Contemporary Understanding of Mediation Testing

Adrian Meule University of Salzburg

This is a commentary about contemporary understanding of mediation testing. Specifically, this commentary highlights that outdated concepts of mediation testing are still highly prevalent in the mindsets of researchers and that many researchers use software based on contemporary mediation testing wrongly, misinterpret results or describe mediation in terms of outdated concepts while inappropriately referring to literature about contemporary concepts.

Keywords: Mediation; Indirect effect; Causal steps approach; Bootstrap sampling; PROCESS

A common question in psychological research is how or through which mechanism(s) an effect occurs. The most basic form of this question can be represented in a simple mediation model, which consists of an antecedent (or independent) variable (X) that is linked to a consequent (or dependent) variable (Y) through an intermediary (or mediator) variable (M; Figure 1).

In 1986, Baron and Kenny published a seminal article, in which they present a mediation analysis method, which is often referred to as the *causal steps approach*. According to this approach, "a variable functions as a mediator when it meets the following conditions: (a) variations in levels of the independent variable significantly account for variations in the presumed mediator (i.e., Path *a*), (b) variations in the mediator significantly account for variations in the dependent variable (i.e., Path *b*), and (c) when Paths *a* and *b* are controlled, a previously significant relation between the independent

Adrian Meule, PhD. Department of Psychology, University of Salzburg, Hellbrunner Straße 34, 5020 Salzburg, Austria. E-mail: adrian.meule@sbg.ac.at.

¹ It is worth pointing out here that this commentary is about statistical mediation testing and not about different study designs that allow for inferring causality. It has been argued that statistical mediation testing has little value when applied to, for example, cross-sectional data. Instead, using cross-lagged repeated measures data or experimental manipulations provides a much stronger argument for the causal direction of effects (Bullock, Green, & Ha, 2010; Spencer, Zanna, & Fong, 2005; Stone-Romero & Rosopa, 2008, 2011). While these issues are important to consider when testing for mediation statistically, they are beyond the scope of this commentary.

and dependent variables is no longer significant, with the strongest demonstration of mediation occurring when Path *c* is zero" (Baron & Kenny, 1986, p. 1176). Thus, a mediation effect can only occur when there is a significant correlation between the independent and the dependent variable and when this relationship is no longer significant when controlling for the mediator. If the mediator does not entirely account for the association between the independent and the dependent variable, it partially mediates that effect. Finally, Baron and Kenny (1986) recommend using the Sobel test (Sobel, 1982) as a formal significance test for the existence of a mediation effect.

The popularity of the Baron and Kenny approach can be seen in that—as of this writing—their article has been cited more than 36,000 times according to Web of Science and more than 80,000 times according to Google Scholar. In 2018 alone, the article has been cited more than 2,000 times according to Web of Science and more than 3,000 times according to Google Scholar. Although the causal steps approach has intuitive appeal, it is now widely accepted that the approach of mediation testing by Baron and Kenny (1986) is obsolete (e.g., Hayes, 2009, 2013, 2017; Hayes & Rockwood, 2017; MacKinnon & Fairchild, 2009; Zhao, Lynch, & Chen, 2010). Specifically, neither are significant relationships between the independent, mediator, and dependent variable a prerequisite for a mediation effect to be possible nor is a significant reduction of the relationship between the independent and the dependent variable by the mediator necessary for inferring mediation. This

2 MEULE

understanding also renders the concept of "partial mediation" moot (e.g., Hayes, 2013; Hayes & Rockwood, 2017; Zhao, Lynch, & Chen, 2010). Finally, inferential tests about mediation based on Monte Carlo or bootstrap confidence intervals rather than the Sobel test are now recommended (Hayes & Scharkow, 2013).

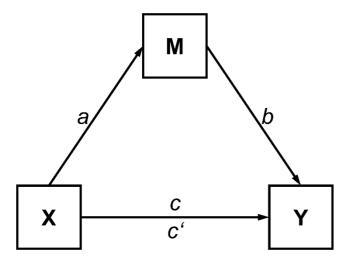


Figure 1. Conceptual diagram of a simple mediation model. X denotes the independent or antecedent variable. M denotes the mediator or intermediary variable. Y denotes the dependent or consequent variable. Path a represents the relationship between X and M. Path b represents the relationship between M and Y when controlling for X. Path c represents the relationship between X and Y (total effect). Path c represents the relationship between X and Y when controlling for M (direct effect). The indirect effect is the product of $a \times b$. The total effect is the sum of the direct and the indirect effect ($c = c' + a \times b$).

In current understanding of mediation testing, the relationship between the independent variable and the dependent variable is called the total effect (i.e., the c path). The relationship between the independent variable and the dependent variable while controlling for the mediator is called the direct effect (usually denoted as c'). The indirect (i.e., mediation) effect is the product of the a and b path (i.e., the relationship [a] between the independent variable and the mediator and [b] between the mediator and the dependent variable when controlling for the independent variable). The total effect is the sum of the direct and indirect effect (total effect = direct effect + indirect effect or $c = c' + a \times b$). Thus, the statistical significance of both the total and the direct effect is irrelevant for the existence of an indirect effect. The indirect effect can be significant (1) in the absence of a direct effect (*indirect-only mediation*), (2) in addition to a significant direct effect of the same sign (*complementary mediation*), and even (3) in addition to a significant direct effect of opposite sign (*competitive mediation*; Zhao et al., 2010). In each case, the significance of the total effect is irrelevant for the presence of a direct or indirect effect.

Note the crucial differences between the causal steps and the contemporary approach. Researchers who adhere to the Baron and Kenny thinking stop when at least one of the three paths (a, b, and c) is not significant. That is, they do not test for mediation because the alleged assumptions to do that are not met (also note that many researchers falsely assume that the b path is the correlation between M and Y although it is the relation between M and Y when controlling for X). In addition, situations like a complementary and competitive mediation (i.e., a significant indirect effect in addition to a significant direct effect) have no place in the Baron and Kenny framework because a significant relationship between X and Y when controlling for M (i.e., the direct effect) would indicate that there is no full mediation effect. Finally, in contemporary thinking about mediation analysis, the indirect effect is either significant or not significant, regardless of the significance of the total effect. As there is, therefore, no need for an "effect to be mediated", the concept of "partial mediation" is incompatible with the contemporary approach.

Most researchers find it difficult to imagine how an indirect effect in the absence of a total effect can be possible. As an example, let us consider the relationship between an impulsive personality and body weight. Several mediation studies showed that higher impulsivity is associated with a higher body weight through eating behavior-related variables (Meule, 2017). In other words, people that are more impulsive tend to overeat, which in turn relates to a higher body weight. However, higher impulsivity also relates to higher substance use (e.g., Stanford, et al., 2009). In turn, active substance users usually have a lower body weight than non-substance users (e.g., Crossin, Lawrence, Andrews, & Duncan, in press). Thus, there may be several indirect effects of impulsivity on body weight with opposite signs (e.g., a positive indirect effect through eating behavior and a negative indirect effect through substance use), which cancel each other out and, thus, there is no significant total effect of impulsivity on body weight (Meule,

Among other tools, mediation analysis can be easily conducted using a macro called PROCESS (www.processmacro.org; Hayes, 2013, 2017). In PROCESS, test-

ing a simple mediation model is based on two linear regression analyses. First, the mediating variable is predicted by the independent variable (a). Second, the dependent variable is predicted by both the mediating variable (b) and the independent variable (c'). The test for inferring whether there is a significant indirect effect (ab) is based on bootstrap confidence intervals. If the confidence interval does not include zero, then it is inferred that the indirect effect is significant, that is, that there is a mediation effect.

Demonstrating the popularity of PROCESS, a white paper about it (Hayes, 2012) has been cited more than 3,000 times and Hayes' book (Hayes, 2013, 2017)—which is the official reference for PROCESS—has been cited more than 18,000 times according to Google Scholar. Unfortunately, while many researchers use PROCESS, it seems like many of them are reluctant to abandon the causal steps logic. Table 1 lists 20 of the more than 5,000 articles that cited Hayes' book in 2018 (according to Google Scholar). As can be seen from this compilation, researchers seem be stuck in the Baron and Kenny thinking although they are using PROCESS or refer to its manual. This is actually mentioned by Hayes himself on his FAQ page:

Good academic practice is to cite something only if you have actually read it and are familiar with its content. I don't recommend using PROCESS without familiarity with what it does, as described in the book. It may not be doing what you think it is doing. I have seen many instances of researchers reporting results from the output of PROCESS that are inconsistent with what PROCESS actually is doing. These mistakes are easily avoided by reading the documentation

(http://www.processmacro.org/faq)

Common mistakes include the following:

- (1) Highlighting the fact that the relationship between X and Y was significant, but was no longer significant when controlling for M, although both of these statements are irrelevant for the existence of an indirect effect when using PROCESS.
- (2) Stating that a variable partially mediated an effect when the direct effect was significant, although the concept of partial mediation is incompatible to what PROCESS does and what Hayes writes in its documentation.
- (3) Reporting results of a Sobel test as an inferential test for mediation, although this is either

redundant (because it will suggest the same conclusion as the bootstrap confidence intervals) or the Sobel test is not significant because it has lower power than bootstrap sampling, which is why it is explicitly recommended by Hayes (2013, 2017) and others (Zhao et al., 2010) to prefer the latter.

In conclusion, researchers still follow the causal steps logic, even when they are using programs that are not based on this logic or when they are referring to literature about contemporary mediation testing. The consequences of these fallacies include minor subtleties (e.g., writing about a direct effect when researchers actually want to refer to the total effect or stating that "an effect was mediated by" a variable) but also redundancy (e.g., reporting results from a Sobel test in addition to bootstrap intervals), possibly unstable results (e.g., when using 1,000 bootstrap samples instead of 5,000 as recommended by Hayes, 2013), prematurely concluding that there was no mediation effect (e.g., when not testing for mediation because one of the paths was not significant), and misinterpreting results (e.g., describing results as full vs. partial mediation). Zhao and colleagues (2010) and Hayes & Rockwood (2017) provide brief and easy-to-read articles in which they outline the drawbacks of the causal steps approach and guide through the rationale and practical implementation of contemporary mediation testing. With such guidance, researchers will hopefully not only use statistical software based on state-of-the-art thinking about mediation, but also adjust their own mindsets accordingly when writing about mediation results.

Open Science Practices

The nature of this commentary meant that there are no data or research materials to be shared.

References

- Alt, N. P., Chaney, K. E., & Shih, M. J. (in press). "But that was meant to be a compliment!": Evaluative costs of confronting positive racial stereotypes. *Group Processes & Intergroup Relations*. doi: 10.1177/1368430218756493
- Baron, R. M., & Kenny, D. A. (1986). The moderatormediator variable distinction in social psychological research: Conceptual, strategic, and statistical considerations. *Journal of Personality and Social*

4 MEULE

Psychology, 51, 1173–1182. doi: 10.1037//0022-3514.51.6.1173

- Bender, A., & Ingram, R. (2018). Connecting attachment style to resilience: Contributions of self-care and self-efficacy. *Personality and Individual Differences*, *130*, 18–20.
 - doi: 10.1016/j.paid.2018.03.038
- Bhalla, A., Allen, E., Renshaw, K., Kenny, J., & Litz, B. (2018). Emotional numbing symptoms partially mediate the association between exposure to potentially morally injurious experiences and sexual anxiety for male service members. *Journal of Trauma & Dissociation*, 19, 417–430. doi: 10.1080/15299732.2018.1451976
- Buckner, J. D., Lewis, E. M., Shah, S. M., & Walukevich, K. A. (2018). Risky sexual behavior among cannabis users: The role of protective behavioral strategies. *Addictive Behaviors*, *81*, 50–54. doi: 10.1016/j.addbeh.2018.01.039
- Bullock, J. G., Green, D. P., & Ha, S. E. (2010). Yes, but what's the mechanism? (Don't expect an easy answer). *Journal of Personality and Social Psychology*, *98*, 550–558. doi: 10.1037/a0018933
- Crossin, R., Lawrence, A. J., Andrews, Z. B., & Duncan, J. R. (in press). Altered body weight associated with substance abuse: a look beyond food intake. *Addiction Research & Theory*. doi: 10.1080/16066359.2018.1453064
- Feinberg, L., Kerns, C., Pincus, D. B., & Comer, J. S. (2018). A preliminary examination of the link between maternal experiential avoidance and parental accommodation in anxious and non-anxious children. *Child Psychiatry & Human Development*, 49, 652–658. doi: 10.1007/s10578-018-0781-0
- Friese, M., Loschelder, D. D., Gieseler, K., Frankenbach, J., & Inzlicht, M. (in press). Is ego depletion real? An analysis of arguments. *Personality and Social Psychology Review*. doi: 10.1177/1088868318762
- Hayes, A. F. (2009). Beyond Baron and Kenny: Statistical mediation analysis in the new millennium. *Communication Monographs*, *76*, 408–420. doi: 10.1080/03637750903310360
- Hayes, A. F. (2013). *Introduction to Mediation, Moderation, and Conditional Process Analysis* [1st ed.]. New York: The Guilford Press.
- Hayes, A. F. (2017). *Introduction to Mediation, Moderation, and Conditional Process Analysis* [2nd ed.]. New York: The Guilford Press.
- Hayes, A. F. (2012). PROCESS: A versatile computational tool for observed variable mediation, moderation, and conditional process modeling [White paper]. Retrieved from

- http://www.afhayes.com/public/process2012.pdf
- Hayes, A. F., & Rockwood, N. J. (2017). Regression-based statistical mediation and moderation analysis in clinical research: Observations, recommendations, and implementation. *Behaviour Research and Therapy*, *98*, 39–57.
 - doi: 10.1016/j.brat.2016.11.001
- Hayes, A. F., & Scharkow, M. (2013). The relative trust-worthiness of inferential tests of the indirect effect in statistical mediation analysis: Does method really matter?. *Psychological Science*, *24*, 1918–1927. doi: 10.1177/0956797613480187
- Karriker-Jaffe, K. J., Klinger, J. L., Witbrodt, J., & Kaskutas, L. A. (2018). Effects of treatment type on alcohol consumption partially mediated by Alcoholics Anonymous attendance. Substance Use & Misuse, 53, 596–605.
 - doi: 10.1080/10826084.2017.1349800
- Li, W., Gao, L., Chen, H., Cao, N., & Sun, B. (2018). Prediction of injunctive and descriptive norms for willingness to quit smoking: The mediating role of smoking risk perception. *Journal of Substance Use*, 23, 274–279.
 - doi: 10.1080/14659891.2017.1394378
- Lum, Z. K., Tsou, K. Y. K., & Lee, J. C. (2018). Mediators of medication adherence and glycaemic control and their implications for direct outpatient medical costs: a cross-sectional study. *Diabetic Medicine*, *35*, 807–815. doi: 10.1111/dme.13619
- Mackenbach, J. D., Charreire, H., Glonti, K., Bárdos, H., Rutter, H., Compernolle, S., ... & Lakerveld, J. (in press). Exploring the relation of spatial access to fast food outlets with body weight: A mediation analysis. *Environment and Behavior*. doi: 10.1177/0013916517749876
- MacKinnon, D. P., & Fairchild, A. J. (2009). Current directions in mediation analysis. *Current Directions in Psychological Science*, 18, 16–20. doi: 10.1111/j.1467-8721.2009.01598.x
- Maroney, N., Williams, B. J., Thomas, A., Skues, J., & Moulding, R. (in press). A stress-coping model of problem online video game use. *International Journal of Mental Health and Addiction*. doi: 10.1007/s11469-018-9887-7
- Meule, A. (2017). Commentary: Questionnaire and behavioral task measures of impulsivity are differentially associated with body mass index: a comprehensive meta-analysis. *Frontiers in Psychology*, 8(1222), 1–4. doi: 10.3389/fpsyg.2017.01222
- Peña, J., Ibarretxe-Bilbao, N., Sánchez, P., Uriarte, J. J., Elizagarate, E., Gutierrez, M., & Ojeda, N. (2018).

- Mechanisms of functional improvement through cognitive rehabilitation in schizophrenia. *Journal of Psychiatric Research*, 101, 21–27. doi: 10.1016/j.jpsychires.2018.03.002
- Polanco-Roman, L., Moore, A., Tsypes, A., Jacobson, C., & Miranda, R. (2018). Emotion reactivity, comfort expressing emotions, and future suicidal ideation in emerging adults. *Journal of Clinical Psychology*, 74, 123–135. doi: 10.1002/jclp.22486
- Poless, P. G., Torstveit, L., Lugo, R. G., Andreassen, M., & Sütterlin, S. (2018). Guilt and proneness to shame: Unethical behaviour in vulnerable and grandiose narcissism. *Europe's Journal of Psychology*, *14*, 28–43. doi: 10.5964/ejop.v14i1.1355
- Quinlan, E., Deane, F. P., Crowe, T., & Caputi, P. (2018). Do attachment anxiety and hostility mediate the relationship between experiential avoidance and interpersonal problems in mental health carers?. *Journal of Contextual Behavioral Science*, *7*, 63–71. doi: 10.1016/j.jcbs.2018.01.003
- Reilly, E. E., Gordis, E. B., Boswell, J. F., Donahue, J. M., Emhoff, S., & Anderson, D. A. (2018). Evaluating the role of repetitive negative thinking in the maintenance of social appearance anxiety: An experimental manipulation. *Behaviour Research and Therapy*, *102*, 36–41. doi: 10.1016/j.brat.2018.01.001
- Roussotte, F. F., Siddarth, P., Merrill, D. A., Narr, K. L., Ercoli, L. M., Martinez, J., ... & Small, G. W. (2018). In vivo brain plaque and tangle burden mediates the association between diastolic blood pressure and cognitive functioning in nondemented adults. *American Journal of Geriatric Psychiatry*, 26, 13–22. doi: 10.1016/j.jagp.2017.09.001
- Sobel, M. E. (1982). Asymptotic confidence intervals for indirect effects in structural equation models. In Leinhart, S. (Ed.), Sociological methodology (pp. 290–312). San Francisco, CA: Jossey-Bass.
- Spencer, S. J., Zanna, M. P., & Fong, G. T. (2005). Establishing a causal chain: why experiments are often more effective than mediational analyses in examining psychological processes. *Journal of Personality and Social Psychology*, 89, 845–851. doi: 10.1037/0022-3514.89.6.845
- Stanford, M. S., Mathias, C. W., Dougherty, D. M., Lake, S. L., Anderson, N. E., & Patton, J. H. (2009). Fifty years of the Barratt Impulsiveness Scale: An update and review. *Personality and Individual Differences*, 47, 385–395. doi: 10.1016/j.paid.2009.04.008
- Stone-Romero, E. F., & Rosopa, P. J. (2008). The relative validity of inferences about mediation as a

- function of research design characteristics. *Organizational Research Methods*, 11, 326–352. doi: 10.1177/1094428107300342
- Stone-Romero, E. F., & Rosopa, P. J. (2011). Experimental tests of mediation models: prospects, problems, and some solutions. *Organizational Research Methods*, 14, 631–646.

doi: 10.1177/1094428110372673

- Varni, J. W., Shulman, R. J., Self, M. M., Saeed, S. A., Zacur, G. M., Patel, A. S., ... & Denham, J. M. (2018). Perceived medication adherence barriers mediating effects between gastrointestinal symptoms and health-related quality of life in pediatric inflammatory bowel disease. *Quality of Life Research*, *27*, 195–204. doi: 10.1007/s11136-017-1702-6
- Widmer, E. D., Girardin, M., & Ludwig, C. (2018). Conflict structures in family networks of older adults and their relationship with health-related quality of life. *Journal of Family Issues*, 39, 1573–1597. doi: 10.1177/0192513X17714507
- Yildirim, C., & Dark, V. J. (2018). The mediating role of mindfulness in the relationship between media multitasking and mind wandering. In Proceedings of the TechMindSociety '18. ACM, New York, NY, USA. doi: 10.1145/3183654.3183711
- Zhao, X., Lynch, J. G., & Chen, Q. (2010). Reconsidering Baron and Kenny: Myths and truths about mediation analysis. *Journal of Consumer Research*, *37*, 197–206. doi: 10.1086/651257

6 MEULE

Table 1 Some recent examples of articles referring to mediation analyses with PROCESS (Hayes, 2013)

	Indirect effect(s) ofstereotype valence on favorable evalu-	Issues
Alt et al.	stereotype valence on favorable evalu-	
		- Followed the causal steps logic by highlighting that "the direct effect [] was no
(in press)	ations through perceived offensiveness	longer significant" (pp. 6, 7, 10)
Bender et	closeness, dependability, and anxiety	- Followed the causal steps logic by stating that significant direct effects suggest
	on resilience through self-care and self-efficacy	"partial mediation" (p. 19)
	exposure to potentially morally injuri-	- Followed the causal steps logic by stating that "this was a partial mediation, as
al. (2018)	ous events on sexual anxiety through emotional numbing	the direct effect [] remained significant" (p. 424)
	cannabis use on condom use through protective behavior strategies	- Followed the causal steps logic by highlighting that "there was no longer a significant direct effect" (p. 52)
	experiential avoidance on accommodation through beliefs about anxiety	- Followed the causal steps logic by highlighting that "when negative beliefs about child anxiety were incorporated into the model this direct effect was no longer significant" (p. 652)
(in press)	ego depletion on performance through monitoring processes and self- efficacy	 Followed the causal steps logic by describing mediation in terms of the Baron and Kenny approach (p. 9) Confused total effect with direct effect
	treatment type on alcohol consump-	- Followed the causal steps logic by stating that "effects of treatment type on alco-
	tion through treatment duration and Al- coholics Anonymous attendance	hol consumption [are] partially mediated by Alcoholics Anonymous attendance" (p. 596)
	injunctive and descriptive norms on willingness to quit smoking through	- Used 1,000 bootstrap samples although Hayes (2013) recommends using a minimum of 5,000 bootstrap samples
:	smoking risk perception	- Followed the causal steps logic by stating that "smoking risk perception partially mediated the association between descriptive norms and willingness to quit smoking" (p. 277)
(2018)	medication adherence on glycated he- moglobin concentration through diabe- tes-related distress and perception of	- Tested simple mediation models with the causal steps approach and the Sobel test, but a subsequent multiple mediation model with PROCESS/bootstrapping (p. 810)
•	hyperglycaemia	- Followed the causal steps logic by referring to full/complete vs. partial mediation
	access to fast food outlets on over-	- Tested mediation effects with the Sobel test
	weight through perceived availability and usage of fast food outlets	- Followed the causal steps logic by not testing for mediation for certain outcomes because "none of the a - or b -paths were statistically significant" (p. 17) and highlighting how much of the total effect can be explained by the indirect effect ("proportion mediated", p. 9)
al. (in press)	depression, loneliness, and social anxiety on problem video game use through escapism and social interaction motives for gaming	- Followed the causal steps logic by stating that "these effects being partially mediated by escapism and social interaction motives for gaming" (p. 1)
Peña et al. (2018)	cognitive rehabilitation on functional improvement through changes in processing speed and verbal memory	- Followed the causal steps logic by stating that the mediating variable "partially mediated" the relationship between the independent and dependent variable (p. 23)
Polanco-	emotion reactivity on suicidal idea- tion through depressive symptoms	- Followed the causal steps logic by highlighting that "the direct effect of emotion reactivity on suicidal ideation, though reduced, remained statistically significant after comfort expressing love, happiness, anger, and sadness were entered into the model [], but was no longer significant after depressive symptoms were entered in the model" (p. 128)
	narcissism on ethical behavior by guilt repair through guilt	- Tested mediation effects with the Sobel test - Followed the causal steps logic by highlighting the significant total and non-significant direct effects (Figures 1-4 on pp. 34-35)
al. (2018)	experiential avoidance on interper- sonal problems through attachment anx- iety and hostility	- Followed the causal steps logic by describing results as full vs. partial mediation (pp. 66-68)
Reilly et al. (2018)	pretest social appearance anxiety on posttest social appearance anxiety through repetitive negative thinking	- Followed the causal steps logic by describing results as partial mediation (p. 39)
Roussotte et al.	diastolic blood pressure on cognitive functioning through brain plague and tangle burden	- Used 1,000 bootstrap samples although Hayes (2013) recommends using a minimum of 5,000 bootstrap samples

Varni et al. (2018)	gastrointestinal symptoms on health- related quality of life through perceived medication adherence barriers	- Followed the causal steps logic ("If the 95% confidence interval for a \square b does not include 0 and the association between the predictor and outcome variables including the mediator variable (i.e., the c -path) is no longer significant, then a significant ($p < 0.05$) mediation has occurred.", p. 16) - Tested mediation effects with the Sobel test in addition to bootstrap sampling - Confused total effect with direct effect and followed the causal steps logic ("mediators are intervening variables that are hypothesized to account partially or in full for the relationship between a predictor variable and an outcome variable [] the predictor variable is hypothesized to have a direct effect on the outcome variable", p. 198)
Widmer et al. (2018)	family conflict on health through individual stress	 Used 1,000 bootstrap samples although Hayes (2013) recommends using a minimum of 5,000 bootstrap samples Additionally tested mediation effects with the Sobel test
		- Confused total effect with direct effect and followed the causal steps logic ("the inclusion of stress reduces the direct association between conflict structures and the psychological dimensions of health", p. 1590)
Yildirim & Dark (2018)	media multitasking on mind wander- ing through trait mindfulness	- Followed the causal steps logic ("Given that all paths were statistically significant, that the inclusion of trait mindfulness as a mediator led to reductions in the magnitude of the effect of media multitasking frequency on mind wandering tendency (path c' < path c), and that the indirect effect of media multitasking frequency on mind wandering tendency through trait mindfulness was significant, it can be concluded that trait mindfulness partially mediated the relationship between media multitasking frequency and mind wandering tendency.", p. 3)