

Are MIS research instruments stable? An exploratory reconsideration of the computer playfulness scale

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Abstract

Computer systems have changed significantly in the past decades and this means that MIS research instruments developed when surveying users of legacy systems could be out-of-date. However, these instruments are often considered stable. We undertook an empirical exploratory investigation of the unidimensionality of the computer playfulness scale because several academics had reported inconsistent item loadings that they could not explain. As a result of our investigation, we concluded that the original computer playfulness construct consists of two correlated but distinct factors when administered to today's IS users. Negatively worded items had no impact on the properties of the scale. Temporal structural stability was hypothesized as an explanation of the observed shift in this construct's psychometric properties.

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1. Problem statement

MIS researchers and practitioners rarely come across a study that fails to achieve its purpose or invalidates a previously supported theory that has been considered a standard. In most journals, a successful application of existing models, methodologies, and instruments is required for paper acceptance. Editors seem reluctant to accept papers that invalidate well-established principles, and reviewers tend to attribute failures to poor study designs [14,23]. Poor study design, however, is not the only source of misfit of well-established research models and instruments.

Contemporary literature in reference disciplines such as sociology often reports on the temporal structural instability of measures. This is in line with the holistic construal of construct validation that suggests it is impossible to find measures that do not vary over time and across contexts [4].

Interpretation of multiple time-point data has a long-standing tradition [28]. For example, the Journal of Sociological Methods and Research devoted an entire issue to the investigation of the reliability and stability of survey items over time [5]. One of the early conceptualizations of this phenomenon is a model for the instability assessment of a variable observed at multiple points in time. It suggests that a variable consists of two components: the true variable score and a random error. The true score is an additive function of two components: the true score at the previous point in time and the disturbance score representing item

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temporal instability. Also, indicator reliability may vary when the same instrument is administered to different populations [29]: the structural stability of a survey instrument may depend on the period of time when the survey took place and the subject population.

There is also a question of the temporal stability of psychological measures. Although personality traits are considered generally stable [17], their intensity may vary over a person's lifespan [19], e.g., young people exhibit a lower degree of trait stability, and some traits have a higher degree of temporal stability than the others [9]. Further, the same survey instrument administered to two dissimilar populations may produce different factor structures [6].

At least five mechanisms are believed to affect trait consistency over time: genetics, identity structure, psychological factors, the environment, and person–environment interactions [20]. Out of these, the environment and person–environment interactions matter because they may influence the individual traits of computer users. A stable environment usually leads to a high level of trait consistency whereas a changing environment results in long-term modification of traits [18]. Person–environment transactions affect traits because people tend to modify their personalities to fit their new environments.

The environment has changed for software users; the software industry has undergone dramatic changes from simple DOS-based applications to virtual reality environments. Therefore, it may be presumed that changes in the computing field might affect people's computer-related traits. Individuals who employed older computer systems and today's users may be two distinct populations exhibiting different computer-related traits. As such, structural instrument stability, also termed factorial invariance, could be compromised if the same standardized scale is administered to different subgroups. Hence, some MIS research instruments may need to be updated to reflect changes.

It has been found, though, that scales developed in the 1980s are generally as reliable as contemporary ones [8]. However, reliability is not sufficient for determining unidimensionality or other facets of validity. Overall, little is known about the temporal structural stability of most MIS scales.

In our investigation, temporal structural stability was assumed to be an explanation for changes in the psychometric properties of a well-known MIS research instrument: the computer playfulness scale (CPS) [27]. The initial study clearly established its validity. A number of follow-up projects seemed to support these conclusions. However, when the short version of the

original computer playfulness questionnaire was used, it was found that three out of the seven items had somewhat lower loadings [22]. An analogous problem with the factor structure was reported in another independent investigation [21]. Woszczynski [30] documented a similar dilemma in her doctoral dissertation. Three US professors stated that they had to exclude the CPS from three of their publications because item loadings were low and inconsistent, and another reported the existence of two factors instead of one. None of them could explain this discrepancy, but all these studies were conducted after 1999, whereas the computer playfulness instrument was developed by investigating users of older software environments in the late 1980s. The purpose of our study was to understand this phenomenon by conducting an exploratory investigation of the current dimensionality of the CPS.

To accomplish our task, we conducted a systematic literature review of journal publications that reported the use of the CPS and conducted an empirical investigation of the factor structure of the instrument and its predictive validity.

2. Computer playfulness

Computer playfulness explains an individual's tendency to interact spontaneously, intensively, openly, creatively, and imaginatively with computers. It emerged from the body of research on play. Playfulness is an appropriate construct in the study of human–computer interactions because computers are relatively easy to use, provide quick responses, offer personalization, and incorporate playful features such as multimedia, graphics, and animation. It was originally operationalized as a trait, expected to be relatively stable over time; in our study, it was also. When the scale was developed, evidence was provided for the construct reliability and validity by conducting five independent studies with over 400 participants. However, recently, confirmatory factor analysis of the CPS revealed that a number of item loadings were lower than that frequently accepted (a threshold of 0.7) (see Table 1).

Loadings above 0.71 are considered excellent, 0.63 very good, 0.55 good, 0.45 fair, and 0.32 poor [24]. The loadings in the studies were generally considered 'very good', but there were items which may be only 'fair'. A subsequent exploratory factor analysis resulted in the emergence of two factors (principal component analysis was applied with an eigenvalue criterion of one, unspecified number of factors). These observations

Table 1
CPS item loadings in three recent studies

Item	Serenko [21], <i>n</i> = 75	Serenko et al. [22], <i>n</i> = 237	Woszczyński [30], <i>n</i> = 127
CPS1-spontaneous	0.568	0.572	0.513
CPS2-unimaginative	0.883	0.756	0.616
CPS3-flexible	0.692	0.62	0.725
CPS4-creative	0.832	0.809	0.716
CPS5-playful	0.601	0.516	0.593
CPS6-unoriginal	0.883	0.732	0.869
CPS7-uninventive	0.871	0.752	0.857

suggested that the CPS might no longer be unidimensional.

3. An analysis of prior CPS studies

A search of the social sciences citation index was done to find published works that utilized the CPS. Eighty-one articles were identified that cited the original paper on scale development. Out of these, 74 only cited the paper or used a modified scale, while seven applied the seven-item original version. Table 2 presents the results, which appear ambiguous.

One study (i.e., [26]) demonstrated CPS validity but two (i.e., [1,10]) reported item loadings that fell below the threshold of 0.71 for ‘excellent’ factor loading, and one project (i.e., [12]) had an item loading below the ‘poor’ threshold. Overall, an ‘ideal’ item should explain at least 50% of construct variance and yield loadings above 0.7. The validity of the findings of two other papers (i.e., [16,31]) may not have been interpreted adequately, because their sample sizes failed to meet the required threshold of 70 (10 times the largest number of indicators, with CPS having 7). Altogether, these studies neither supported nor refuted the validity of the psychometric properties of the instrument. Therefore, additional empirical evidence needed to be obtained.

4. Empirical investigations

4.1. Effect of negatively worded items

The incorporation of negatively worded items is intended to serve as a way of making subjects respond in a more controlled way. This reduces common method bias in self-reporting [15]. However, negatively worded items may generate anti-factors that affect the validity of a presumably unidimensional construct [13]. In order to test whether lower item loadings of the CPS emerged because of negatively worded items, three questions (unimaginative, unoriginal, and uninventive) were rewritten to be positive (imaginative, original, and inventive). Two survey instruments were then created—one that included both positive and negative items (four positive and three negative), and another with seven positive items. In addition, every instrument presented the personal innovativeness in IT scale (PIIT) and two demographic questions. The PIIT construct was chosen because it is similar to the CPS—it assesses personality traits-related to IT usage. Questionnaires were administered to 237 4th year undergraduate and graduate students of a North American university as part of another project, and 132 questionnaires were administered to a different sample from the same population for our study. The order of the questionnaires was randomized.

Table 2
Studies that applied the CPS

Paper	<i>n</i>	Analysis	Lowest item loading	Notes
Agarwal and Prasad [1]	175	CFA	0.63	The loadings of three items were below 0.7
Atkinson and Kydd [3]	78	Linear regression	NA	No factor validity assessment was done
Dijkstra [10]	73	EFA	0.66	The loading of one item was below 0.7
Hackbarth et al. [12]	116	CFA	0.31	The loadings of five items were below 0.7
Potosky [16]	56	CFA	0.71	The sample size is below the minimum threshold of 70
Venkatesh [26]	246	CFA	0.70	No problem reported
Yager et al. [31]	49–62	CFA	0.62	The sample size is below the minimum threshold of 70

Table 3
Comparisons of positive and negative items

	Wording	Mean	Standard	<i>t</i> -Value	Significant
CPS1	Spontaneous	4.87	1.28	0.174	0.862
	Spontaneous	4.84	1.28		
CPS2	Imaginative	4.79	1.44	0.659	0.511
	Unimaginative	4.89	1.37		
CPS3	Flexible	5.58	1.23	0.661	0.509
	Flexible	5.49	1.24		
CPS4	Creative	5.49	1.23	0.310	0.757
	Creative	5.45	1.25		
CPS5	Playful	5.38	1.21	0.130	0.897
	Playful	5.40	1.25		
CPS6	Original	4.74	1.28	0.293	0.769
	Unoriginal	4.78	1.27		
CPS7	Inventive	4.81	1.36	0.230	0.817
	Uninventive	4.78	1.33		

Overall, 369 usable responses were obtained. Of these, 187 questionnaires had both positive and negative items and 182 had only positive. In order to analyze whether negative item wording had an impact on the psychometric properties of the instrument, three tests were conducted. The first test identified differences in the means of positive and negative items. For this, an independent sample *t*-test was conducted for each questionnaire item. As Table 3 shows, there are no statistically significant differences in the means of items CPS2, CPS6, and CPS7. Thus positively and negatively worded items produced similar means.

The second test analyzed and compared factor structures produced by the two sets of data: (a) containing positive and negative items and (b) containing only positive. For this, PFA with Varimax rotation was performed individually on each dataset with unspecified number of factors. With respect to the former dataset, two factors were extracted that explained 60.4% of the variance with eigenvalues of 3.04 and 1.19, for factors 1 and 2 respectively (see Table 4). Note that CPS4 loaded almost equally on both

Table 4
PFA—positive and negative items

	Factor	
	1	2
CPS1	0.102	0.502
CPS2	0.444	0.402
CPS3	0.123	0.662
CPS4	0.488	0.496
CPS5	0.165	0.445
CPS6	0.916	0.090
CPS7	0.763	0.247

Table 5
PFA—only positive items

	Factor	
	1	2
CPS1	0.159	0.570
CPS2	0.534	0.343
CPS3	0.081	0.768
CPS4	0.470	0.472
CPS5	0.156	0.403
CPS6	0.900	0.093
CPS7	0.799	0.192

factors. The dataset with only positively worded items also consisted of two factors that explained 62.2% of the variance with eigenvalues of 3.08 and 1.27 for factors 1 and 2, respectively (see Table 5).

The third test compared the reliability of the scale with both positive and negative items to that with only positive ones; the Cronbach's alpha coefficients were 0.775 and 0.783, respectively. Therefore, these scales behaved reliably and generated similar reliability scores.

This demonstrated that the negatively worded computer playfulness questionnaire items did not have any impact on the instrument's psychometric properties.

4.2. Dimensionality assessment

Lower item loadings may occur because the variance that each indicator shares with the others does not entirely relate to a specific construct—there may be other unspecified latent variables capturing a significant proportion of the uncommon variance of several items. When there is a significant lack of unidimensionality, the conclusions may be unwarranted, unreliable, biased, or unstable [11]. Therefore, it was important to re-examine the dimensionality of the CPS.

Five hundred and seventy-one data points from four independent studies were pooled to assess the CPS dimensionality. Ten observations with missing data were excluded, and thus the final sample size was 561. Table 6 gives the data sources and descriptions. Cronbach's alpha of this dataset was 0.83, an acceptable level of reliability. However, this high reliability coefficient does not warrant unidimensionality. All the studies utilized the PIIT scale, and no PIIT dimensionality problems were observed.

A preliminary assumption of PFA is that variables have linear relationships with one another and the factors. Because Likert-type scales with seven discrete scores were used, the observations were jittered (a small amount of noise was added to the discrete values) [7],

Table 6
Data source and description

Source	<i>n</i>	Subjects	Sex (M%/F%)	Average age
Serenko [21]	75	Users of an agent-based technology	80/20	43
Serenko et al. [22]	237	University students	58/42	25
Woszczyński [30]	127	University students	43/57	22
Present study	132	University students	60/40	25

and the relationships between the items were plotted in a scatter-plot matrix. The plots demonstrated some non-linear relationships and skewed distributions. Given that the CPS items did not have units of measurement, it is reasonable to transform them to linear relationships without impacting interpretability. An estimation of the required multivariate unconditional power transformations to multi-normality by the method of maximum likelihood yielded an optimal transformation vector. This vector of powers was used for transforming the observations using the Box-Cox power transformation [2]. A visual inspection of the obtained scatter-plot matrix revealed two key observations: all items were relatively normally distributed and relationships among the items were reasonably linear. Therefore, the transformed data were appropriate for factor analysis.

PFA with no rotation was applied to the transformed dataset of 561 observations, with a Kaiser Criterion of eigenvalues greater than one. The analysis yielded two factors with eigenvalues of 3.60 and 1.12, respectively. The first captured 51.4% of the variance and the second captured an additional 15.9%, together explaining about two-thirds of the variance. The factor structure for the entire dataset was similar to the factor structures observed in the individual studies. Items CP2, CP6, and CP7 seem to be different from the rest of the items, since they have negative loadings on factor two (see Table 7).

It is reasonable to assume that these two factors are correlated. The factors were previously considered to be a single factor, and all seven items were believed to be consistent. Thus, some correlation is expected between

the emerging factors. Also, the clustering of the items in the non-rotated factor plots indicated that the orthogonal axis system might not be the best fit. A principal factor analysis procedure with oblique rotation (PRO-MAX, Kappa = 4) was applied to the data in order to enable correlation between the factors. Again, two appeared. The first captured 45.7% of the variance in the data and the second captured an additional 10.1%. Altogether, a reasonable portion of the variance was captured by the two factors. Table 8 presents the pattern matrix of the oblique solution.

The correlation between the two factors that emerged was 0.60. Overall, we felt that the obliquely rotated model accurately portrayed the relationships between the constructs, and between the items and the constructs. Fig. 1 presents the two-factor oblique model.

The PFA procedure illustrated that a two-factor oblique model was superior to a single-factor conceptualization of computer playfulness. However, there might be an overarching playfulness construct (a second-order factor) that drives the correlation between the two factors: CPS-a and CPS-b. Second-order models are often employed in various contexts, including MIS [25]. To examine this option, a model-comparison approach was taken, using the structural equation modeling facilities of LISREL.

As such, four plausible structural models were a-priori specified and tested.

- The first assumed that all seven CPS items loaded on a single factor.

Table 7
Principal factor analysis—unrotated solution

	Factor-loadings		Factor-items	
	1	2	1	2
CPS1	0.613	0.375	Spontaneous	
CPS2	0.756	-0.281		Unimaginative
CPS3	0.647	0.487	Flexible	
CPS4	0.791	0.112	Creative	
CPS5	0.582	0.495	Playful	
CPS6	0.780	-0.480		Unoriginal
CPS7	0.810	-0.414		Uninventive

Table 8
Principal factor analysis with oblique rotation

	Factor	
	1	2
CPS1	0.065	0.540
CPS2	0.557	0.207
CPS3	-0.106	0.801
CPS4	0.270	0.566
CPS5	-0.019	0.600
CPS6	0.986	-0.126
CPS7	0.866	0.015

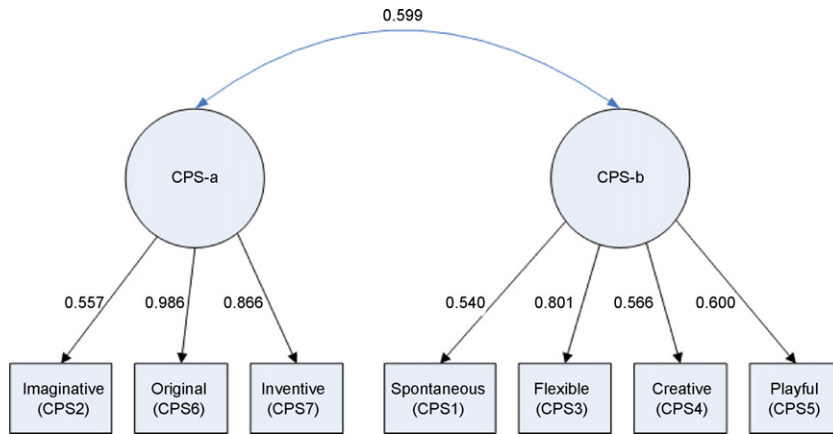


Fig. 1. Relationships between the constructs and the items.

- The second proposed that CP2, CP6, and CP7 loaded on one factor (CPS-a), and CP1, CP3, CP4, and CP5 loaded on another (CPS-b), and that these two factors were orthogonal (did not correlate).
- The third used an identical loading pattern, but allowed the factors to correlate (oblique). This was identified in the PFA procedure.
- The final model assumed that two first-order factors CPS-a and CPS-b, with the loading pattern of model two and three, were reflective indicators of a single second-order factor that had no indicators (see Table 9 for fit statistics).

The two-factor oblique model is superior because it exhibits: the lowest chi-square over degrees of freedom coefficient, the highest fit indices, and the lowest RMSEA. Furthermore, the fit indices of this model met most of the commonly used thresholds for good fit and were consistently better than those of other models.

To assess the significance of the differences among these models, the chi-square difference test was utilized for a direct comparison of nested models, which indicated the inferiority of the nested model. Then, a 90% confidence interval of the RMSEA was assessed for all models including the non-nested ones. Non-overlapping confidence intervals indicated a significant difference.

Among the four tested models there were two pairs of nested models:

1. The two-factor orthogonal model nested in the two-factor oblique model (the orthogonal model can be conceptualized as the oblique model with a constraint on the inter-factor correlation equal to zero).
2. The single-factor model nested in the two-factor oblique model, since the former may be considered to be a two-factor oblique model with an inter-factor correlation of one.

The chi-square difference of the first and second pair is 208 and 200 with one degree of freedom, respectively. The differences are significant ($p < 0.000$) in both cases. Therefore, it may be concluded that the two-factor oblique model is significantly better than the two-factor orthogonal model and the single-factor model. This is further supported by examining the confidence intervals of the RMSEA. The upper bound of the RMSEA of the two-factor oblique model is smaller than the lower bounds of the RMSEA of the two-factor orthogonal model and the single-factor model.

A comparison of the confidence interval of the second-order factor model with that of the two-factor oblique model revealed a slight overlap. Nevertheless, the majority of the confidence interval of the latter was

Table 9
Comparison of plausible computer playfulness factor structures

	Chi-square	d.f.	Chi-square/d.f.	GFI	NFI	CFI	IFI	RMSEA	90% C.I. RMSEA
One-factor model	308.8	14	22.1	0.84	0.81	0.82	0.82	0.22	(0.20, 0.24)
Two-factor orthogonal model	301.2	14	21.5	0.89	0.82	0.82	0.82	0.17	(0.15, 0.19)
Two-factor oblique model	100.6	13	7.7	0.95	0.94	0.95	0.95	0.11	(0.087, 0.13)
Second-order factor model	160.3	14	11.5	0.93	0.90	0.91	0.91	0.14	(0.12, 0.16)

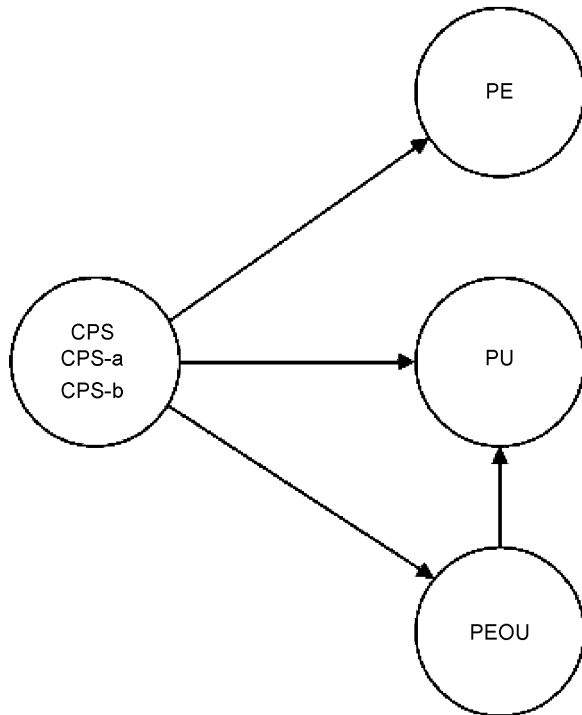


Fig. 2. Predictive validity model.

below the confidence interval of the former, and the overlap was relatively minor. In addition, the fit indices of the two-factor oblique model were consistently better than those of the second-order factor model. It was concluded that, although both models were viable, the two-factor oblique model was superior to the second-order factor and all other models.

4.3. Predictive validity

Because the computer playfulness scale was found to currently consist of two distinct factors, the predictive validity of each was investigated. For this, three constructs: the original CPS, CPS-a (CPS2, CPS6, and CPS7) and CPS-b (CPS1, CPS3, CPS4, and CPS5) were linked to other well-established MIS factors:

perceived enjoyment (PE) perceived usefulness (PU), and perceived ease of use (PEOU). Non-transformed data were used in this analysis. Data for PE, PU, and PEOU were collected as part of two other studies [21,22]. The model (see Fig. 2) was tested by using PLS Graph version 03.00. PLS was chosen because of the small sample sizes of the individual studies (as low as 75). Jackknifing was done to derive *t*-statistics (see Table 10). The results show that, in some cases, the employment of different constructs generated different structural relationships. This further demonstrated the independence of both factors. The Pearson correlation between PIIT and the original CPS, CPS-a, and CPS-b were 0.60, 0.51, and 0.54, respectively, significant at 0.01 levels.

5. Discussion and conclusions

Our purpose was to re-explore the computer playfulness scale because several recent studies had reported on the inadequate psychometric properties of the instrument. To accomplish this, a review of studies utilizing the CPS instrument was conducted and an empirical investigation completed. Overall, we concluded that the original computer playfulness construct represents two correlated yet distinct factors when administered to today's computer users.

We attempted to theoretically explain the obtained two-factor structure. Items that load on CPS-b strongly relate to the initial definition of playfulness (i.e., spontaneous, flexible, creative, and playful). Therefore, this factor can be labeled 'computer playfulness'. Items that load on CPS-a refer to user resourcefulness, and are more associated with the way people approach computer-related problem solving (i.e., imaginative, original, and inventive). This factor can be termed 'interactive resourcefulness' and defined as user capability to challenge the traditional way of doing things in human–computer interaction. Interactive resourcefulness explains how people use their imagination, originality, and inventiveness to complete computer-related tasks.

Table 10
Predictive validity

Study	Construct	PE	PU	PEOU
Serenko [21], <i>n</i> = 75	Original construct	0.33 (<i>p</i> < 0.05)	0.24 (<i>p</i> < .1)	0.24 (ns)
	CPS-a	0.23 (ns)	0.24 (<i>p</i> < .1)	0.20 (ns)
	CPS-b	0.36 (<i>p</i> < .05)	0.19 (ns)	0.248 (ns)
Serenko et al. [22], <i>n</i> = 237	Original Construct	−0.15 (<i>p</i> < .05)	0.18 (ns)	Not tested
	CPS-a	−0.10 (ns)	0.17 (<i>p</i> < .01)	Not tested
	CPS-b	−0.16 (ns)	0.13 (ns)	Not Tested

Today's computer systems are fundamentally different from those used 15 years ago when the original scale was designed. In order to playfully use older systems, users had to demonstrate a great degree of interactive resourcefulness; they had to develop innovative or original ways of performing computer tasks. Therefore, if they demonstrated a high degree of playfulness they must also have had a high degree of interactive resourcefulness. In other words, the dimensions of computer playfulness and interactive resourcefulness correlated highly and assured the unidimensionality of the construct in the past. In contrast, users of contemporary applications are presented with various playful facets, such as animation, sound, two-way interaction, etc. Individuals do not have to look for ways to identify these features in order to interact with computers playfully; these features are readily available. Thus, for many current software users, the dimension of playfulness correlates more modestly with interactive resourcefulness, affecting the unidimensionality of the original computer playfulness construct. Overall, it is believed that the structural stability of the CPS was infringed upon by the introduction of new, playful computing environments, which has resulted in the shift in true scores of the CPS indicators over time.

Given a variety of modern computer applications available to a user, it may be assumed that people vary in their usage of applications that require different degrees of interactive resourcefulness. As such, computer playfulness may become system-specific or environment-specific. If this is true, the entire concept of computer playfulness as a stable trait may need to be reconsidered. One potential solution is to measure system- and environment-specific computer playfulness traits.

It is proposed that not only computer playfulness, but also other MIS research instruments may change their structure over time and as such, should be revisited. Instrument updating has been already taking place in MIS research. For example, some items in TAM2 differ from those utilized in the original TAM because these questions are more relevant to contemporary systems. By reading the latest empirical academic publications, one may notice that some authors make adjustments to some of the previously established and validated instruments to reflect changes in the nature of users, systems, or environments. This fact however has not been clearly acknowledged in the literature, and thus we call for further research on the revision and reconsideration MIS instruments.

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