

No evidence for a psychological trait of impulsivity

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Since its early psychometric days, impulsivity has been one of the most prominent and well-researched personality traits (1). In recent years, however, a number of researchers have questioned the trait 'impulsivity' by showing how it is simply a conglomerate of other traits (1). Huang and colleagues (2) attempted to address these controversies by applying bifactor analyses on 48 measures of impulsivity, yielding a statistical factor of impulsivity which they interpreted to be a 'valid and useful psychological construct' (p. 1). Here, we question this conclusion for three reasons.

First and foremost, bifactor models provide poor tests for general factor hypotheses because of their high *fitting propensity*, a widely acknowledged issue in the statistical literature (3,4). Specifically, bifactor models tend to fit various datasets reasonably well, and can outperform alternative factor models *even when those other factor models represent the true data-generating process* (see (5) for a simulation). In that sense, well-fitting bifactor models cannot, on their own, 'significantly advance the conceptualization and measurement of construct impulsivity' (or any other psychological construct) (2) (p.1).

Second, in this particular case, the bifactor models do not even fit well. Although the authors suggest that RMSEA and SRMR fit values of 0.06-0.09 represent 'good fit' (p.5), this is not in keeping with established guidelines (6), wherein such values imply moderate-to-poor fit to datasets.

Finally, the authors conflate their *statistical* impulsivity factor as a *psychological* impulsivity factor (i.e., psychological construct), an interpretation that does not follow for several reasons. One of those reasons is *statistical equivalence*: the tendency for theoretically different statistical models to fit a set of data (particularly, cross-sectional) equally well (7,8). To illustrate this problem, we examine whether a network model might also fit the data well. Network models are statistical tests of the network hypothesis which contrasts the bifactor one by implying that psychological constructs (like intelligence, psychopathology, and personality) are not unitary latent variables, but rather networks of mutually reinforcing variables (9).

To test this model, we randomly halve the authors' Wave 1 data (N=1676), applying exploratory network analysis on the first half and confirmatory network analysis (for which we obtain fit indices) on the second half (see <https://osf.io/rdmk5/> for open data and code). Our results show that the confirmatory network model exhibits better fit than the confirmatory bifactor model on Wave 1 (N=838) but not on Wave 2 (N=196) data, most likely due to reduced statistical power (see Table 1 and Figure 1).

These results show that a network model is, at the very least, an equally good summary of the current data, illustrating the unfortunate fact that fit indices alone are inadequate in terms of adjudicating between alternative theoretical viewpoints (7,8). Instead, fit indices should always be complemented with existing multidisciplinary evidence (10). Currently, comprehensive reviews of such evidence suggest that 'impulsivity fails to satisfy even the basic requirements of a psychological construct and should be rejected as such' (2, p.2). Based on this work and the arguments above, we conclude that there is currently no evidence for impulsivity as a 'psychological trait' (3, p.1).

Table 1. Comparison of confirmatory bifactor and confirmatory network models on 48 measures of impulsivity.

Data	Model	$\chi^2(df)$	p	CFI	TLI	RMSEA	AIC	BIC
WAVE 1 (N=838)	Bifactor	6678.39 (1050)	< .001	0.93	0.92	0.057	188740.9	189424.4
	Network	1569.45 (970)	< .001	0.98	0.97	0.027	89417.29	90391.88
WAVE 2 (N=196)	Bifactor	1362.43 (1050)	< .001	0.97	0.96	0.039	22060.25	22473.3
	Network	5496.53 (970)	< .001	0.85	0.83	0.075	88348.92	89323.51

Note. Bold indicates best-fitting model on each dataset.

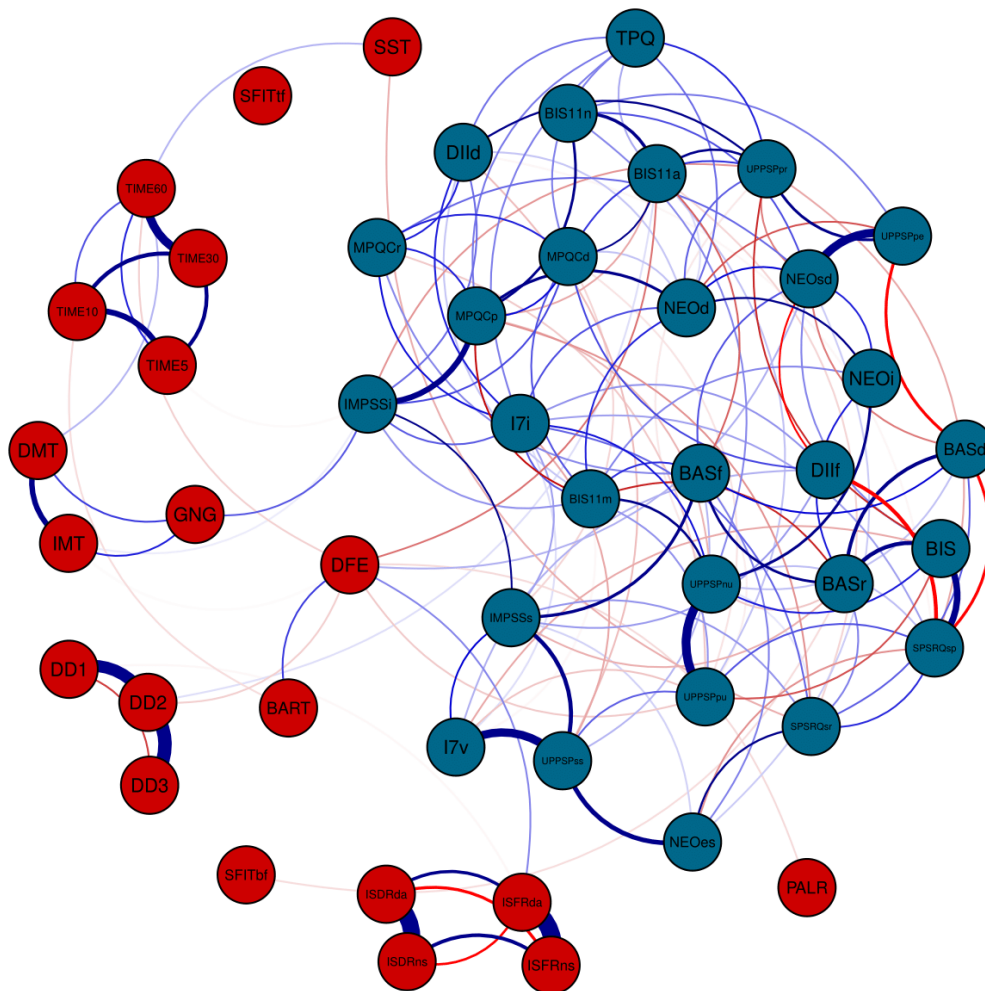


Figure 1. Network model of impulsivity as a set of mutually-influencing traits (blue nodes) and behaviours (red nodes). Positive (negative) edges are depicted in blue (red) colour.

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