Supplemental Material – Corpus

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Publication	Corpus	Terminology	Search Keyword	Introduces Archetype
Beugelsdijk *et al.*, 2004 [BDGVS04]	serendipity	robustness analysis		
Hegre & Sambanis, 2006 [HS06]	serendipity	sensitivity analysis		
Ioannidis, 2008 [Ioa08]	serendipity	vibration of effects		
Carp, 2012 [Car12]	serendipity	variability		yes
Cirillo & Taleb, 2016 [CT16]	serendipity	robustness analysis		
Olkin *et al.*, 2012 [ODT12]	serendipity	between-study heterogeneity		yes
Harris *et al.*, 2013 [HCM13]	serendipity	researcher degrees of freedom		
Young & Holsteen, 2017 [YH17]	serendipity	multimodel analysis		yes
Arslan *et al.*, 2018 [ASGP18]	serendipity	specification curve & robustness analysis		yes
Young, 2018 [You18]	serendipity	multimodel analysis		
Muñoz & Young, 2018 [MY18]	serendipity	robustness analysis		
Poarch *et al.*, 2019 [PVB19]	serendipity	multiverse analysis		
Bastiaansen *et al.*, 2019 [BKB*20]	serendipity	crowdsourced analysis		yes
Donnelly *et al.*, 2019 [DBH19]	serendipity	multiverse meta-analysis		
Kalokerinos *et al.*, 2019 [KECK19]	serendipity	multiverse analysis		yes
Dejonckheere *et al.*, 2019 [DKBK19]	serendipity	multiverse analysis		
Rae *et al.*, 2019 [RGD*19]	serendipity	multiverse analysis		
Voracek *et al.*, 2019 [VKT19]	serendipity	specification curve & multiverse meta-analysis		
Bryan *et al.*, 2019 [BYO19]	serendipity	specification curve		
Botvinik-Nezer *et al.*, 2019 [BNHC*20]	serendipity	crowdsourced analysis		yes
Lonsdorf *et al.*, 2019 [LKJA*19]	serendipity	garden of forking paths		yes
Dragicevic *et al.*, 2019 [DJS*19]	serendipity	multiverse analysis		yes
Liu *et al.*, 2020 [LKAH20]	serendipity	multiverse analysis		yes
Bursztyn *et al.*, 2020 [BRRYD20]	serendipity	robustness checks		
Silberzahn & Uhlmann, 2015 [SU15]	both	crowdsourced analysis	crowdsourced analysis	
Patel *et al.*, 2015 [PBI15]	both	vibration of effects	vibration of effects	yes
Steegen *et al.*, 2016 [STGV16]	both	multiverse analysis	multiverse analysis / vibration of effects	yes
Rohrer *et al.*, 2017 [RES17]	both	specification curve	specification curve	
Cookson, 2018 [Coo18]	both	specification curve & robustness analysis	specification curve	
Silberzahn *et al.*, 2018 [SUM*18]	both	crowdsourced analysis	crowdsourced analysis / multiverse analysis specification curve	yes
Jelveh *et al.*, 2018 [JKN18]	both	specification curve	specification curve / multiverse analysis	
Dejonckheere *et al.*, 2018 [DMH*18]	both	multiverse analysis	multiverse analysis	
Orben & Przybylski, 2019a [OP19a]	both	specification curve	specification curve	
Simonsohn *et al.*, 2019 [SSN19]	both	specification curve	specification curve	yes
Cesario *et al.*, 2019 [CJT19]	both	multiverse analysis	multiverse analysis	
Border *et al.*, 2019 [BJE*19]	both	multiverse analysis	multiverse analysis	
Bruns & Ioannidis, 2016 [BI16]	systematic	vibration of effects	vibration of effects	
Hill *et al.*, 2016 [HHC*16]	systematic	crowdsourced analysis	crowdsourced analysis	
Denny & Spirling, 2018 [DS18]	systematic	multiverse analysis	multiverse analysis	
Dubois *et al.*, 2018 [DGH*18]	systematic	vibration of effects	vibration of effects	
Saggar *et al.*, 2018 [SSGC*18]	systematic	perturbation analysis	perturbation analysis	
Orben *et al.*, 2019 [ODP19]	systematic	specification curve	specification curve	
Orben & Przybylski, 2019b [OP19b]	systematic	specification curve	specification curve	

Figure 1: *All publications in our corpus. The columns indicate how the article was found, the terminology used in the article to describe the multiverse analysis, the search keyword(s) (if applicable) through which the article was discovered, and whether the article introduces a visualization archetype.*

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