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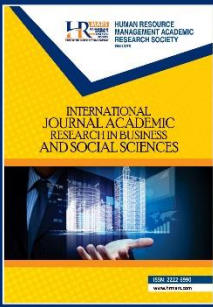
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Validity and Reliability of the Malaysian Perceived Stress Scale (PSS) using Rasch Measurement Model

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Abstract

This study was conducted to produce empirical evidence of validity and reliability of the item using a survey questionnaire Perceived Stress Scale. The 14-item Perceived Stress Scale (PSS-14) is one of the most widely used psychological instruments for measuring stress perception in practice and research works, but has sparked some controversy regarding its factor structure. Furthermore, no study has been conducted to date using a sample of 'houseman' medical officers to test the reliability and validity of this instrument. The Rasch model analysis, aided by Winsteps software Version 3.69.1.11, was used to examine the functional items from the reliability and separation of item and respondent, polarity and items fit measuring constructs and standardized residual correlation value. The questionnaire was distributed to 42 'houseman' officers who work in a hospital in Selangor, Malaysia. The findings of this study support the use of the PSS-14 as a reliable and valid instrument to assess perceived stress in a sample of 'houseman' medical officers in Malaysia.

Keywords: Perceived Stress Scale (PSS), Rasch Model, Validity and Reliability, Malaysia

Introduction

Rasch measurement model has proven that learning transfer questionnaire has a level of validity and reliability then be used to develop a model of learning transfer. This is because the use of Rasch measurement model is a solution to the issue of validity as Rasch measurement model provides useful statistics and offers a tremendous opportunity to probe the validity (Bond & Fox, 2015). In addition, the application of Rasch measurement model in a study will be able to facilitate and produce a more efficient, reliable and valid measurement while increasing convenience to user (Abdul Aziz et al., 2007).

A study to identify the validity and reliability of the instrument is very important for maintaining the accuracy of the questionnaire (Ariffin et al., 2010). This is necessary to determine the questionnaire to measure what is to be measured consistently and accurately. According to Howard and Braun (1988), consistency means that when the same item is tested several time on

the same subject at a different time interval, the score result given is approximately the same. In conclusion, the reliability is likely to provide a consistent validity. This study was performed to produce empirical evidence of the validity and reliability of Perceived Stress Scale questionnaire using Rasch measurement model. This is because the Rasch measurement model can test the consistency of interpretation of constructs, the reliability of the items and the respondent and the accuracy of the test.

The Perceived Stress Scale has been used by many researchers around the world such as general public, school students, patients, seniors, athletes and teenagers (refer Table 1). Out of the 19 research works listed in Table 1, 15 used SPSS to analyze the data obtained, while four studies used Rasch Model to analyze the data. This indicates that SPSS is a statistical mechanism that is still widely used in research compared to the Rasch Model in order to determine the instrument's validity and reliability values. This table also shows that the Perceived Stress Scale was administered to adults, adolescents, seniors, medical students, nurses, teachers, health 'frontliners', university students, and pregnant women.

Hence, in this study, the researchers use 'houseman' medical doctors as the study respondents. In fact, researchers also use the Rasch Model as a statistical mechanism to determine the validity and reliability of the PSS-14 items. Therefore, the objectives of this analysis are to:

- a. test the reliability and item separation index and the respondent
- b. detect the polarity items that measure the constructs
- c. test the item fit of the instrument items

In other words, this paper aims to discuss the findings of Perceived Stress Scale (PSS-14) validation study in Malaysian context. It is not only meant for establishing the validity and reliability of the instrument in Malaysian population of 'houseman' medical doctors, but most importantly, to add and increase such research works which use Rasch Measurement Model as a statistical analysis mechanism.

Table 1: The use of Perceived Stress Scale (PSS) in research works within 2015-2020

Article & Author	Respondents	Year	Version	Statistical Analysis
Measuring Stress – Methods and Tools	Romanian Adults	2020	Romanian	SPSS
Measuring Stress in Australia: Validation of the Perceived Stress Scale (PSS-14) in a National Sample	Australian Citizens	2020	English	Rasch Model
The Examination of Sleep Quality for Frontline Healthcare Workers during the Outbreak of COVID-19	Healthcare 'Frontliners'	2020	English	SPSS
Correlation between Stress Scores and Self-Regulated Learning Perception Scores in Pakistani Students	1 st -5 th Year Medical Students	2020	English	SPSS
Stress beyond Coping? A Rasch analysis of the Perceived Stress Scale (PSS-14) in an Aboriginal Population	Aboriginal Women	2019	English	Rasch Model
Construct Validity of the Perceived Stress Scale (PSS-14) in a Sample of Early Childhood Teacher Candidates	Korean University Students	2019	English	SPSS
Cross-cultural Validation of the Student Nurse Stress Index Scale: A Descriptive Survey targeting Student Nurses in China	China Nursing Students	2019	Chinese	SPSS
Psychometric Properties of the Perceived Stress Scale in a Sample of German Dementia Patients and their Caregivers	German Citizens	2018	English	SPSS
The Vietnamese Version of the Perceived Stress Scale (PSS-10): Translation Equivalence and Psychometric Properties among Older Women	Vietnamese Old Women	2017	Vietnamese	SPSS
Validity and Reliability of the Cohen 10-item Perceived Stress Scale in Patients with Chronic Headache: Persian Version	Persian Citizens	2017	Persian	SPSS
Perceived Stress Scale: Confirmatory Factor Analysis of the PSS-14 and PSS-10 Versions in Two Samples of Pregnant Women from the BRISA cohort	Pregnant Women	2017	Chinese	SPSS
Psychometric Evaluation of Turkish Version of the Perceived Stress Scale with Turkish College Students	Turkish College Students	2017	Turkish	SPSS
Rasch Analysis of the Perceived Stress Scale: Transformation from an Ordinal to a Linear Measure	Students	2017	English	Rasch Model

The German Version of the Perceived Stress Scale (PSS-10): Evaluation of Dimensionality, Validity, and Measurement Invariance with Exploratory and Confirmatory Bifactor Modeling	Registrants of Statutory Health Insurance Company	2017	German	SPSS
Psychometric Properties of the Perceived Stress Scale (PSS): Measurement Invariance between Athletes and Non-Athletes	Athletes and Non-Athletes	2016	English	SPSS
The Construct Validity of the Perceived Stress Scale	General Public	2016	English	Rasch Model
Reliability and Validity of the 4-item Version of the Korean Perceived Stress Scale	Nursing Students	2016	Korean	SPSS
Korean Versions of the Perceived Stress Scale (PSS-14, 10 and 4): Psychometric Evaluation in Patients with Chronic Disease	Chronic Disease Patients	2016	English	SPSS
Cross-cultural Adaptation and Validation of the Danish Consensus Version of the 10-item Perceived Stress Scale	Outpatients	2015	Danish	SPSS

Methodology

The Perceived Stress Scale (PSS) was developed by Cohen et al. (1983) in order to measure the extent to which situations in one's life are appraised as stressful. Several alternate versions of the PSS exist, which vary in the number of items used to describe perceived stress. There are three versions of the PSS, namely PSS-14, PSS-10 and PSS-4 (Cohen & Williamson, 1988). Thus, Lee (2012) conducted a comprehensive review of the psychometric properties of the PSS and reported that all versions of the PSS have acceptable psychometric properties. This study employs a survey by distributing questionnaires developed by Cohen and his colleagues. The questionnaire consists of 14 items, on 5-point Likert scale. The PSS 14 Questionnaires were distributed to 42 house officers who are working at a government hospital in Selangor, Malaysia.

The number of respondents in the pilot study was adequate because, according to Cooper & Schindler 2012, the number of respondents who suitable for the pilot study is between 25 to 100 people. Whereas, Johanson and Brooks (2010) suggest a minimum number of 30 people for a pilot study in which the aim is to study early or development scale. Data were analyzed with the aid of the software Winsteps version 3.69.1.11.

Results

Through Rasch measurement model approach, the researchers perform an examination of the item functional in terms of:

- a. item reliability and separation of the respondents
- b. detecting polarity items that measure the constructs based on the PTMEA CORR
- c. items fit measuring constructs

Reliability and Separation Items and Respondent

Based on Rasch measurement model approach, the acceptable reliability Cronbach's Alpha (α) is between 0.71-0.99, where it is at the best level (71% - 99%). The findings of the pilot study found that the reliability obtained based on the Cronbach Alpha (KR 20) is 0.88. This indicates that this instrument is a reliable instrument and suitable for the specified sample. So this value shows instruments used are in very good condition and effectively with a high level of consistency thus can be used in the actual research.

The analysis also performed on the instrument as a whole, namely the reliability and the separation of the item and the respondent. Table 2 shows the reliability and separation items where the reliability of the items was 0.95, while the separation of items is 4.50. Based on the reliability of the items, the value of 0.95 indicates are in good condition and acceptable (Bond & Ford, 2007). According to Linacre (2004), the separation index is better when the value is more than the value of 2.0.

While the reliability of the respondents is 0.88, and the separation of the respondents is 2.46. This shows that the respondents are very high reliability and very good. This is because Bond and Fox (2007) describe the reliability of more than 0.8 is good and stronger acceptable. While the separation of the respondents showed good separation of the item difficulty level appropriate to the Linacre (2004), which describes the separation of more than 2.0 is a good value.

Table 2: Reliability and Separation Item and Respondent for the Entire Construct
Instruments: Pilot Study

SUMMARY OF 14 MEASURED Item

	TOTAL		MODEL	INFIT	OUTFIT				
	SCORE	COUNT	MEASURE	ERROR	MNSQ	ZSTD	MNSQ	ZSTD	
MEAN	88.8	42.0	.00	.23	.98	-.1	.97	-.1	
S.D.	20.7	.0	1.11	.01	.25	1.2	.25	1.1	
MAX.	123.0	42.0	2.02	.24	1.45	2.0	1.40	1.7	
MIN.	52.0	42.0	-1.78	.22	.63	-1.7	.63	-1.7	
REAL RMSE	.24	TRUE SD	1.09	SEPARATION	4.50	Item	RELIABILITY	.95	
MODEL RMSE	.23	TRUE SD	1.09	SEPARATION	4.72	Item	RELIABILITY	.96	
S.E. OF Item MEAN	= .31								

SUMMARY OF 42 MEASURED Person

	TOTAL		MODEL	INFIT	OUTFIT				
	SCORE	COUNT	MEASURE	ERROR	MNSQ	ZSTD	MNSQ	ZSTD	
MEAN	29.6	14.0	.28	.40	.98	-.2	.97	-.2	
S.D.	7.3	.0	1.18	.01	.62	1.5	.60	1.4	
MAX.	45.0	14.0	2.72	.42	2.74	3.5	2.63	3.1	
MIN.	12.0	14.0	-2.60	.39	.25	-2.8	.23	-2.7	
REAL RMSE	.44	TRUE SD	1.09	SEPARATION	2.46	Person	RELIABILITY	.86	
MODEL RMSE	.40	TRUE SD	1.11	SEPARATION	2.77	Person	RELIABILITY	.88	
S.E. OF Person MEAN	= .18								

Person RAW SCORE-TO-MEASURE CORRELATION = 1.00

CRONBACH ALPHA (KR-20) Person RAW SCORE RELIABILITY = .88

Polarity Item by PTMEA CORR Value

The Point Measure Correlation (PTMEA CORR.) is to detect polarity items intended to test the extent to which the construction of constructs achieves its goal. If the value contained in the PTMEA CORR is the positive (+), it shows the item measure the constructs to be measured (Bond & Ford, 2007). On the other hand, if the value is negative (-), the item is not developed to measure the constructs to be measured. Thus it needs to be improved or dropped because the item is not lead to the question (not focus) or difficult to answer by the respondent.

Based on Table 3, there are all items that get PTMEA CORR. are positive, which indicates that the items measuring the constructs to be measured (Bond & Ford 2007). Whereas, the negative PTMEA CORR indicated item needs to give attention or should be repaired or removed. The rest of PTMEA CORR. is positive despite the lowest positive value of item S4 (0.43), S10 (0.46), and S12 (0.41). Thus purification items should be done. However, based on these findings show that positive items moving in one direction with construct and able to

measure constructs and does not conflict with the constructs being measured. If the PTMEA CORR. is high, then the item is able to distinguish between respondents capability.

Table 3: A Part of Point Measure Correlation Value

	OUTFIT		PT-Measure		Exact	Match	Item
	MNSQ	ZSTD	CORR.	EXP.	OBS%	EXP%	
	1.38	1.7	.41	.61	50.0	50.1	S12
	1.40	1.7	.43	.61	54.8	53.9	S4
	1.22	1.0	.46	.61	54.8	56.5	S10
	1.30	1.2	.51	.61	42.9	58.3	S13
	.95	-0.1	.58	.63	54.8	57.3	S6
	.93	-0.2	.60	.62	61.9	54.2	S5
	.95	-0.1	.63	.62	61.9	59.6	S9
	.63	-1.7	.64	.62	69.0	59.7	S7
	.78	-1.0	.65	.61	59.5	49.7	S1
	.83	-0.8	.72	.62	54.8	51.8	S3
	.74	-1.2	.72	.61	57.1	51.4	S11
	.93	-0.2	.74	.61	50.0	55.8	S8
	.72	-1.4	.77	.61	54.8	49.7	S2
	.80	-0.8	.78	.61	66.7	58.3	S14
MEAN	.97	-0.1			56.6	54.7	
S.D	.25	1.1			6.6	3.6	

Item Fit Measure Constructs

Items fit measures the constructs that can be seen through the infit and outfit Mean Square (MNSQ). According to Bond and Fox (2007), the outfit and infit MNSQ should be in the range of 0.6 to 1.4 to ensure the items are suitable for measuring the constructs. If the infit or outfit MNSQ value is more than 1.4 logit, it gives meaning to a confusing item. On the other hand, if the MNSQ value is less than 0.6 logit, it shows that the item is too easily anticipated by the respondents (Linacre 2021). Besides that, the outfit and infit ZSTD value should also be within -2 to +2 (Bond & Fox, 2007). But if the outfit and infit MNSQ be accepted, the ZSTD index can be ignored (Linacre 2007).

Therefore, if this condition is not met, then the item can be considered to be removed or having purified. Table 4 shows the misfit order featuring all 14 items having the range of 0.6 to 1.4 analysis statistics: misfit order. Thus from this diagnosis, there were all 14 items having purified by looking at the needs of researchers and experts.

Table 4: Item Fit Based on MNSQ Value

ENTRY	TOTAL	MODEL	INFIT	OUTFIT	PT-MEASURE	EXACT MATCH	
NUMBER	SCORE	COUNT	MEASURE	S.E.	MNSQ	ZSTD	MNSQ ZSTD
EXP%	Item						
12	113	42	-1.28	.22	1.39	1.9	1.38 1.7
4	52	42	2.02	.23	1.45	2.0	1.40 1.7
10	92	42	-.21	.23	1.30	1.3	1.22 1.0
13	87	42	.06	.23	1.25	1.1	1.30 1.2
6	64	42	1.36	.24	.93	-.2	.95 -.1
5	57	42	1.75	.23	.99	.0	.93 -.2
9	75	42	.73	.24	.93	-.2	.95 -.1
7	80	42	.45	.24	.63	-1.7	.63 -1.7
1	107	42	-.98	.22	.79	-1.1	.78 -1.0
3	123	42	-1.78	.23	.86	-.7	.83 -.8
11	104	42	-.83	.22	.74	-1.3	.74 -1.2
8	94	42	-.32	.23	.93	-.2	.93 -.2
2	108	42	-1.03	.22	.72	-1.5	.72 -1.4
14	87	42	.06	.23	.84	-.7	.80 -.8
MEAN	88.8	42.0	.00	.23	.98	-.1	.97 -.1
S.D.	20.7	.0	1.11	.01	.25	1.2	.25 1.1

Discussion and Conclusion

All in all, the findings of this study indicated that the PSS-14 questionnaire was valid and reliable in all items. The items and respondent were shown to have high reliability and separation indices. In addition, all items appeared to fit the Rasch Measurement Model with a good five-point Likert scale. Based on the results obtained, 14 items meet the requirements analysis and should be retained.

In conclusion, the Rasch Measurement Model can be used to produce a valid and reliable instrument effectively. Thus, based on the examination of the validity and reliability of these instruments, these instruments indicate the quality of the fit to be used for the 'houseman' medical officers in Malaysia.

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