purified from the tests and later the abilities were estimated. The correlation between the ability parameters was calculated by using the Spearman’s Rank Correlation Coefficient and these parameters were calculated separately according to the eight conditions.

Findings: After calculations, all of the coefficients of correlations (rs)’ values were almost zero (p<0.01). In other words the test length 40 and 60, sample size 1000 and 2000, percentage of DIF %5 and %10, when we crossed these parameters in different eight conditions, there was no familiar correlation between the tests that include DIF items and tests of that purified from DIF items. Besides, there was no correlation between the tests thinking the ability estimations; if we exclude DIF items from the tests, the individuals’ test ranking changes, too.

Implication for Research and Practice: This study showed that tests that include DIF items affect the ability estimation of individuals. In the frame of this result, teachers, administrators, and policymakers should bear in mind tests DIF potential. Also, this study may be carried out by using various conditions.

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Introduction

Measurement and evaluation studies, which are an indispensable part of the education system, make it possible to observe whether or not the targeted characteristics are acquired by individuals during the education and training process or to note the extent of their acquisitions and based on these observation results, several decisions can be made for these individuals. However, these decisions, which may be of vital importance to individuals at times, should be based on structurally acceptable foundations which underline the necessity of objective evaluations. Objective evaluations in education and psychology are only possible through the use of measurement tools which should have distinct properties so that results obtained from the evaluation process can be used in line with the purpose of evaluation. These are validity, reliability, and usability.

In the classical sense, the validity of an assessment tool is defined as the ability of the tool to measure the quality of the desired trait without the interference of any other trait. However, in recent years, current definitions exist for validity and a new formation is discussed. Validity can be defined in a broader and more contemporary manner as the extent of support for the interpretations made on test scores based on the purpose of test both by theoretical means and by the evidence collected (AERA, APA, and NCME, 2014; cited in Kelecioğlu and Şahin, 2014).

Many factors threaten the validity of the measurement tool. The scope of the assessment tool, the reliability of the scores, the length of the assessment tool, the average difficulty, inadequate examination periods and cheating, etc. are the factors that can pose a threat to validity (Turgut and Baykul, 2015). Bias is one of the factors that threaten the validity of the measurement tool (Clauser and Mazor, 1998). Bias is the advantage provided by the test, based on the conditions not covered by the purpose of the test or based on the properties of test items, to one of the groups at the same ability level but is included in different subgroups (Zumbo, 1999).

The purpose of studying item bias is to determine whether the difference between the subgroups of individuals at the same ability level originates from an actual difference in the measured property or from the assessment process. The first thing that should be done in bias studies is to determine whether there are any differences between the response structures of subgroups in responding to items. Determining whether there are differences between the response structures of subgroups is possible via differential item functioning (DIF) analysis. DIF is different from the concept of item bias. Hambleton, Swaminathan, and Rogers (1991) reported that an item exhibits DIF if individuals having the same ability level, but from different subgroups based on gender, race, etc., do not have the same probability of getting the item right. As it is seen, the common idea in both DIF definitions is that individuals with the same ability level are expected to respond in a similar manner to items. If responses differ, it can be argued that DIF is present in that item. In order to be declared biased, the item must first exhibit DIF. However, the presence of DIF in an item does not mean that the item is definitively biased. In other words, each biased item exhibits DIF; but not all items exhibiting DIF are biased. In order to determine the bias of an item with
DIF, the possible causes of DIF should be determined and the expert opinion should be consulted on whether the item is advantageous for one of the subgroups other than the structure it intends to measure (Camilli and Shepard, 1994; Zumbo 1999). Within the scope of this study, only DIF studies were carried out on the items exhibiting DIF in the data set. No expert opinion was sought as to whether these items demonstrated possible bias. In other words, studies on DIF, the first step of bias determination studies, were carried out by the researcher and bias determination study which is a continuation of this step were not carried out.

According to Dorans and Holland (1993), individuals from different subgroups in DIF analyzes should be similar in terms of the properties that the test aims to assess, i.e. they should be matched at the same ability level. As a matter of fact, DIF investigations are based on the assumption that the likelihood of responding to an item is similar for the groups which are similar in terms of the properties the test wants to measure. In DIF analyzes, the total scores of individuals, especially from the tests based on binary scoring, are used as matching criteria. Similarly, Clauser, Mazor, and Hambleton (1993) stated that reference and focus groups could be matched by the use of valid subtest scores. However, the degree of purification of the relevant sub-test scores of the variable to be used as the matching criterion is an issue that needs attention and care.

The total scores used as the matching criterion which are calculated by using the responses to the items in a test are the total scores obtained by taking into account the items exhibiting DIF if the test contains items that exhibit DIF. The process of calculating the total score by subtracting the mentioned DIF items from this test is called purification. Briefly, purifying the matching criterion means the removal of items exhibiting DIF from the test while calculating total scores; thus, it is ensured that only DIF-free items are used for the necessary analyzes (Lee and Geisinger, 2016).

Tests with specific properties are used to measure psychological characteristics such as ability and achievement. Based on the results, it is necessary to prove the validity of these tests which are used to make important decisions about individuals. Studies exist which demonstrate the presence of items that exhibit DIF, which is a significant threat to the validity of the test items used in national-level large scale tests which require ranking (Bakan Kalaycioglu and Kelecioglu, 2011; Basusta, 2013; Cepni 2011; Demir, 2013; Dogan and Ogretmen, 2008; Erdem, 2015; Gok, Kelecioglu and Dogan 2010; Ogretmen 2006; Yildirim, 2017). However, studies that investigate the changes that will occur in achievement ranking in test areas based on recalculations after the removal of the items that exhibit DIF are not conducted often. It is believed that the presence of items that provide advantage to a certain group in the test may cause inequality and injustice among individuals in such examinations where vital decisions are taken about individuals. Therefore, tests should be purified from these items. This study aimed to compare the ability estimates predicted from test forms that contained items with or without DIF based on different number of items, different sample size and different DIF ratio conditions.
Method

Research Model

This study, which aimed to compare the ability estimates predicted from a test form that contained items with or without DIF based on a different number of items, different sample sizes and different DIF ratio conditions, utilized relational screening model.

Simulation Conditions

In this study, the comparison of the predictive estimates of a test form that contained items with or without DIF under various conditions was carried out by a simulation study. The conditions that were constant and manipulated in data generation for this simulation study are described below.

Constant conditions

The simulation data were generated in accordance with the items that were scored based on the two-category structure in the study. The uniformity of the items that exhibit DIF was another constant condition of the study. In addition, in all conditions, ability parameters of individuals were obtained according to a standard normal distribution with a mean of 0 and a standard error of 1. The generation of data fit for the Item Response Theory (IRT) model was based on a three-parameter logistic model. For this model, the mean and standard deviation or minimum and maximum values of a, b and c parameters were determined and data were generated between these values.

Manipulated conditions

The literature on DIF studies shows many variables, such as test length, sample size, and the proportion of items exhibiting DIF, have an effect on DIF (Clauser, Mazor and Hambleton, 1993; Narayanan and Swaminathan 1996; French and Maller 2007; Atar and Kamata, 2011). In this study, these conditions were manipulated based on the determined levels of the related conditions for data generation.

The number of items (k): For this condition, two levels were determined as k=40 and k=60. Standardized achievement and ability tests generally have between 35-80 items (Narayanan and Swaminathan 1996; French and Maller 2007). Sample size (n): Two levels were determined for the sample size of the study as n=1000 and n=2000. In simulation studies conducted on IRT based DIF determination methods, it was found that the minimum sample size for each group was 200-250 and 600 people in total (Narayanan and Swaminathan 1996; French and Maller 2007; Atar and Kamata, 2011).

The proportion of items exhibiting DIF: There were two levels in the proportion of items exhibiting DIF as d=5% ve d=10% in this study since according to Jodoin and Gierl (2001), higher proportions of items exhibiting DIF would threaten test validity. In addition, it was found that tests that were investigated in DIF studies included more than one item that exhibited DIF.
Data Generation

In this simulation study, data generation was performed by writing codes to R 3.4.1 program based on a three-parameter logistics model. 50 replications were performed for each condition considered.

Table 1 displays the study plan for the simulated data generation performed according to the levels of each of the manipulated conditions such as the number of items, sample size and the proportion of items exhibiting DIF.

**Table 1.**

*Simulative Data Generation Plan*

| K  | Number of Items | Sample Size | The proportion of Items Exhibiting DIF |
|----|----------------|-------------|---------------------------------------|
| 1  | 40             | 1000        | 5%                                   |
|    |                | (R:500/O:500)|                                      |
| 2  | 60             | 1000        | 5%                                   |
|    |                | (R:500/O:500)|                                      |
| 3  | 40             | 2000        | 5%                                   |
|    |                | (R:1000/O:1000)|                                    |
| 4  | 60             | 2000        | 5%                                   |
|    |                | (R:1000/O:1000)|                                    |
| 5  | 40             | 1000        | 10%                                  |
|    |                | (R:500/O:500)|                                      |
| 6  | 60             | 1000        | 10%                                  |
|    |                | (R:500/O:500)|                                      |
| 7  | 40             | 2000        | 10%                                  |
|    |                | (R:1000/O:1000)|                                    |
| 8  | 60             | 2000        | 10%                                  |
|    |                | (R:1000/O:1000)|                                    |

K: Condition, R: Reference group, O: Focus group
Data based on the planned conditions were obtained from the normal distribution in which the mean parameter \(a\) was 0.8 and standard deviation was 0.04 under all conditions. The minimum and maximum values of parameter \(b\) were identified to be -2 and +2. Finally, the value range of parameter \(c\) was determined to be between 0.2-0.3 and then the data were generated. 0.75 was added as the amount of DIF to the \(b\) parameters of the respective items in accordance with the number of items required for the production of items that exhibit DIF with respect to the determined levels of the proportion of items exhibiting DIF as manipulated condition.

Data Analysis

For the purpose of the study and in accordance with the conditions described above, the “difR” package was used in the R program to generate data sets that contained items with DIF. “ltm” package of the R program based on the three-parameter logistic model of IRT was used to conduct ability estimations of individuals based on their test responses in the data tests iteratively generated according to each condition. Individuals’ abilities were re-estimated by removing the items that exhibited DIF from the same test under each condition. Ability estimations of individuals for the test containing items that exhibited DIF, i.e., the \(\theta\) (theta) values of individuals, were determined to be \(\theta_1\) while ability estimations of individuals for the test with no DIF items were determined to be \(\theta_2\).

The relationship between \(\theta_1\) and \(\theta_2\) for each iteration was examined by SPSS 22.0 program, by using Spearman Rho Correlation Analysis. Mean correlation coefficients \((r_s)\) obtained by Spearman Rho Correlation Analysis in each iteration at the same condition were calculated. Fisher-Z transformation proposed by Corey, Dunlap, and Burke (1998) was performed to obtain more clear results in calculating mean correlation coefficients. For this purpose, each \(r_s\) coefficient was converted to z value with Fisher-Z transformation, then the mean z values of the transformed values were calculated and the obtained mean z value was re-converted to \(r_s\) by Fisher-Z transformation. In this way, a relationship existed between \(\theta_1\) and \(\theta_2\) values obtained with 50 iterations for each condition was observed by finding a mean correlation coefficient. This process was performed for 8 different conditions in investigating the relationship level.

Results

For a total of eight conditions, the findings obtained by Spearman Rho Correlation Analysis for the relationship level between the ability estimations of individuals for the test with items that exhibited DIF (\(\theta_1\)) and ability estimations of individuals for the test with no DIF items (\(\theta_2\)) were first interpreted generally and later the findings that were presented separately were interpreted according to sob problems based on manipulated conditions of number of items, sample size and proportion of items exhibiting DIF.
The following table demonstrates the correlation coefficient values between $\theta_1$ and $\theta_2$ variables for all conditions.

**Table 2.**

| K   | Sample size | The proportion of items exhibiting DIF | Number of items | $r_s$  |
|-----|-------------|----------------------------------------|-----------------|--------|
| 1   | 1000        | %5                                     | 40              | 0.199  |
| 2   | 1000        | %10                                    | 40              | 0.069  |
| 3   | 2000        | %5                                     | 40              | 0.058  |
| 4   | 2000        | %10                                    | 40              | -0.143 |
| 5   | 1000        | %5                                     | 60              | 0.048  |
| 6   | 1000        | %10                                    | 60              | 0.024  |
| 7   | 2000        | %5                                     | 60              | 0.172  |
| 8   | 2000        | %10                                    | 60              | -0.027 |

Note 1: K refers to the condition for each crossing

Note 2: $r_s$ indicates the Spearman rho correlation coefficient value ($p<0.01$).

Figure 1 is presented below in addition to Table 2 since it is thought to be useful to examine the level of the relationship according to all the conditions that were crossed, in a more detailed and clear manner in which all conditions are demonstrated interactively.

*Figure 1. Correlation coefficients of all conditions*
When Figure 1. was examined in general, it was observed that all $r_s$ values presented in Table 1 changed between 0.2 and 0.15 according to the levels of the researcher’s conditions. In other words, it was found that for all the conditions including the conditions where the relationship at the vertical axis was maximum or minimum, each was between either smaller than positive 0.3 or bigger than negative 0.3. These findings also indicate the lack of a general relationship between the predicted ability estimates, regardless of any of the determined conditions. Specifically, when the items that exhibited DIF were removed from the test and re-estimates were made, the rankings of the individuals who took the test changed. This situation caused a low level of relationship.

Since the validity of a test will be affected by the presence of items that exhibit DIF, the exactness and soundness of the scores obtained from the test become controversial. That is, it is not desirable to have items that exhibit DIF in a test. In fact, change in individual rankings when individuals are re-scored after eliminating the items that exhibit DIF shows that actual scores are not really obtained. In this case, individuals will need to question the vital decisions taken from the examinations given for ranking or selection purposes in many national and international areas when actual scores are not definitively obtained.

Bakan Kalaycioglu and Kelceoglu (2011), Basusta (2013), Cepni (2011), Demir (2013), Dogan and Ogretmen (2008), Erdem (2015), Gok, Kelcioglu and Dogan (2010), Ogretmen (2006), Yildirim (2017) found that national or international achievement tests include items that exhibit DIF. The presence of DIF items in these tests constitutes a significant threat to the validity of these tests.

The current study found that changes occurred in the achievement ranking of the individuals as a result of the estimations made by the purification of DIF items. Therefore, it is thought that tests in which items that exhibited DIF were identified in literature would give different results in achievement rankings of individuals if new analyses were to be conducted by purification of these items from the test. This argument points to a significant effect of the purification of items with DIF. In this sense, the findings of this study are parallel to studies that pointed to the need to purify tests from items that exhibited DIF for DIF studies (French and Maller, 2007; Holland and Thayer, 1988, Lee and Geisinger, 2016, Zumbo 1999).

When Table 2 and Figure 1 were re-examined based on the number of items, it was seen that Spearman correlation coefficient value ($r_s$) decreased and got closer to 0 when the number of items was increased from 40 to 60 in two different graphics where the proportion of items exhibiting DIF was 5% and 10% and the sample size was 1000. The fact that the relationship between ability estimations decreased and became closer to 0 as the number of items increased demonstrated no relationship between individuals’ rankings in a test with or without items that exhibited DIF and hence, these rankings change to a great extent. Although the level of relationship between ability estimations increased when the number of items was increased from 40 to 60 in two different when proportion of items exhibiting DIF was 5% and 10% and the sample size was 2000, it was still not sufficient to mention the existence of any relationship because the
correlation coefficients were not differentiated to allow the existence of the relationship for both 40 and 60 number of items. The lack of a significant relationship also indicates that purification of the test changed the rankings of individuals in the test.

When Table 2 and Figure 1 were re-examined based on the differentiation status of sample size, it was seen that Spearman correlation coefficient value ($r_s$) somewhat decreased when the sample size was increased from 1000 to 2000 while the number of items was identified to be 40 in two different graphics where the proportion of items exhibiting DIF was 5% and 10%. However, this decrease was not significant enough to point to a relationship. It is also seen that increasing sample size under this condition in the graphic where the proportion of items exhibiting DIF was 10% generated a decrease in the correlation coefficient but this change was not significant to eliminate the finding in regards to lack of relationship. In other words, there was no significant relationship between ability estimations for the test with or without DIF for conditions such as the same number of items, the same proportion of items exhibiting DIF and different sample sizes (n=1000 and n=2000). The lack of a significant relationship also indicates that purification of the test changed the rankings of individuals in the test.

When Table 2 and Figure 1 were re-examined based on the differentiation status of the proportion of items exhibiting DIF, the existing lack of relationship still decreased when the proportion of items exhibiting DIF was increased from 5% to 10%. In other words, as the proportion of items exhibiting DIF increased, Spearman correlation coefficient value ($r_s$) got closer to 0. This was due to the increase in the number of items marked with DIF resulting from the increase in the proportion of items exhibiting DIF and the fact that an abundance of number of items that exhibited DIF generated less relationships among variables. As a result, it was found that increasing the proportion of items exhibiting DIF from 5% to 10% under all conditions with respect to the level of relationship did not have a significant effect on the non-correlation between the test forms that included items that exhibited DIF and items that exhibited no DIF. Therefore, it was found that the purification of the test from DIF items under conditions where the proportion of items exhibiting DIF was 5% and 10% caused changes in the rankings of the individuals.

Spearman correlation coefficient value ($r_s$) somewhat increased when the sample size was increased from 1000 to 2000 in the graphic where the proportion of items exhibiting DIF was the 5%, the number of items was 60. However, this increase was not significant. In other words, there was no significant relationship between ability estimations for the test with or without DIF for conditions such as the same sample size, same number of items and different proportions of items exhibiting DIF ($d=\%5$ and $d=\%10$). The lack of a significant relationship also indicates that purification of the test changed the rankings of individuals in the test.
Discussion, Conclusion and Recommendations

The differentiation of the rankings of the individuals who take the test when the test is purified from items that exhibit DIF can make the validity of the problematic. In fact, while the presence of DIF in the test constitutes a significant threat to the validity of the test, the removal of these items from the test changes individuals’ ranking, therefore, it appears that the purification process has a significant effect. In this case, the vital decisions are taken from the examinations given for ranking or selection purposes in many national and international areas become questionable.

The measurement tool used in a test should not provide any advantages to any group taking the test. In some cases, other variables may be mixed with the properties we want to measure. These variables include gender, type of school, socio-economic level, ethnic origin, etc. (Atalay Kabasakal, 2014). The construct that the test wants to assess and the effect of unrelated variables on the test scores generate a threat on validity and lead to the bias of test scores (Camilli and Shephard, 1994). The first step in determining bias is the DIF analyses developed for this purpose with a large number of methods.

Undesirable results can be obtained if items in any test exhibit DIF, even partially. One of these undesirable results is the fact that DIF directly affects parameter estimation (Han, 2008). Another unintended consequence is the incorrect estimation of ability parameters (Atalay Kabasakal, 2014). As a result of the erroneous estimation of item and ability parameters, the results of many statistical studies based on these parameters become suspect. The literature presents studies investigating the negative effects of the presence of items that exhibit DIF in tests on statistical processes. Some of these studies examined the effects items that exhibit DIF on test equalization process (Atalay Kabasakal, 2014; Chu, 2002; Chu and Kamata, 2005; Turhan, 2006) and their effect on computer-adapted tests (Miller, 1992; Zwick, Thayer and Wingersky, 1995; Zwick, 2000).

According to the results obtained from studies, incorporation of items that exhibit DIF in a test can affect item and ability parameters directly and the statistical studies performed with these parameters indirectly. In this study, it is concluded that there was no relation between the ability estimations predicted with the help of a test form with or without items that exhibited DIF, in other words, the achievement ranking of individuals changed when the test was purified. Thus, the study presented the importance of purification of a test from the items that exhibit DIF in a practical manner.

Recommendations

This research was conducted as a simulation study. Considering that use of simulation studies on DIF with real data can help obtain more reliable results, a similar study can be performed with a simulation study supported by real data. In this study, manipulated variables included the number of items, sample size and proportion of items exhibiting DIF. A similar study can be conducted by manipulating different variables (such as reference-focus group ratio).
This study investigated the effect of purification of tests from items that exhibited DIF on the estimation of the ability parameters. A similar study can be performed via item parameters estimation. The results of the study demonstrated that the purification of tests from items that exhibited DIF changed the rankings of individuals. According to this result, it can be suggested that the practitioners should first detect the item that exhibit DIF in a test and recover the test results by purification according to appropriate conditions.

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**Bir Testin DMF’li Madde İçeren ve DMF’li Maddeden Arındırılmış Formlarının Karşılaştırılması**

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**Özet**

*Problem Durumu:* Bir ölçme aracıında bulunması gereken yapısal niteliklerden en önemlisi olarak kabul edilen geçerlik, klasik anlamıyla bir ölçme aracıının ölçmek istediği özelliğin başka özelliklerle karıştırmadan ölçübilmesi olarak açıklanabilir. Ancak bir testten olde edilen puanların test ile ölçümek istendiği özelliği başka özelliklerle karıştırıldığında ösebilmesi olarak açıklanabilir. Ancak bir testten olde edilen puanların test ile ölçümek istenilen özellik dışında farklı değişkenlerden de etkilendigini ne kadar kadar isimlemeyin bir durum da olsa pratiğe bu durum kaçınılmazdır. Testi alan bireylerin bulunduğu alt grupların da bu değişkenlerden ne derece etkilendiği önemlidir. Değişkenlerin alt grupları farklı biçimlerde etkilemesi ise maddenin yanılsı olmasına sebep olabilir. Yetenekin ilk koşulu olan Değişen Madde Fonksiyonunun (DMF’nin) bir maddenin, maddeyi yanıltlayan farklı alt gruplardan herhangi birine ya da birkaçına avantaj sağlamasına neden olmaktadır. Bir testin madde ya da maddeleminde DMF’nin bulunabilme ihtimali özellikle sonuçlarına bakarak bireyler hakkında çeşitli kararların alınabileceği düşünülmektedir. Öyle ki eğitimin birçok alanında, sralama ya da seçme amaçlı uygulanan sınavlarda alınan kararların niteliği alınan kararın doğruluğuna, isabetli ve yerinde olmasına direkt olarak etkili etmektedir. Peki bahsi geçen yanıltıcı maddelerin testte arındırılması bireyler hakkında verilen yetenek kararını değiştirme midir? Yanlış sonucunun yapılan birçok çalışmada, SBS, TEOG, ÖSS, PISA, ALES, KPSS gibi geniş ölçekli sınavlarda DMF içeren maddeler tespit edilmiştir. Ancak geniş ölçekli sınavlarda DMF içeren maddelerin testte çıkarılması sonucunun gösterdiği yere devam etmektedir. Başka bir ifadeyle DMF’li maddelerin testte çıkarılmasıyla yeniden belirlenen sonucu göre bireylerin sınavdaki başarı sıralamalarını etkilenip etkilenmediğine dair çalışmalar sınırlı sayıldır.

*Araştırmanın Amacı:* Bireyler hakkında hayati kararların alınceği sınavlarda belirli bir gruba avantaj sağlayıp maddelemin testte bulunmasını bireyler arasında eşitsizliğe ve adaletsizliğe neden olabileceğini düşünülmektedir. Bu nedenle bu maddelerin testte arındırılması gerekli olabilir. Bu düşünceye göre gerçekleştirilen araştırmanın amacı bir testin DMF’li madde içeren ve DMF’li madde den arındırılmış formlarından keşfedilen yetenek kestirimlerinin farklı madde sayısı, farklı örneklem büyüklüğü ve farklı DMF oranını koşularında altında karşılaştırılmaktır.
Araştırmanın Yöntemi: Araştırma kapsamında araştırmacı tarafından R 3.4.1 paket programı kullanılarak manipüle edilen değişkenlere göre farklı koşullar altında simulasyon çalışmasıyla veri üretimi gerçekleştirilmiştir. Manipüle edilen değişkenler düzeylerine göre örneklem büyüklüğü (n=1000 ve n=2000), maddesiz sayısı (k=40 ve k=60) ve DMF oranı (d=5 ve d=10) olarak belirlenmiştir. Değişkenlerin çaprazlanması sonucunda sekiz koşulun her birine uygun olacak şekilde DMF’li madde içeren veriler ürettilmiştir. Çeşitli düzeylerde DMF’li maddeler içerecek şekilde verilerin üretildiği bir testin öncelikle DMF’li maddeler içermeyen, yetenek kestirimleri gerçekleştiştirilmiştir. Testin DMF’li maddeler içeren hâliley kestirilen yetenek kestirimlerine θ₁ ismi verilerek veriler saklı tutulmuştur. Ardından bu testte yer alan DMF’li maddeler testten çıkarılarak aynı şekilde yetenek kestirimleri gerçekleştirilmiştir. Testin DMF’li maddeler içermeyen hâliley kestirilen yetenek kestirimleri ise θ₂ şeklinde saklanmıştır. Son olarak da aynı testin θ₁ ve θ₂ adıyla elde edilmiş olan bu kestirimleri arasındaki ilişki bakımından işlenmiş ve saklanmıştır. Bu yetenek kestirimleri arasındaki ilişki verilerin sıralamalarının farklılaşmış olduğu tespit etmek amacıyla kullanılan spearman sıfır korelasyon analizi uygulanmıştır.

Araştırmanın Bulguları: Yöntem bölümünde özetlenen bir testin DMF’li madde içeren ve DMF’li maddeden arındırılmış formlardan kestirilen yetenek kestirimlerini (θ₁ ve θ₂) arasındaki ilişki düzeyine bakılmak için gerçekleştiştirilen spearman sıfır farklı korelasyon analizi ile elde edilen katsayıların 0’a yakın olması dolayısıyla yetenek kestirimleri arasında pozitif ya da negatif yönli bir ilişki görülmemiştir. Yetenek kestirimleri arasında ilişki görülmemesi ise bireylerin test sonuçlarındaki sıralamalarının değiştiğini işaret etmektedir. Başka bir ifadeyle test DMF’li maddeden arındırılmış formlardan sonra bireylerin testteki sıralamaları, önceki DMF’li madde içeren test formu sıralamalarına göre farklılaşmıştır. Bu tespit, çeşitli koşulların yetenek kestirimlerini düştürtüğünü gösteren bir testin DMF’li maddeden arındırılması sonucuna ulaşılmıştır. Yayınlanan bu tespit, çeşitli koşulların test sıralamalarını etkilediği sonucuna ulaşılmıştır. Başka bir ifadeyle testin DMF’li maddeden arındırılması sonucuna ulaşılmıştır. Bu tespit, çeşitli koşulların test sıralamalarını etkilediği sonucuna ulaşılmıştır. Başka bir ifadeyle testin DMF’li maddeden arındırılması sonucuna ulaşılmıştır. Bu tespit, çeşitli koşulların test sıralamalarını etkilediği sonucuna ulaşılmıştır. Bu tespit, çeşitli koşulların test sıralamalarını etkilediği sonucuna ulaşılmıştır. Bu tespit, çeşitli koşulların test sıralamalarını etkilediği sonucuna ulaşılmıştır. Bu tespit, çeşitli koşulların test sıralamalarını etkilediği sonucuna ulaşılmıştır. Bu tespit, çeşitli koşulların test sıralamalarını etkilediği sonucuna ulaşılmıştır. Bu tespit, çeşitli koşulların test sıralamalarını etkilediği sonucuna ulaşılmıştır. Bu tespit, çeşitli koşulların test sıralamalarını etkilediği sonucuna ulaşılmıştır. Bu tespit, çeşitli koşulların test sıralamalarını etkilediği sonucuna ulaşılmıştır. Bu tespit, çeşitli koşulların test sıralamalarını etkilediği sonucuna ulaşılmıştır. 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