

Measurement Invariance of the Dirty Dozen: Student and Working Adult Samples

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## Abstract

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12 Now we are evaluating the psychometric properties of the dirty dozen simplified Chinese  
13 version by using samples in real settings: job applicants and incumbents (in addition to  
14 students). We replicate a previous study using the student sample, then continue to  
15 evaluate with organizational data. We find that the scales are non-invariant. Seems to be  
16 revisiting these articles: Geng, Sun, Huang, Zhu, and Han (2015) and Grigoras, Butucescu,  
17 Miulescu, Opariuc-Dan, and Iliescu (2020)

18 *Keywords:* keywords

19 Word count: X

## Measurement Invariance of the Dirty Dozen: Student and Working Adult Samples

Initially we were interested in looking at reliance on student samples. Now we are evaluating the psychometric properties of the dirty dozen (DD) simplified Chinese version by using samples in real settings: job applicants and incumbents (in addition to students). We replicate a previous study using the student sample (Yang gonna send some articles), then continue to evaluate with organizational data. We find that the scales are non-invariant.

SDSME another version (27 items).

All studies investigating psychometric properties of these scales use University students.

Some groups may be expected to exhibit different item-construct associations due to shifting motivational forces.

ITC guidelines for translating and adapting tests recommends looking at possible differences across motives (Commission, 2017). For example,

Yang's references: Church et al. (2011), Schoot, Lugtig, and Hox (2012), Schmitt and Kuljanin (2008), Geng et al. (2015), Grigoras et al. (2020), Jonason and Webster (2010)

## Methods

We applied three different nested multiple group confirmatory factor analysis models progressing through levels of restriction. These invariance tests were evaluations of configural-, weak-, and finally strict-invariance. The weak invariance models constrained factor loadings to be equal across groups and the strong invariance models also constrained intercepts to be equal across groups. We also look at intercorrelations among items within the samplings.

## Participants

In total 1106 individuals responded to the Dirty Dozen (as well as additional scales not the focus of the current presentation). This total was comprised of 208 working adults low-stakes, 527 working adults high-stakes, and 371 students low-stakes individuals. After screening for undifferentiated responses via the R package *careless* (Yentes & Wilhelm, 2021), we retained 1054 respondents who had no more than 6 sequentially identical responses across the 12 total items.

## Materials

Dirty dozen version

## Procedure

Decrease in  $\Delta\chi^2$  across models indicates a lack of invariance (typically not considered a “good thing”). Multiple indices can be consulted across models, including  $\Delta\chi^2$ , RMSEA, CFI, TLI, BIC, and AIC. Our determination of level of invariance achieved was informed by a likelihood ration test

Also want to look at correlations of the simplified Chinese version of the DD with the Honesty-Humility subscales (Sincerity, Fairness, Greed Avoidance, and Modesty).

## Data analysis

We used R (Version 4.0.3; R Core Team, 2021) and the R-packages *careless* (Version 1.1.3; Yentes & Wilhelm, 2021), *corx* (Version 1.0.6.1; Conigrave, 2020), *foreign* (Version 0.8.80; R Core Team, 2020), *lavaan* (Version 0.6.8; Rosseel, 2012), *papaja* (Version 0.1.0.9997; Aust & Barth, 2020), and *semTools* (Version 0.5.4; Jorgensen, Pornprasertmanit, Schoemann, & Rosseel, 2021) for all analyses.

## Results

We looked at structural invariance as well as latent means (Meredith, 1993; Steinmetz, Schmidt, Tina-Booh, Wieczorek, & Schwartz, 2009). The models failed to exhibit metric invariance (Model 2 - Model 1 exhibited a significant  $\Delta$  on both  $\chi^2$  as well as RMSEA)

Not sure how to pull table or identify object elements - `model1` object is too large to navigate easily.

Yang also wanted correlations, but there are no scale scores for students (only item-level responses to the dark triad constructs).

## Discussion

There is a lack of measurement invariance

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Table 1

*Measurement invariance summary statistics.*

	Df	AIC	BIC	Chisq	Chisq diff	Df diff	Pr(>Chisq)
configural	153	37,059.45	37,639.59	1,407.67	NA	NA	NA
weak	171	37,134.71	37,625.60	1,518.93	111.25	18	0.00
strong	189	37,230.25	37,631.89	1,650.47	131.55	18	0.00

*Note.* \*  $p < 0.05$ ; \*\*  $p < 0.01$ ; \*\*\*  $p < 0.001$



Table 2

*Scale intercorrelations (all participants).*

	1	2	3	4	5	6	7	<i>M</i>	<i>SD</i>
1. Machiavelliansm	-							1.62	0.78
2. Narcissism	.29***	-						3.69	1.07
3. Psychopathy	.57***	.19***	-					1.51	0.62
4. Fairness	-.34***	-.02	-.45***	-				5.40	0.84
5. GreedAvoidance	-.26***	-.45***	-.24***	.27***	-			3.52	1.14
6. Modesty	-.23***	-.43***	-.17***	.15**	.43***	-		3.72	0.85
7. Sincerity	-.14**	.04	-.04	.23***	.11*	.18***	-	3.85	0.74
8. HonestyHumility	-.38***	-.37***	-.35***	.61***	.77***	.68***	.51***	4.12	0.59

*Note.* \*  $p < 0.05$ ; \*\*  $p < 0.01$ ; \*\*\*  $p < 0.001$

Table 3

*Scale intercorrelations (working adults low-stakes).*

	1	2	3	4	5	6	7	M	SD
1. Machiavelliansm	-							1.74	0.86
2. Narcissism	.31***	-						3.64	1.10
3. Psychopathy	.61***	.20**	-					1.73	0.74
4. Fairness	-.35***	-.02	-.45***	-				5.27	0.88
5. GreedAvoidance	-.27***	-.45***	-.21**	.30***	-			3.53	1.08
6. Modesty	-.18**	-.42***	-.16*	.24***	.43***	-		3.72	0.82
7. Sincerity	-.15*	.10	-.08	.26***	.13	.14*	-	3.79	0.73
8. HonestyHumility	-.36***	-.33***	-.35***	.68***	.76***	.68***	.52***	4.08	0.59

*Note.* \*  $p < 0.05$ ; \*\*  $p < 0.01$ ; \*\*\*  $p < 0.001$

Table 4

*Scale intercorrelations (working adults high-stakes).*

	1	2	3	4	5	6	7	M	SD
1. Machiavelliansm	-							1.57	0.74
2. Narcissism	.29***	-						3.71	1.06
3. Psychopathy	.53***	.21***	-					1.42	0.55
4. Fairness	-.33***	-.03	-.40***	-				5.54	0.78
5. GreedAvoidance	-.26***	-.46***	-.29***	.24***	-			3.52	1.19
6. Modesty	-.27***	-.43***	-.18**	.06	.42***	-		3.73	0.88
7. Sincerity	-.14*	-.02	.02	.17*	.09	.21**	-	3.90	0.74
8. HonestyHumility	-.39***	-.41***	-.34***	.54***	.78***	.68***	.50***	4.17	0.58

*Note.* \*  $p < 0.05$ ; \*\*  $p < 0.01$ ; \*\*\*  $p < 0.001$

Table 5

Scale intercorrelations (students low-stakes).

	1	2	3	4	5	6	7	M	SD
1. Machiavelliansm	-							NA	NA
2. Narcissism	NA	-						NA	NA
3. Psychopathy	NA	NA	-					NA	NA
4. Fairness	NA	NA	NA	-				NA	NA
5. GreedAvoidance	NA	NA	NA	NA	-			NA	NA
6. Modesty	NA	NA	NA	NA	NA	-		NA	NA
7. Sincerity	NA	NA	NA	NA	NA	NA	-	NA	NA
8. HonestyHumility	NA	NA	NA	NA	NA	NA	NA	NA	NA

Note. \* p < 0.05; \*\* p < 0.01; \*\*\* p < 0.001

	Constrained parameters	Free parameters	comparison model
configural	FMean (=0)	fl+inter+res+var	
Weak/loading invariance	fl+Fmean (=0)	inter+res+var	configural
Strong/scalar invariance	fl+inter	res+var+Fmean*	Weak/loading invariance
strict invariance	fl+inter+res	Fmean*+var	Strong/scalar invariance

Note. fl= factor loadings, inter = item intercepts, res = item residual variances, Fmean = mean of latent variable, var = variance of latent variable

\*Fmean is fixed to 0 in group 1 and estimated in the other group(s)

*Figure 1.* Steps for measurement invariance (taken from Xu, 2012).