

Curtailling data biases in business research: Introducing a hybrid approach

MUHAMMAD AFTAB ALAM* AND OMAR KHALID BHATTI**

Abstract

This study elucidates the falsity of business research in relying on either respondents or informants alone for data collection, and argues that with the biased data, business research cannot provide unbiased solutions. We compare 400 reports (200 respondents and 200 informants) on the workplace deviance and assess the goodness of both the techniques. Analysis of variance and *posthoc* (descriptive discriminant analysis) indicate significant disparities between the two approaches across all items. In the informant's role, people tend to overreport, whereas in the respondent's part they underreport an undesirable behavior. Further, we find that conventional techniques for assessing the construct's validity and common-method bias neither assures realistic measurement nor eliminate the response bias. Drawing on the theory of psychological projection, we propose a hybrid approach that curtails some of the main biases in data and measurement. Qualitative confirmation through informal interviews with managers in the investigated firms validates the proposed method.

Keywords: data, bias, informant, respondent, method, research

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INTRODUCTION

The research aims to discover and disseminate facts about the world. Researchers postulate hypotheses, collect data, and test whether or not the hypotheses are consistent with the data. While researchers aspire rigor, errors are inevitable (Simmons, Nelson, & Simonsohn, 2011). Rigor is essential for advancing research and is a major factor in defining the right problem and suggesting the appropriate solution (Spradlin, 2012; Hsieh, 2013). Notwithstanding its importance, measurement in business research is often one of the main weaknesses (Mersman & Donaldson, 2000). There is increasing concern that 'most current published research findings are false' (Ioannidis, 2005: 0696). Further, the notion that our published research literature is lacking and untrustworthy has gained prominence (Ioannidis, 2005; Schooler, 2011; John, Loewenstein, & Prelec, 2012; Brutus, Gill, & Duniewicz, 2013; Cumming, 2014; Sinha & Hassan, 2014; Yüksel, 2017). According to Simmons, Nelson, and Simonsohn 'Ambiguity is rampant in empirical research' (2011: 1360). This tendency, however, is not driven by researchers' willingness to deceive but by biased data, which convince researchers that the outcomes are the most appropriate. Numerous misperceptions in business literature result from researchers' myopic reliance on partial data, which is exacerbated by a lack of verification. For example, a widely held notion that 'high rewards necessarily enhance employee

* Department of Marketing and Management, Macquarie University, Sydney, NSW, Australia

** College of Business, Antaliya Bilm University, Antalya, Turkey

Corresponding author: m.alam@mq.edu.au

productivity' lived long to misinform the business practice. Facts came to a head more recently when a high profile study discovered that under certain circumstances, rewards and financial inducements adversely affect the performance, and may not be relied upon to yield optimal behavior, particularly for jobs that involve cognitive skills (Ariely, Gneezy, Loewenstein, & Mazar, 2009). The incongruity between 'what science knows and what business does' (Pink, 2009) may be due to several factors including incorrect data and picking and choosing inappropriate methods (Cumming, 2014). Simmons, Nelson, and Simonsohn argue that 'undisclosed flexibility in data collection and analysis allows presenting anything as significant' (2011: 1359).

Studies that do not heed accuracy in data gathering fail to extract the real message and focus the right problem (Bendle & Wang, 2016). Without exactitude, they explore blind alleys synonymous with the prose 'scratching a place that is not itching.' They waste resources and generate unrealistic results (Morse, Barrett, Mayan, Olson, & Spiers, 2008; Simmons, Nelson, & Simonsohn, 2011; Hsieh, 2013). In the similar vein, Yüksel (2017) documents that research findings in the organization studies based on questionnaires (i.e., semantic differential and Likert items) are doubtful and such growing trend can potentially damage the bottom lines of business. Sackett and Larson (1990) analyzed the studies published during 1977–1987 in the renowned organization behavior journals and found that more than one-third of the published work was questionnaire-based; 83% adopted a cross-sectional data design, and a majority of them relied on self-report measures. Espousing self-reports for assessing behavior have many response biases (Huber, 1985; Schwartz, 1999; Stone, Bachrach, Jobe, Kurtzman, & Cain, 1999; Donaldson & Grant-Vallone, 2002; Scholderer, Grunert, & Brunso, 2005). It inflates causal and correlational relationships (Borman, 1991; Spector, 1994; Yüksel, 2017). Researchers (e.g., Donaldson & Grant-Vallone, 2002; Sinha & Hassan, 2014; Peticca-Harris & Elias, 2016), suggest 'informant approach' for data collection, but it also suffers from many disadvantages (Kumar, Stern, & Anderson, 1993). There is a body of literature (Fisher, 1993; Wade & Tavis, 2000) suggesting that reports of peers are the projection of one's own behavior – since there's a lower cost to pointing the finger at peers than there is to report on one's own conduct.

Organization theorists (Wagenmakers, Wetzels, Borsboom, & van der Maas, 2011; Cumming, 2014; Yüksel, 2017) increasingly recommend adopting new techniques to ensure research integrity and suggest making substantial changes to how we collect data and carry out analysis. These include avoidance of data bias, selection of appropriate data analytic practices, fact finding, reassurance of replication, and complete reporting. Our aim here is to clarify why the changes are needed and to recommend how, practically, business research should proceed. We believe that identifying what is false is as essential to science as knowing what is true. We, therefore, first elucidate the falsity of business research for its reliance on either respondent-based approach (RBA) or informant-based approach (IBA) in measuring a particular behavior. We explain it through an analysis of data collected from 200 respondents and 200 informants on workplace deviance (WD). Our primary goal is to revisit the data collection approaches – examining whether IBA and RBA accurately measure the actual behavior. Our second goal is to investigate the extent to which the conventional techniques for assessing the goodness of measure such as common-method bias and construct validity eliminate the response bias and assure the validity of realistic measurement. We separately evaluate the construct validity, common-method bias, and reliability of each method. Given the pervading biases in both the data collection methods, we propose a hybrid approach by drawing on the theory of psychological projection (Freud, 1890; Wade & Tavis, 2000). It espouses an indirect questioning technique (Fisher, 1993). The hybrid approach recommends data collection from an equaled split sample of respondents and informants, assuming that taking their mean values for every item can epitomize the actual behavior that would otherwise be confounded by using any method alone. The study validates the efficacy of hybrid approach through qualitative confirmation by informal discussions with senior managers in the investigated firms and review of the literature.

	Minor	Serious
Organizational	<i>Production Deviance</i> <ul style="list-style-type: none"> • Leaving early from the office • Taking excessive breaks • Intentionally working slow • Wasting company resources 	<i>Property Deviance</i> <ul style="list-style-type: none"> • Sabotaging office equipment • Accepting kickbacks • Lying about working hours • Stealing from company
Interpersonal	<i>Political Deviance</i> <ul style="list-style-type: none"> • Showing Favoritism • Gossiping about co-workers • Blaming co-workers • Competing non beneficially 	<i>Personal Aggression</i> <ul style="list-style-type: none"> • Sexual harassment • Verbal abuse • Stealing from co-workers • Endangering co-workers

FIGURE 1. ROBINSON AND BENNETT (1995) TYPOLOGY OF DEVIANT WORKPLACE BEHAVIOR

LITERATURE REVIEW

WD

First, we highlight the salient features of WD before methodically probing the data collection approaches that are commonly used in the management research. The construct of WD conceptually draws on the viewpoint of Robinson and Bennett (1995). It states that WD is a voluntary behavior that defies instructions, and in so doing it threatens the interest and well-being of the organization and/or its members (Sulaiman & Bhatti, 2013). The term ‘voluntary behavior’ indicates the deviant behavior (Kaplan, 1975) and covers a range of conducts that may cause damage or harm (Spector & Fox, 2005). Prior studies use different terms for WD such as workplace violence (Bentley, Catley, Forsyth, & Tappin, 2013), antisocial behavior, retaliation, workplace incivility, aggression, organizational misbehavior, employee theft and revenge, dysfunctional behavior, deliberately working slower, and unconventional practices (Spector & Fox, 2005). Robinson and Bennett (1995) identify two main classes of deviant behavior at the workplace: (a) interpersonal deviance, which insinuates abnormal behavior toward other individuals within an organization, and (b) organizational deviance, which indicates nonstandard behavior toward the organization. Based on the target and severity, Robinson and Bennett (1995) categorize WD into four types: (1) property deviance; (2) production deviance; (3) political deviance, and (4) personal aggression (see Figure 1).

Interpersonal deviance comprises being hurtful or unkind in dealings, stealing from other colleagues, acting rudely, threatening workmates, and quarreling and gossiping about others (Robinson & Bennett, 1995). Whereas, organizational deviance implies unexpected behavior toward the organization that comprises leaving early, deliberately working slower, wasting the business resources, embezzlement and stealing, and damaging office equipment (Robinson & Bennett, 1995; Bennett & Robinson, 2000).

Respondents and informants

Respondents describe their own opinion, feeling, and behavior, whereas informants summarize observed or expected relations, and generalize about the pattern of behaviors (Seidler, 1974). ‘Individual’ as the unit of analysis was coined and popularized by Allport brothers. They believe that the psychology of group is essentially and entirely the psychology of an individual (i.e., Allport, 1924; Allport, 1968). They theorize group as an aggregate of individuals, and thus, examine the group phenomenon from individual’s perspective, presuming that people are mindful of their cognition and rational behavior (Sinha & Hassan, 2014). Similarly, Edwards (1957) also speculates that social reality depicts the totality of how individuals perceive it, and advocates getting direct responses from individuals about their feelings regarding a particular psychological aspect. However, the reliability and validity of self-reporting method have been the focus of scholarly discourse. Even the proponents of RBA (e.g., Edwards, 1957; Triandis, 1980) indicate

their disbelief in the data collected through this approach and admit that people are hesitant to express their sincere feelings on controversial matters.

Self-reports have two main problems: first, they are prone to many response biases (Schwartz, 1999; Stone et al., 1999; Donaldson & Grant-Vallone, 2002; Scholderer, Grunert, & Brunsø, 2005), and second, they lead to inflated causal and correlational relationships (Borman, 1991; Spector, 1994). When the subjects respond to a stimulus that is presented by the researcher, they distort their answer due to various confounding factors such as social desirability, idealism, peer pressure, and cultural authority. Notably, the effects are more pronounced in the collectivist culture where respondents' reports are more influenced by the social norms than their self-belief and personal view (Triandis, 1995; Sinha & Hassan, 2014). Researchers concerned with quantitative investigations in organizational behavior, particularly in the business context, frequently confront the lack of archival data for measuring the constructs of interest. Thus, they often rely on reports of informants (Peticca-Harris & Elias, 2016). IBA is useful when an in-depth information about a particular behavior cannot be expected from the survey respondents.

IBA has various methodological and theoretical benefits (Seidler, 1974; Phillips, 1981; Golden, 1992; Chen, Farh, & MacMillan, 1993; Sinha, 2010). For example, in the informant's role, people are free from their personal view of social reality and make observations objectively. The IBA is also beneficial in evading the stringent sampling representativeness, which is obligatory in case of RBA. A convenience sampling technique can empirically provide an outsider's opinion about a particular behavior. However, like other methods, IBA is not without some significant drawbacks (Provan & Skinner, 1989; Heide & John, 1990; Chen, Farh, & MacMillan, 1993; Kumar, Stern, & Anderson, 1993; Triandis, 1994). Random error and informant bias can considerably taint the informant's report. Random error is mainly the fallout of attributional bias, hindsight bias, subliminal attempts of keeping one's self-esteem and impression management (Salancik & Meindl, 1984; Huber, 1985). Data bias also results from variations related to the changing role of informants in an organization (Seidler, 1974; Phillips, 1981). Mostly, there is little similarity between actual event and informant's report. For instance, the role of a CEO's varies from that of a second-level executive because their understanding of events is influenced by their respective positions in the organization (Hambrick, 1981; Golden, 1992). Errors also tend to be more prominent for informants whose roles are not intimately connected to the issue under study. Moreover, other idiosyncratic and retrospective sources of errors may contaminate the informant's view (Huber, 1985; Golden, 1992). It suffers from mistakes in recalling the past events or retention problem, and distortion of informant's memory (Nutt, 1986; Golden, 1992). Likewise, IBA suffers from selection difficulty – identifying informants who are capable enough to comment on a particular behavior, and perceptual agreement problem – concerning variation in the multiple respondents' reports (Heide & John, 1990; Kumar, Stern, & Anderson, 1993).

To evaluate the informant's competency, researchers rely on the length of informant's tenure with the investigated firm (Phillips, 1981), the time-span that informant has observed or interacted with the companies (Phillips, 1982), and the level of their knowledge (Cusumano & Takeishi, 1991). Many researchers (e.g., Provan & Skinner, 1989; Heide & John, 1990) suggest not using IBA due to lack of qualified informants. Consequently, researchers recommend the consensual approach for multiple informants (Glick, Huber, Miller, Doty, & Sutcliffe, 1990), and consensus-averaging methods for interorganizational research (Kumar, Stern, & Anderson, 1993), but they have scarcely been adopted in the organizational research.

METHOD

Study setting

We assess respondent and informant data and espouse a hybrid tactic for resolving the discrepancies between the deviant behaviors measured through the two approaches. The primary data were collected

in a self-administered manner from employees of 12 business groups comprising manufacturing and services industry in Pakistan. Four facets of WD described by Robinson and Bennett (1995) were employed in a questionnaire. Questionnaires were distributed to 800 participants (400 using RBA and 400 IBA), and a total of 592 were returned. After data screening, it was found that only 416 (200 RBA and 216 IBA) were fully attempted. To ensure an equal representation, 16 IBA reports were excluded randomly. The final sample comprised 200 surveys from RBA and 200 from IBA. Data normality were assessed through Skewness and Kurtosis values, and they were found within limits, that is, between ± 1.0 . The study followed commonly recommended techniques separately for both the approaches such as evaluating the construct validity, reliability, and common-method bias. The correlations between the four facets of WD and the participant's demographic factors were analyzed, and the model fit was assessed through renowned model fit indices.

Hybrid approach

Given the perennial biases in respondent and informant reports (discussed earlier), the issue of disparity was deliberated with the academicians. After discussion and having it honed by the experts, we propose a hybrid approach that involves data collection through both methods. Following a convenient sampling method, this study randomly distributed an equal number of adapted (respondent and informant) version of the same questionnaire to the subjects. Data collection procedure following this technique would adequately cater for various response biases (Triandis, 1994; Schwartz, 1999; Donaldson & Grant-Vallone, 2002; Sinha & Hassan, 2014). This method also caters for selection and the perceptual problems of informants due to their role, competency, qualification, knowledge, and perception indicated by previous researchers (e.g., Seidler, 1974; Phillips, 1981; Huber, 1985; Chen, Farh, & MacMillan, 1993; Kumar, Stern, & Anderson, 1993; Spector, 1994; Stone et al., 1999). The hybrid approach considers the difference between respondents and informants scores as the confidence interval, believing that the real parameter estimate is somewhere between the two limits (Donaldson & Grant-Vallone, 2002). Thus, computing mean values for all the items' scores from respondents and informants formed the hybrid data consistent with the statistical and consensual method specified by Kumar, Stern, and Anderson (1993).

Principally, the hybrid approach adopts an indirect (i.e., structured projective) questioning technique that is frequently applied in social sciences to reduce social desirability bias, which results from the respondents' desire to avoid embarrassment and projecting a favorable image to others (Fisher, 1993). It draws on Sigmund Freud's (1890) theory of psychological projection. Psychological projection is a defense mechanism in which people unconsciously rejects their undesirable behaviors and ascribe them to others around them. For instance, an individual who is rude accuses others of being rude. According to research, such projection of unpleasant qualities onto others is common in everyday life (Wade & Tavris, 2000). Hybrid approach complements the RBA and IBA offering a more inclusive approach to measuring organizational/group behavior.

Measures

The construct (WD) was measured using RBA and IBA through 21-items developed by Bennett and Robinson (2000) using a 7-point Likert-type scale (1 = 'never,' to 7 = 'always'), with the Cronbach's α reliability of 0.84 (RBA), 0.88 (IBA), and 0.86 (hybrid). Example items for respondents comprised 'Taken office property without permission' and 'Come in late to work without permission,' etc. Items were slightly adapted to match the informant mode (Harkness, 2010), example items included 'Employees in my organization take office property without permission' and 'Employees in my organization come in late to work without permission,' etc. The gist of the items is provided in Table 1.

TABLE 1. GIST OF ITEMS WITH INFORMANT'S AND RESPONDENT'S SCORES

Theme of items	Informant			Respondent		
	Mean	SD	t	Mean	SD	t
Taking office property without permission	3.5	1.0	46.1	1.58	0.66	33.4
Spending too much time daydreaming instead of working	3.31	0.95	49.0	1.61	0.72	31.2
Falsifying receipts for more money than spent	2.88	0.92	43.9	1.3	0.55	32.9
Taking additional or longer breaks than is acceptable at workplace	3.12	0.86	51.0	1.58	0.71	31.1
Coming late to work without permission	2.97	0.82	50.5	1.5	0.70	30.2
Littering the work environment	3.02	0.71	59.2	1.29	0.51	35.2
Neglecting to follow boss's instructions	3.18	0.78	57.0	1.67	0.63	37.0
Intentionally working slower than they could have worked	3.35	0.87	53.9	1.48	0.62	33.4
Using facebook, blogs, etc., which is not related to their job	3.68	1.0	50.0	1.65	0.81	28.4
Discussing confidential company info with unauthorized individuals	3.02	0.78	54.1	1.46	0.62	32.9
Putting little effort into work	3.06	0.78	55.0	1.39	0.56	34.7
Dragging out work in order to get overtime	3.32	1.0	46.6	1.35	0.56	33.7
Taking medical certificate on purpose	2.95	0.82	50.3	1.25	0.49	35.4
Making personal calls using company phone lines	3.69	1.0	50.4	1.9	0.90	29.7
Making fun of others at work	2.97	0.81	51.7	1.44	0.62	32.6
Saying something hurtful to others at work	2.91	0.79	51.6	1.38	0.57	34.0
Making ethnic, religious, or racial remarks at work	2.47	0.67	51.4	1.25	0.55	31.8
Cursing others at work	2.83	0.79	50.4	1.33	0.58	32.0
Playing mean pranks on others at work	2.64	0.65	56.5	1.24	0.51	34.1
Acting rudely toward others at work	2.82	0.77	51.6	1.46	0.61	33.4
Publicly embarrassing/humiliating others at work	2.75	0.71	54.2	1.32	0.58	32.0

Note. The scores represents retorts from 200 respondents and 200 informants.

Common-method bias

Since all the data were collected using a common technique (questionnaire), the study assessed the likelihood of common-method variance in both the approaches independently. We used Herman one-factor test (Podsakoff, MacKenzie, Lee, & Podsakoff, 2003), as well as common latent factor method (Gaskin, 2012). In Herman one-factor test, the lone extracted factor in IBA (15.32% explained variance) and RBA (10.69% explained variance) accounted for much lower than 50% explained variance in WD. Similarly, the results of common latent factor method (IBA 14% and RBA 10% explained variance in WD) indicate that both approaches are free from common-method bias.

Construct validity

We assessed the convergent and discriminant validity of measures. Factor loading of all items and their significance to the construct in both approaches was evaluated separately. The standardized loadings above 0.4 and $p \leq .001$ for all items indicated the acceptable convergent validity of both approaches (Hair, Black, Babin, Anderson, & Tatham, 2006). The results for both methods had $\chi^2/df \leq 5.0$ and root mean square error of approximation ≤ 0.05 that confirmed the discriminant validity of the constructs (Hair et al., 2006).

RESULTS

Respondent and informant approach

The scores on 21 items of WD from 200 informants and 200 respondents are provided in Table 1. The data from both approaches exhibited a normal distribution; however, IBA was more Kurtotic and

TABLE 2. COMPARISON BETWEEN RESPONDENT AND INFORMANT DATA ON WORKPLACE DEVIANCE

Workplace deviance	Respondent approach			Informant approach			Difference F	Hybrid approach (95% confidence interval)				
	Mean	SD	SE	Mean	SD	SE		Mean	SD	t	Lower	Upper
Property deviance	1.45	0.50	0.036	3.29	0.84	0.059	691.44**	2.376	1.15	41.14**	2.26	2.49
Personal aggression	1.47	0.51	0.036	2.99	0.72	0.051	578.48**	2.230	0.98	45.07**	2.13	2.32
Production deviance	1.58	0.58	0.041	3.14	0.78	0.055	502.74**	2.365	1.04	45.46**	2.26	2.46
Political deviance	1.29	0.40	0.028	2.81	0.63	0.045	814.04**	2.056	0.92	44.22**	1.96	2.14

Note. ** $p \leq .01$.

presented higher mean values. Given the two methods, it is evident from the results that significant discrepancy exists across all items. The mean values, standard deviation, and t scores depict an altogether different pattern of WD. The informants reported that employees in the investigated firms have a higher level of deviant behavior. On the contrary, respondents reported significantly lower on all indicators of WD. The general impression that can be inferred from the scores presented in Table 1 is that informants tend to overreport the observed pattern of undesirable behavior (Salancik & Meindl, 1984; Huber, 1985), and indicate a high level of WD. Whereas, respondents, in contrast, tend to distort their answer by underreporting their own behavior on similar items (Schwartz, 1999; Donaldson & Grant-Vallone, 2002; Sinha & Hassan, 2014) and report a lower level of WD.

Overall then, the outcomes from these alternate approaches suggest that while both the methods are valid, reliable, and free from common-method bias (method's assessment techniques in vogue), there are significant discrepancies between their results across all four dimensions of WD. Further, we conducted the independent sample analysis of variance to examine whether the mean scores on the four WD dimension vary across respondents and informants, and to determine the dimension on which the two approaches differ significantly. Results show a significant group effect indicating that the RBA and IBA deviate significantly on all four attributes. Table 2 presents the means, standard deviations, standard error, and results of the analysis of variances on the WD dimensions. Results indicate that the two approaches vary on all four dimensions of WD, that is, property deviance ($F=691.4$, $p < .01$), personal aggression ($F=578.5$, $p < .01$), production deviance ($F=502.7$, $p < .01$), and political deviance ($F=814$, $p < .01$). The overall results of RBA show that respondents report production deviance as the most prominent deviant behavior followed by personal aggression, property deviance, and political deviance. The IBA, on the contrary, say property deviance as the most prominent deviant behavior followed by production deviance, personal aggression, and political deviance.

Posthoc analysis

With the results provided in Table 2, a *posthoc* analysis, that is, the descriptive discriminant study was conducted to calculate discriminant functions (uncorrelated linear functions) that further elucidate the disparities between two approaches for better interpretation (Stevens, 2002; Warne, 2014). First, the group statistics reveal that informants had significantly higher scores on all four facades of WD (production deviance being the highest). The test of equality of group means shows that the two approaches are significantly different across all four facades of WD (political deviance had lowest Wilk's $\lambda = 0.246$, $p < .001$). Second, as projected the Box's M (40.49, $p < .001$) exhibits unequal group

variance. Third, the statistical significance of the prediction model (Wilk's $\lambda = 0.245$, $p < .001$) indicate that higher and lower scores on the WD facets significantly predict a particular approach (i.e., RBA or IBA). Also, the standardized canonical discriminant function coefficient shows that production deviance has the highest predictive ability of group membership to RBA and IBA. With relatively high disagreements between the two approaches, the present study model appears reasonably accurate (Warne, 2014).

Hybrid approach

With the hybrid approach (Table 2) the mean scores of all four facades that were low from RBA's perspective, and high from IBA's view, attain a somewhat balanced estimate. The hybrid data offer a normal distribution with significant t values for upper and lower bound limits of all four dimensions of WD.

The significant disparities in correlation coefficients between WD and the demographic features among RBA, IBA, and hybrid approach can be witnessed in Table 3. For example, unlike RBA, the IBA shows a negative correlation between WD and the employee position suggesting that employees at the higher position have less deviant behavior compared with, the lower level. Likewise, IBA indicates negative correlations between education level and WD stating that with the increase in employee level of education the deviant behavior decreases, whereas RBA shows a positive relationship. Similar disparities exist for the type of industry, that is, IBA indicates less WD in the service sector as compared to manufacturing, but RBA shows different results altogether. The RBA illustrates significantly negative correlations between employee age and WD, whereas, IBA provides opposite results. Likewise, RBA suggests that married employees have lower WD, but IBA indicates married employees are more inclined toward WD. As alluded above, the two approaches also provide varying results regarding the relationship between WD and other attributes, that is, gender, education, job experience, the size of an organization, position in the organization, and the position's time-span. The hybrid approach, however, does not find a significant relationship between WD and employee gender, age, job experience, and time-span of the position held.

DISCUSSION

This research has two main findings. First, the conventional approaches for assessing construct's validity and common-method bias do not guarantee that the measure is correctly evaluating the parameter, and is free from the response bias. Cronbach and Meehl (1955) argue that construct validity indicates the degree to which particular test measures what it purports, or claims to be measuring. Likewise, in the applied statistics (i.e., applied to the social sciences), common-method bias or common-method variance is 'the spurious variance, which is attributable to the measurement method rather than to the construct that the measures are assumed to represent' (Podsakoff et al., 2003). Employing the commonly used assessment techniques for assessing the goodness of test, construct validity and common-method variance, this study found that both approaches are statistically reliable, valid, and free from common-method bias (Cronbach & Meehl, 1955; Podsakoff et al., 2003; Hair et al., 2006). Nevertheless, they generate significantly different results that point to dissimilar patterns of deviant behavior. Thus, as shown by previous researchers (e.g., Becker & Vance, 1992; Donaldson & Grant-Vallone, 2002), we argue that the currently most advanced methodical procedures available for identifying the response bias, they are less likely to illustrate the actual behavior; therefore some new methods are needed.

Second, as do prior researchers (Sinha, 2010; Sinha & Hassan, 2014), this study finds significant variation across all items between respondents and informants. The results (Table 3) suggest that RBA

TABLE 3. COMPARISON BETWEEN RESPONDENT, INFORMANT, AND HYBRID APPROACH BASED ON CORRELATIONS

Workplace deviance	Gender	Age	Marital status	Education qualification	Industry	Job experience	Size of organization	Position held	Position time-span
Respondent approach									
Property deviance	0.110	-0.347**	-0.118	0.008	0.018	-0.256**	-0.177*	-0.109	-0.241**
Personal aggression	0.176*	-0.172*	-0.208**	0.268**	-0.154*	-0.076	0.000	0.251**	-0.209**
Production deviance	0.100	-0.290**	-0.140*	0.127	-0.046	-0.200**	-0.065	0.070	-0.280**
Political deviance	0.086	-0.189**	-0.011	0.037	0.013	-0.137	-0.157*	-0.076	-0.090
Informant approach									
Property deviance	-0.141*	0.119	0.353**	-0.099	-0.580**	0.043	0.287**	-0.344**	0.037
Personal aggressions	-0.040	0.139*	0.314**	-0.039	-0.584**	0.030	0.190**	-0.307**	0.049
Production deviance	-0.085	0.102	0.313**	-0.065	-0.573**	0.021	0.282**	-0.300**	0.011
Political deviance	-0.014	0.135	0.315**	0.038	-0.639**	0.009	0.237**	-0.243**	-0.034
Hybrid approach									
Property deviance	-0.072	-0.020	-0.415**	0.029	-0.359**	0.021	0.118*	0.074	0.065
Personal aggression	-0.013	0.019	-0.434**	0.110*	-0.399**	0.054	0.131**	0.172**	0.064
Production deviance	-0.047	-0.031	-0.405**	0.067	-0.370**	0.010	0.138**	0.118*	0.023
Political deviance	-0.037	0.019	-0.421**	0.091	-0.371**	0.040	0.106*	0.125*	0.079

Note. * $p \leq .05$; ** $p \leq .01$ (two tailed).

and IBA are not uniform and perceptual disagreement exists across all four facets of WD between respondents and informants. The respondents report a significantly lower level of WD as compared to informants. These results support the assertions of prior researchers that respondents distort their answers due to numerous biases and confounding factors such as, peer pressure, idealism, social desirability, and cultural authority (Campbell & Fiske, 1959; Huber, 1985; Schwartz, 1999; Stone et al., 1999; Donaldson & Grant-Vallone, 2002; Scholderer, Grunert, & Brunsø, 2005). The effects may be more pronounced in this study because it is conducted in the collectivist culture where social norms get more preference than self-belief and personal attitudes (Triandis, 1995; Sinha & Hassan, 2014). The informants, on the other hand, report significantly higher WD. These results sustain the idea that random error (owing to attributional bias, hindsight bias, and subliminal attempts of keeping one's self-esteem and impression management) potentially taints the informant reports (Huber, 1985). The overrated reports on all facades of WD can also be attributed to variations in the informant's role (Seidler, 1974; Phillips, 1981). The correlational analyses of the four dimensions of WD with the employees' and organizational characteristics (Table 3) support the notion of data partiality; spurious correlations miscalculated claims, and the flawed research posited by prior researchers (Borman, 1991; Spector, 1994; Morse et al., 2008; Cumming, 2014). Moreover, the significant disparities between RBA and IBA (discussed earlier) rise suspicions about the validity of outcomes (Scholderer, Grunert, & Brunsø, 2005).

A body of literature documents that researchers' degree of freedom in sampling, data collection and analysis is a main reason behind misinterpreting results and reaching incorrect conclusions (Ioannidis, 2005; Schooler, 2011; Simmons, Nelson, & Simonsohn, 2011; Wagenmakers et al., 2011; John, Loewenstein, & Prelec, 2012; Cumming, 2014; Yüksel, 2017). This stream of literature suggests that when a researcher faces unclear analytic decisions, tends to conclude that the right decision is the one that is statistically significant ($p \leq .05$). This tendency lead to one of the costliest errors, the menace of false positives – incorrectly rejecting a null hypothesis (Simmons, Nelson, & Simonsohn, 2011). False positives can potentially lead to ineffectual policy changes thereby decreasing the credibility of research (Simmons, Nelson, & Simonsohn, 2011; Cumming, 2014). As can be seen in the case of IBA and RBA, the results from two approaches pinpoint a different set of problems tempting researcher to suggest altogether different solutions. The proposed hybrid approach, however, reveals that among the

nine demographic factors (Table 3), the problematic is the deviant behavior of unmarried employees at higher positions in the large manufacturing firms regardless of their gender, age, job experience, and position. To assess the cogency of these results, we conducted informal interviews with senior managers in the investigated firms.

Validity of hybrid approach

We compared the present results (hybrid approach) with the findings of prior empirical research and views of the senior executives (General Managers and senior HR managers) in the investigated firms to assess the validity and practical application of the proposed approach. First, the managers had different views regarding the relationship between deviant behavior and employees' age, education, experience, and gender. Regarding employee education, they had mixed feelings. Some were of the opinion that less educated employees are more deviant, whereas, others asserted that the frequency of WD is higher among more educated employees. These findings are in line with the results of hybrid approach as well as prior literature (e.g., Nor Hayati, 2006; Sulaiman & Bhatti, 2013). Second, nine out of the ten GMs, which we interviewed were unequivocal that they had maximum complaints of deviant behavior about unmarried employees. The similar results were obtained through the hybrid approach. Third, prior studies (e.g., Bell & Hughes-Jones, 2007; Hershcovis, Reich, Parker, & Bozeman, 2012) point that employee behavior varies among manufacturing and services industry. Results of hybrid approach also show that employees in services industry have higher WD. Likewise, all HR managers concurred that their services strategic business units had reported more instances of WD as compared to their production units. Fourth, they also said in close congruence with the present result that larger units had more cases of WD. Not only because, they have a large number of employees, but mostly because of weaknesses in the organizational defense mechanism. Finally, as do present results, seven out of ten participants indicated that employees at the higher position have more deviant behavior as compared to employees at the lower level regardless of how long they had held the position. Prior research (Haidt, Koller, & Dias, 1993; Brewer, Mitchell, & Weber, 2002; Hershcovis et al., 2012) also suggests that hierarchical position influences the behavior of employees.

The illustrated variations between RBA and IBA results (discussed earlier) exhibit how easily an incorrect data can mislead researchers, and how data collection poses potential threats to the validity of management research. Misinformed decisions based on biased data can result in increased costs, higher operational inefficiencies, and more risks (Simmons, Nelson, & Simonsohn, 2011; Yüksel, 2017). The example presented in this study is like many others that people in the organizations see frequently. Researchers try to fix a particular problem; they speed toward a quick fix, fearing that in-depth data gathering may take long to get to the starting line. Since they do not employ a rigorous method for data compilation that helps understand the right problem and its implications for the firm, they fail to tackle the fundamental issues (Spradlin, 2012). This study advocate using two data sources to help rule out the validity threats of mono-method biases in organizational research. Employing multiple lines of evidence, in contrast to either one (respondent or informant), is more desirable for avoiding the biases (Shadish, 1993).

Limitations and prospects

Management researchers must address some critical issues in future studies. First, in this paper, the empirical analyses are based on cross-sectional data collected for WD. The findings may differ for other constructs of concern to business psychologists, and it limits the present study to sort out causal relationships. For instance, the fear of reprisal and social desirability are open to reverse causality with alternative explanations. Therefore, unequivocal interpretation of present results must be treated

cautiously. Second, it should not be automatically assumed that hybrid is always the best approach, that self-reports are dubious in all settings, or that informants are necessarily superior to respondents (Howard, 1994). The proposed hybrid method is just an improvement to IBA and RBA and is more appropriate for collectivist culture. It has its downsides that are open for further development. Further research is required for developing some inclusive framework that can guide which behavioral and psychological measures are likely to be valid under particular circumstances (Kumar, Stern, & Anderson, 1993). Third, it is indeed more demanding to assure that research is focusing the right problem (Spradlin, 2012), than suggesting the solution. Future research should explore the additional validity and reliability measures ensuring that research is addressing the right issue. Fourth, research also needs to examine the effect of editorial preferences in publishing studies with a statistically significant or favorable outcome more than studies that show unfavorably different results. Finally, WD is among the variables that are frequently analyzed by organizational researchers. Though the proposed (hybrid) approach seems to apply across a wide range of variables in business research, the external validity and robustness of this technique need to be established in future studies.

Suggestions and conclusions

Response biases are more prevalent than thought. Yüksel (2017) shows that due to response bias even a correctly established research would produce unsatisfying results. In social pressures, the respondents more likely give meaningless replies. Biased data spuriously increase the internal consistency, reduces the validity and provides unreliable frequency distributions (Dolnicar & Grun, 2009; Peer & Gamliel, 2011). Response bias also significantly affect statistical investigations, and hence research outcomes. Mainly, it can lead to biased results in analyses that are based on correlations (Yüksel, 2017). When the standard deviations rise, and correlations fall, it mainly affects regression analysis or factor analysis because they primarily use correlations as their basis (Peer & Gamliel, 2011; Yüksel, 2017). Further, boredom and fatigue of respondents can also increase the chances of dropout (study abandonment), and it also results in sampling biases posing severe complications to studies relying on the representativeness of sample (such as experiments, public opinion surveys).

Numerous procedural remedies are recommended to protect against data bias. For example, changing the question formats (as done in this study), more careful development of survey items, balancing the positive and negative worded items, cautious wording, employing different methods for collecting data for every construct (Yüksel, 2017). Some statistical remedies may include latent factor method, marker variable method through correlation-based and regression-based technique, etc. (Podsakof, MacKenzie, & Podsakoff, 2012). However, the effectiveness of all such remedies is still debatable owing to perceptual blindness, motivational factors, and memory limitations that may cause biased responses (Yüksel, 2017). Despite deliberate research efforts, the results based on biased data can potentially mislead decisions (Cumming, 2014). Evidence in this study suggests that collecting data through both the IBA and RBA (adopting the hybrid approach) can possibly decrease data bias to an optimum level.

It is important to note that social desirability would be higher in a collectivist culture where individuals delineate themselves regarding collectives, where they follow social customs rather than personal attitudes and prefer relationships over rationality (Triandis, 1995). This cultural idyllic implies that respondents present themselves in a manner that is socially desirable. Sinha (2010) argues that studying social reality in collectivist culture would entail placing respondents in the role of informants. Because in the informant's role they are likely to distance themselves from their personal views and make impersonal observations of the social reality. Also, collectives, not individuals, are the core of social reality in a collectivist culture, it is more appropriate to ask respondents about the way they view collectives rather than they see themselves. The field of anthropology and sociology

(that studies the social reality) have indeed established a popular tradition of employing informants (Bernard, Killworth, Kronenfeld, & Sailer, 1984; Campbell, 1955).

We exposed the falsity of business research in relying on either respondents or informants for data collection, and argue that with the partial data it cannot focus the right problem or suggest a practical solution. This study also provide empirical evidence that renowned techniques for eliminating the common-method bias and establishing construct validity do not serve the purpose. We proposed a hybrid approach for data forming, particularly for studies that are intended to infer causal relationship in the context of organizational behavior. In offering the hybrid approach, we do not suggest that researchers should abandon the methods outlined by previous researchers. Our goal here is not to provide a recipe for deciding the ideal approach for measuring a particular behavior. Instead, with little change in sampling technique and added data collection, our recommended method curtails some of the primary biases and problems related to data cogency in the organizational research. The purpose is to advance the measurement techniques by integrating the strengths of existing approaches to seek some substantial grounds for further work. It is in this spirit that we urge researchers to use the hybrid methods in future research and look for new improvements.

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