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Examining the Influence of Trustworthiness, Financial Rewards, and Admiration for Crowdsourcing in the Post COVID-19 Period

Marcello Mariani  and Sheshadri Chatterjee 

Abstract—Over the past two decades, crowdsourcing activities have expanded considerably. More recently, the COVID-19 pandemic has radically changed the way people live and work, and the way organizations do business. So far, not many studies have analyzed if and to what extent trustworthiness can influence the admiration to practice crowdsourcing and could reward financial benefits in the COVID-19 period. Against this background, in this article, the aim is to investigate the influence of crowdfunding trustworthiness and financial rewards on the success of crowdsourcing activities. The analysis is made more complete by including technology leadership support as a moderator. With the help of the existing literature and theories, a research model has been developed conceptually, which was later validated using the partial least square-structural equation modeling technique on a sample of 319 responses from participants based in Europe and Asia. The study found that lucidity, gamification, exposure, and coordination along with financial rewards positively influence admiration for crowdsourcing, which, in turn, positively impacts successful crowdsourcing practices in the COVID-19 period. The study also shows that there is a significant moderating impact of technological leadership support on successful crowdsourcing practices in the COVID-19 period.

Index Terms—Admiration, coordination, COVID-19, crowdsourcing, entrepreneurship, financial rewards, gamification, lucidity, technology leadership support (TLS), trustworthiness.

I. INTRODUCTION

FROM a societal and economic perspective, the COVID-19 pandemic can be considered as a disruptive event [1]. This health crisis has led to unforeseen consequences in most of the sectors and society [2], [3]. More specifically, the COVID-19 pandemic has acted as a catalyst to bring a change to business activities and patterns [4]. During and after the worst moments of the COVID-19 outbreak, resilience, coordination, and synergy have been critical elements for crisis management also in relation

to business [5]. The challenging scenario brought about by the COVID-19 pandemic highlights that the existing traditional processes of doing business are often not adequate. More efforts are needed to appropriately coordinate resources. More specifically, digital technologies and innovative digitally informed processes are increasingly deployed to coordinate and organize resources useful to address the global pandemic. Organizations that can rely on platform business models and that are digital oriented can reach out to a global audience by using crowdsourcing to counteract societal and medical issues. By leveraging the enormous power of the crowd, crowdsourcing is considered a substantial and effective mechanism for facilitating the coordination of large groups of individuals that can help solving various business-related problems. More specifically, crowdsourcing is particularly effective in generating new information relevant to the business context along with the creation of innovative ideas [6]. This process has been widely recognized as an additional coordinative technique for businesses that need to access quickly and conveniently essential resources and outside knowledge [7]. Examples are not rare in medical contexts, where through crowdsourcing, it has been possible to collect large volumes of valuable data to develop the accurate research responses to address the outbreak of diseases brought about by the COVID-19 pandemic [8], [9]. Crowdsourcing activities help establishing working relationships with outside providers possessing specific know-how that helps crowdsourcing-seeking organizations to improve their processes in the areas of product development and supply chain reconfiguration [10]. Apart from generating quick responses to urgent business and societal needs, crowdsourcing can provide access to solutions from remote knowledge domains. Recently, crowdsourcing is effectively helping governments coordinating appropriate resources to solve multifarious societal issues and is supporting nongovernmental organizations to be able to identify novel solutions to address different societal challenges [11]. Several initiatives demonstrate that organizations have already started to harness crowdsourcing activities to address issues, such as the COVID-19 pandemic. For instance, a recent report [12] shows that the World Health Organization had developed an important database leveraging data collected from different hospitals globally. These data consist of anonymous records regarding patients who had contracted the COVID-19 viruses

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that provide details about treatment procedures and prescribed medicines. This database, which is the byproduct of crowdsourcing, is tangible global evidence of how crowdsourcing can help address societal issues and unforeseen detrimental crises situations in the present but also in the future. Crowdsourcing refers to the practice of an organization or an agent of outsourcing tasks to the wider public/society who are usually recruited using the internet [13]. To develop innovative works, many organizations are using the crowdsourcing approach in different fields [14], [15]. Many global organizations, such as Google, Dell, P&G, SAP, and others, have become successful by building their own crowdsourcing platforms to handle such tasks that need human contribution [16], [17]. These tasks include knowledge sharing and intelligence assimilation [7], operational cost saving [18], and improving organizational innovative system [19]. However, despite all these advantages, it has been observed that all the crowdsourcing initiatives have not yielded successful results in the guise of innovative outcomes, operational cost savings, and so on [15], [18], [20]. Organizations are experiencing such challenges to fetch successful outcomes using crowdsourcing due to paucity of knowledge of the salient factors that could accurately predict the success of crowdsourcing in the wake of the COVID-19 crisis [15], [21].

Apart from financial rewards, proper exposure and lucidity of the organizations seeking crowdsourcing along with trustworthiness have been considered as a decisive factor for successful crowdsourcing initiatives especially during and in the wake of the COVID-19 pandemic [6], [22], [23], [24]. Crowdsourcing may help organizations to successfully coordinate with external players for establishing working relationships to reconfigure their efficiency in supply chains, improve their processes for product development, along with enhancing specific features and functionalities of the products [10], [25]. Based on the critical role played by crowdsourcing to address the challenges brought about by the COVID-19 pandemic, this study addresses opportunities and challenges linked to crowdsourcing from a managerial and societal perspective. This can lead to develop readiness and resilience in the wake of the lingering COVID-19 pandemic and in view of similar extreme events and crises. However, unless the factors that could impact crowdsourcing practices in the wake of the COVID-19 pandemic period are properly identified to improve organizational innovation [19], it would not be possible to harness the potential stemming from crowdsourcing initiatives [26]. It is argued that technology leadership support (TLS) can influence the crowdsourcing process. Indeed, TLS encompasses how a leader uses technology during her daily tasks while leading others to successfully complete their assigned tasks [15], [27]. This can eventually influence the success of crowdsourcing activities. The process of crowdsourcing is mostly impeded because crowdsourcing seekers neither do clearly expose the rewards to be given to the crowdsourcing contributors nor do the seekers explicitly communicate to potential contributors the specific conditions for providing contributions. As a result, most of the contributors cannot trust the crowdsourcing seekers. Thus, trustworthiness and support of the crowdsourcing seekers are perceived to be highly important since they will help address

information asymmetry issues, enhance effective communication and coordination with the contributors of crowdsourcing initiatives, and reduce uncertainty in the minds of the external participants as to whether the organizations will keep their promises and deliver rewards after project completion [26].

Existing studies have highlighted that despite the multiple advantages of crowdsourcing, such as intelligence assimilation, cost savings, as well as the improvement of organizational innovation capabilities [7], [18], [19], organizations have been experiencing entangled challenges to harness the potential of crowdsourcing [20]. To address such challenges, trustworthiness of the organizations involved in crowdsourcing activities is one of the main critical factors [6], [22]. In such context, although the success of crowdsourcing is increasing rapidly [17], the factors that could impact trustworthiness, financial rewards to the contributors, as well as admiration to the seekers for improving the overall crowdsourcing activities are severely underexplored [26]. Researchers have emphasized the importance of studying the success and outcomes of crowdsourcing activities [17]. However, most of these research studies have been conceptual in nature. Those studies tried to identify the factors predicting trustworthiness in the context of crowdsourcing [26]. However, those few empirical studies neither explicitly investigate the impact of trustworthiness on successful crowdsourcing activities nor did these studies analyze the moderating role that TLS can play in successful crowdsourcing activities. To bridge this research gap, the aim of this study is to address the following research questions (RQs).

RQ1: How does crowdsourcing trustworthiness impact successful crowdsourcing practices (SCPs) in the wake of the COVID-19 pandemic?

RQ2: Does TLS moderate successful crowdsourcing activities?

Our findings contributed to enhancing both theoretical and managerial knowledge by investigating the success of crowdsourcing from the organizers' trustworthiness perspective. This study, therefore, provided a granular investigation on determining how different salient factors of crowdsourcing trustworthiness are effective especially in the wake of the COVID-19 pandemic to achieve successful crowdsourcing with the help of effective technological support. To address the RQs, we have developed a theoretical model and validated it by deploying a partial least square (PLS) structural equation modeling (SEM) technique through the analysis of 319 responses from European and Asian respondents. To empirically substantiate the research findings, this study successfully integrated trust theory [28] and motivational theory [29] to explain how different factors could help improve crowdsourcing practices in the wake of the COVID-19 pandemic, considering, as a moderator, TLS.

The rest of this article is organized as follows. Section II illustrates the literature review, and it is followed by the theoretical foundations and hypotheses development in Section III. Thereafter, Section IV describes the research methodology that is followed by data analysis and results presented in Section V. Finally, Section VI develops the discussion, illustrates the theoretical contributions, the practical implications, identifies the limitations, and develops a research agenda.

II. LITERATURE REVIEW

The COVID-19 pandemic not only posed multiple challenges to individuals' health but it also affected several businesses and kept on affecting both individuals and organizations in the wake of the COVID-19 pandemic [30]. The challenging scenario set by COVID-19 has suggested that the prevailing business practices are not adequate, and that the world requires searching for innovative and digital means to adequately respond to such apocalyptic challenges [5], [31]. With its platform structure as well as digital nature capable of reaching global audience, crowdsourcing is perceived to be one of the most promising remedies to critical pandemic crises [9], [32]. Several studies have highlighted that crowdsourcing may be conceptualized as the activity for advertising a task to an unknown crowd rather than to a team or a designated organization [33]. Not many studies dealing with crowdsourcing have analyzed factors, such as the trust of the organizers, and no analysis has been conducted on the incentive toward participating in crowdsourcing activities. Crowdsourcing could help business organizers to address issues in the wake of COVID-19. It might also help different governments coordinate resources to solve various societal problems [11]. Some research has demonstrated that nonspecific public volunteers help the organizers of crowdsourcing, and these nonspecific volunteers are mostly recruited through virtual platforms [13], [17]. However, none of these studies have investigated the issue of incentivization of crowdsourcing and its popularity. Crowdsourcing is gaining momentum in the business domain [20], and as such, it has become an important topic for researchers to analyze how to be successful in crowdsourcing initiatives [34]. Extant studies have illustrated that the success of crowdsourcing principally depends on, and is related to, three specific factors, which include the following:

- 1) optimization of crowdsourcing management task design;
- 2) stimulation of participation toward crowdsourcing;
- 3) improvement of technologies for being more involved in crowdsourcing activities [19], [35].

Thus, not many studies are found in the extant literature on how trustworthiness of the organizers of crowdsourcing activities may act as an essential predictor for achieving success in crowdsourcing practice [7], [18]. Several studies have shown that the main actors and beneficiaries of crowdsourcing are the organizers who are the crowdsourcing seekers, and whose characteristics are critical to achieve success in crowdsourcing practices [22], [36]. Several studies have identified factors, such as the admiration of the crowdsourcing organizers [26], their lucidity in actions, and ability for better coordination with the crowdsourcing contributors [26] that are critical in SCPs. A study has observed that since crowdsourcing contributors are supposed to enjoy more freedom in choosing their tasks, motivating these contributors to participate in the crowdsourcing activities is also considered as a key issue for successful crowdsourcing activities [37]. To motivate the contributors, it is essential for the crowdsourcing organizers to enhance the way they present the crowdsourcing activity through game-like system designs, appropriate exposure, and ability to reward financially the contributors: this could lead the contributors to

admire the organizers [38]. If these qualities of the crowdsourcing organizers are cultivated, it is argued that crowdsourcing activities will be successful even after the COVID-19 pandemic period. However, in such context, the crowdsourcing organizers need to act as champions to ensure success in crowdsourcing activities by using advanced (digital) technologies [38]. Thus, it is argued that trust in the crowdsourcing organizers and the motivation of the crowdsourcing contributors play critical role to achieve success in crowdsourcing activities even after any crisis. This corroborates motivation and trust theories [28], [29], [39]. Extant literature has emphasized that due to the abrupt outbreak of COVID-19 pandemic, the existing business practices are not adequate to address the apocalyptic situation [31] and several scholars have suggested that to reach out to a global audience in such a crisis, crowdsourcing is one of the best available solutions [9], [32]. Other studies have also demonstrated that trust of the organizations in the matter of crowdsourcing for attracting the contributors is deemed to be important [6], [22]. However, extant literature has not explicitly explained how factors, such as trustworthiness, rewarding, and innovativeness, could impact SCPs in the wake of the COVID-19 period. Consequently, there is an important gap in the literature that this study tries to bridge. To visualize the literature and the contributions, a summary has been included in Table I.

III. THEORETICAL FOUNDATIONS AND HYPOTHESES DEVELOPMENT

A. Theoretical Foundations

The crowdsourcing organizers need to motivate the contributors to perform their tasks. This can be accomplished by modifying the attributes and qualities of the organizers that can ultimately drive crowdsourcing contributors. Based on the motivation theory [29], motivation is concerned with intrinsic as well as extrinsic factors that could drive human actions [40]. Intrinsic motivation is associated with developing satisfaction as well as pleasure concerning the activities, whereas extrinsic motivation is associated with desire of the actors for some specific outcomes, such as financial rewards. Again, motivations toward participating in crowdsourcing practices include enhancing skills, earning income, seeking entertainment, finding job opportunities, as well as passing time [41]. In the context of crowdsourcing, there are different types of extrinsic motivations, which are feedback-based rewards, recognition-related rewards, monetary rewards, and reputation-oriented rewards, whereas intrinsic motivation includes eudemonic rewards as well as hedonic rewards [42]. Hedonic rewards refer to the needs of crowdsourcing workers for seeking relaxation and enjoyment, whereas eudemonic rewards pertain to the needs of the crowdsourcing contributors to achieve self-determination values and to fulfil their life goals. In the context of achieving success in crowdsourcing practices, it is observed that there are different effects of extrinsic and intrinsic motivations [36]. In the perspective of achieving success in crowdsourcing initiatives, motivational factors play a crucial role, which especially help the crowdsourcing contributors to be motivated to perform their

TABLE I
SUMMARY OF LITERATURE

Author(s) and Year	Study area/Theme	Literature gap	Contribution of present study
[7]	How firms develop capabilities for crowdsourcing to increase open innovation performance: The interplay between organizational roles and knowledge processes.	This study deals with the development of crowdsourcing to improve open innovation performance. However, this study does not deal with any moderating impacts of TLS.	The present study has contributed to the moderating effects of TLS on SCPs, especially in the wake of the COVID 19 pandemic period.
[14]	How crowdsourcing improves prediction of market-oriented outcomes.	This study explains how crowdsourcing activities can help in predicting market-oriented outcomes that can help businesses. Although this study describes prediction of market-oriented outcomes, it does not explain issues, such as lucidity, gamification, and so on, for crowdsourcing activities.	The present study contributes to SCPs in the wake of the COVID-19 pandemic period, along with factors, such as lucidity, gamification, exposure, and so on. This is a unique contribution of the present study.
[15]	A new model for crowdsourcing innovation.	This study presents a new model for crowdsourcing innovation. But this study does not discuss financial rewards, any crisis, and other scenarios, which is a limitation.	The present study deals with CSA along with financial rewards in the wake of the COVID-19 pandemic period.
[22]	From the crowd to the market: The role of reward-based crowdfunding performance in attracting professional investors.	This study shows how reward can help crowdsourcing activities. This study especially deals with attracting professional investors in crowdsourcing activities through incentives. But the study does not investigate the role of leadership support in using modern technology in post COVID-19 pandemic.	The present study Investigates the moderating role of TLS for crowdsourcing activities in the post COVID-19 scenario. The present study also examines the necessity of an attractive reward system to attract professionals in crowdsourcing activities.
[24]	Creativity on Paid Crowdsourcing Platforms.	This study has shown how creativity can help in paid crowdsourcing platforms. But this study is silent on matters, such as turbulent situation, gamification, lucidity, and other factors, which are considered a limitation of this study.	The present study contributes toward crowdsourcing activity from different factors, such as gamification, exposure, lucidity, and so on, along with the moderating role of TLS. Thus, the present study bridges the concerned research gap.
[10]	Ideator expertise and cocreator inputs in crowdsourcing-based new product development.	This study shows the importance of cocreator inputs for launching and developing crowdsourcing-based new product development process. But this study does not clarify the role of financial rewards as well as the role of TLS. Thus, there is a clear research gap.	The present study deals with intermediate factors, such as CSA as well as financial rewards. The present study also deals with the role of TLS in the wake of the COVID-19 pandemic period. Thus, the present study tries to address some of these gaps, which is also a unique contribution of the present study.

304 allocated tasks. This concept is in consonance with motivation
 305 theory. Again, contributors' trust in the crowdsourcing organ-
 306 izers plays a crucial role to improve crowdsourcing initiatives
 307 [26]. Trust can be defined as "the extent to which one is willing
 308 to ascribe good intentions to and have confidence in the words
 309 and actions of other people." [43, p.709]. Also, Mayer et al.
 310 [43] identified three salient dimensions of trust that are integrity,
 311 ability, as well as benevolence. In virtual settings, trust plays a
 312 critical role in relationship setting [44]. This concept is in con-
 313 sonance with trust theory [28]. In the context of crowdsourcing
 314 activities, crowdsourcing contributors give their efforts to pro-
 315 vide suitable solutions, but whether they will get their rewards
 316 largely depends on the task requesters. In the perspective of such
 317 bilateral relationship between the crowdsourcing organizers and
 318 the contributors, trust plays a vital role. The trust theory posits
 319 the essence of development of internal relationships between
 320 the parties involved in any activities [28]. In this study, we argue
 321 that the trustworthiness of the crowdsourcing organizers is deter-
 322 mined by their lucidity, exposure, capability to attract (through
 323 gamification and playful tasks), and coordinating capabilities.
 324 These are likely to attract contributors. Thus, trustworthiness of
 325 the crowdsourcing organizers is perceived as a driving factor to
 326 help improve crowdsourcing practices, especially in the wake of
 327 the COVID-19 pandemic.

328 B. Hypotheses Development

329 Based on the literature and theories reviewed, we have been
 330 able to identify the factors that drive SCPs in the wake of the
 331 COVID-19 pandemic. We have considered TLS as a moderator
 332 that could moderate the relationships between SCPs in the wake
 333 of the COVID-19 pandemic period with its two predictors. We
 334 will explain all these factors in the ensuing sections and will
 335 formulate the hypotheses that will then be encapsulated in our
 336 conceptual model.

337 1) *Lucidity (LUC)*: Lucidity is related to the quality of being
 338 rational, clear, and clearly understanding the reality. Accord-
 339 ingly, lucidity can be conceptualized with the characteristics of
 340 seeing things closely and rationally. The concept of lucidity is
 341 associated with clearness, clarity, and limpidity. In the perspec-
 342 tive of crowdsourcing, lucidity is conceptualized as the extent
 343 to which an organization or a person reveals her/his identity
 344 by disclosing information regarding her/his real identity: this
 345 implies not operating anonymously [20]. Studies have demon-
 346 strated that lucidity helps to develop trust in the crowdsourcing
 347 organizers by the contributors and helps reducing perceived risks
 348 [45], [46]. The idea supplements trust theory. Lucidity of the
 349 crowdsourcing organizers helps to increase participation of the
 350 contributors to undertake the tasks. Although identity disclo-
 351 sure and task popularity are known to have opposite relation
 352 in some outsourcing cases [7], it appears that proper identity
 353 disclosure helps to promote trust between the organizers and
 354 the contributors [47]. Since the lucidity of the organizers helps
 355 to grow trust in the mind of the contributors, this quality of
 356 the organizer is perceived to have an impact on contributors,
 357 leading them to admire the organizers. This way the contributors
 358 will be persuaded that they will be appropriately rewarded for

the performance of their allocated tasks [46]. In the context
 of this study, performance is conceptualized as the outcome
 of an action. All these inputs help to formulate the following
 hypotheses.

*H1a: Lucidity (LUC) of the crowdsourcing organizer will positively
 impact the crowdsourcing admiration (CSA) of the contributors.*

*H1b: Lucidity (LUC) of the crowdsourcing organizer will positively
 impact on the opportunity of gaining financial rewards (FIR) of the
 contributors.*

2) *Gamification (GAM)*: Gamification describes the incor-
 poration of game-style incentives into nongame activities. It is
 concerned with the use of game elements in nongame activities.
 Through gamification, it is deemed possible to enhance the en-
 gagement of seekers and contributors. Indeed, gamification can
 enhance crowdsourcing activities and reduce costs. Game-like
 services and system design are normally conceptualized as gam-
 ification [48]. Gamification-related indicators are the outcomes
 of the game-like design displayed regarding the organizers' iden-
 tity. By assessing the identity of the crowdsourcing organizers,
 the contributors can estimate the organizers' trustworthiness
 [49]. Again, competitive gamification-based indicators, such
 as levels and badges, disclose the skills and competencies of
 the organizers responsible to develop crowdsourcing initiatives
 successfully [50]. The information of different types of gamifi-
 cations helps improve contributors' trust levels in the organizers.
 It can further help to increase the willingness of the contributors
 to participate in the crowdsourcing activities [51]. Contributors
 feel assured of being rewarded appropriately by the organizers
 and such a feeling of assurance leads contributors to admire
 crowdsourcing organizers. These ideas, that are in consonance
 with trust theory, lead us to hypothesize that the following.

*H2a: The gamification (GAM) factor will positively influence the
 CSA of the contributors.*

*H2b: The gamification (GAM) factor will positively influence the
 financial rewards (FIR) opportunity of the contributors.*

3) *Exposure (EXP)*: Exposure is associated with the concept
 of being affected by something or experiencing something. In
 the context of crowdsourcing and in the context of this study, the
 organizers seeking crowdsourcing must explicitly elaborate the
 terms and conditions toward the crowdsourcing activities so that,
 by realizing those conditions, the contributors may or may not
 be motivated to participate in the crowdsourcing activities. The
 exposure factor is conceptualized as the maturity of the skills
 and knowledge of the organizers involved in crowdsourcing
 initiatives [52]. Understanding the features and activities of past
 tasks provides the organizers with the value of exposure. When
 the organizers gather more experience, they are said to have
 acquired more ability [53] and by that acquisition of compe-
 tence, the organizers are trusted by the contributors. Exposure
 of the organizers helps to develop knowledge and skills of the
 crowdsourcing activities and their know-how helps to attract the
 crowdsourcing contributors [26]. This helps make the organizers
 more trustworthy. As a result, the contributors will feel assured
 of being appropriately rewarded and the contributors will get
 motivation for admiring the crowdsourcing organizers, which

414 is in consonance with motivation theory [29]. Based on the
415 discussion, the following hypotheses are developed.

416 *H3a: The past exposure (EXP) of a crowdsourcing organizer will*
417 *positively influence the CSA of the contributors.*

418 *H3b: The past exposure (EXP) of a crowdsourcing organizer on*
419 *financial aspects will positively influence the financial rewards (FIR)*
420 *opportunity of the contributors.*

421 4) *Coordination (CDN)*: There are many studies concerning
422 the topic of coordination [54], but there is no specific definition
423 of coordination between the organizers and contributors concern-
424 ing outsourcing practices. Coordination is considered an impor-
425 tant factor as it can deliver benefits to the business activities,
426 thus improving the management of inter-related businesses [55].
427 Key aspects of coordination contemplate that all the stakeholders
428 jointly work on the same activities by sharing their views and
429 with an understanding of their specific responsibilities to achieve
430 a common goal [48], [56]. In the context of crowdsourcing
431 activities, unless there exists proper coordination between the or-
432 ganizers and the contributors, crowdsourcing initiatives will not
433 be successful [57]. A robust coordination between the organizers
434 and the contributors could help to enhance the level of trust of
435 the contributors toward the organizers that could eventually lead
436 the contributors to believe that they will get a financial reward; in
437 such a case, the contributors would admire the crowdsourcing
438 organizers. Such confidence in the contributors will improve
439 the trustworthiness of the organizers that corroborates with the
440 concept of trust theory [28]. Accordingly, it is hypothesized the
441 following.

442 *H4a: Better coordination (CDN) activities between crowdsourcing*
443 *organizers and contributors will positively influence the CSA of the*
444 *crowdsourcing contributors.*

445 *H4b: Better coordination (CDN) activities between crowdsourcing*
446 *organizers and contributors will improve the financial rewards (FIR)*
447 *opportunity of the crowdsourcing contributors.*

448 5) *Financial Rewards (FIR)*: Apart from the fact that trust-
449 worthiness of the organizers in crowdsourcing is an important
450 predictor of SCPs, financial rewards to the contributors are also
451 considered as a vital factor for motivating the contributors to
452 participate in the crowdsourcing activities [15]. A study has
453 demonstrated that financial rewards influence the job satisfac-
454 tion of the crowdsourcing contributors, and it also influences
455 the trustworthiness of the organizers [18]. By getting proper
456 financial rewards, the contributors' trust toward the organizer is
457 enhanced that also helps to improve the crowdsourcing activities
458 as well as helps to motivate the contributors to exhibit admiration
459 toward the crowdsourcing organizers [58]. When the contrib-
460 utors find that the organizers are rewarding them financially
461 as per the assurance, the contributors do not suffer from the
462 uncertainty and acquire a sense of respect and admiration toward
463 the crowdsourcing organizers. In such a case, the motivation
464 of the contributors is enhanced in line with motivation theory
465 [29]. Consequently, crowdsourcing activities could become suc-
466 cessful under any challenging situation. In terms of the above
467 discussion, the following hypotheses are put forward.

H5: Appropriate financial rewards (FIR) to the crowdsourcing con-
468 *tributors positively influence their CSA toward crowdsourcing orga-*
469 *nizers.* 470

H6: Appropriate financial rewards (FIR) to the crowdsourcing con-
471 *tributors positively influence the achievement of SCPs.* 472

6) *CSA and SCPs in the Wake of the COVID-19 Pandemic*: In
473 the perspective of crowdsourcing activities, when the organizers
474 reveal their identity, history, and mode of works—factors that
475 help to attract the contributors—many individuals contribute
476 by taking a part in the crowdsourcing activities [59]. This will
477 help to enhance the popularity of the organizers [51], [60]. The
478 contributors then admire the crowdsourcing activities initiated
479 by the organizers. Being admired by the contributors, the orga-
480 nizers are also positively motivated and take more initiatives
481 toward attracting and motivating the contributors that could
482 eventually influence the success of crowdsourcing practices,
483 especially in the wake of the COVID-19 pandemic [61]. Thus,
484 admiration by the contributors for the crowdsourcing organizers
485 is enhanced when the contributors get assurance that they will
486 get the promised reward [15]. Such assurance of rewards to the
487 contributors by the crowdsourcing seekers is likely to motivate
488 the contributors to be involved in crowdsourcing activities by
489 providing their valuable inputs to the crowdsourcing seeker orga-
490 nizations. Consequently, crowdsourcing activities become more
491 successful. Hence, from the above discussion, the following
492 hypothesis is developed. 493

H7: CSA of the contributors positively influences achieving SCPs in
494 *the wake of the COVID-19 pandemic.* 495

7) *Moderating Role of TLS*: Crowdsourcing is considered as
496 a kind of business model whose adoption has accelerated be-
497 cause of the COVID-19 pandemic [3]. The main responsibilities
498 in crowdsourcing are with the organizers seeking crowdsourc-
499 ing. For this reason, the organizers must take a leadership role
500 to help the contributors motivationally and technologically so
501 that crowdsourcing activities can unfold smoothly [62], [63],
502 [64]. For this, it is the duty of the organizers involved in
503 such crowdsourcing activities to apprise the contributors how
504 to be involved in the crowdsourcing process with the help of
505 appropriate technology [65], [66], [67]. The organizer should
506 take a leadership role to explain to the contributors the pro-
507 cess and practices and should ensure rewards to them after
508 successful completion of the tasks. It helps motivating the
509 contributors to contribute for completion of the tasks promptly
510 and accurately [15], [27], [68], [69]. Thus, technology plays a
511 vital role toward attracting contributors for participating in the
512 crowdsourcing activities and technology also helps propagate
513 effective and timely communication between the organizers
514 and contributors as they could be physically located far from
515 each other [70]. Therefore, appropriate use of technology can
516 help to achieve SCPs, especially in the wake of the COVID-
517 19 pandemic. Accordingly, the following hypotheses are
518 formulated. 519

H8a: TLS moderates the relationship between CSA and SCPs in the
520 *wake of the COVID-19 pandemic.* 521

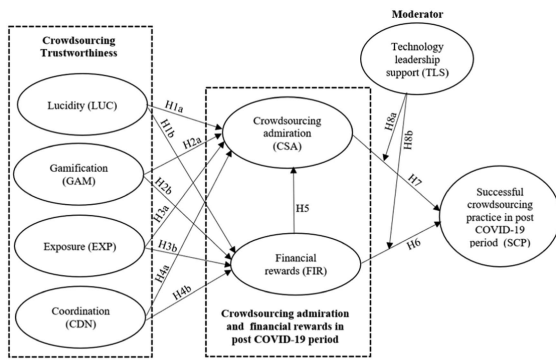


Fig. 1. Conceptual model (adopted from motivation and trust theories).

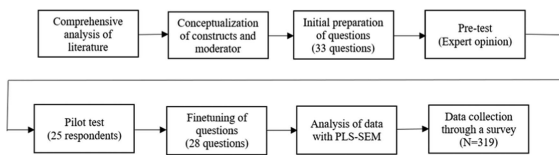


Fig. 2. Research flow diagram.

H8b: TLS moderates the relationship between appropriate financial rewards (FIR) and SCPs in the wake of the COVID-19 pandemic.

Based on the hypotheses formulated, we have developed a conceptual model that is represented in Fig. 1.

IV. RESEARCH METHODOLOGY

The hypotheses developed in this study need to be tested statistically. To achieve this aim, we have deployed a quantitative approach, conducted a survey, and then analyzed the data. The research flow diagram is illustrated in Fig. 2.

A. Preparation of Instruments

Building on the extant literature, we have developed the instruments. Initially, we prepared 33 instruments in the form of statements. The instruments were pretested by obtaining the opinion of six experts from industry having practical knowledge in this study domain. We also sought opinion from the four academicians who are engaged in research works in different aspects of crowdsourcing. With their opinion, the languages of the instruments were made simpler so that the respondents can respond without any difficulty understanding the instruments. After completion of pretest, pilot test has been undertaken with a small sample of 25 gathered through purposive sampling process [71], [72]. These 25 respondents were not included in the main survey. The inputs of these 25 respondents helped us to rectify the recitals of the instruments to increase their readability and understandability. The outcomes of the pilot test helped to rectify the questionnaire and helped to drop five instruments that could not support to enhance the constructs' reliability. In this way, eventually 28 instruments were fine-tuned. The survey

instrument, along with the sources, is provided in Table VI of the Appendix.

B. Strategy for Data Collection

We have deployed social media platforms for reaching the targeted respondents who are associated with crowdsourcing activities in different ways, such as crowdsourcing organizers, crowdsourcing contributors, and so on. Hence, to select the respondents, convenience sampling and purposive sampling have been used. We used Google docs for sending the survey instruments to the targeted respondents. The survey process was conducted over the period January 2022–May 2022. We sent the response sheet containing 28 instruments to the intended participants. Since the responses were quantified in a five-point Likert scale anchoring strongly disagree (SD) marking as 1 to strongly agree (SA) marking as 5, each instrument was provided with these five options. Each respondent is to put one tick mark in one option out of five options in the response sheet. On scrutiny of the responses, it was found that most of the respondents were from Asian or European countries. We selected these respondents as our targeted respondents. With each response sheet, a guideline was provided describing how to fill up the response sheet. Also, with the response sheet, we appraised the respondents that their anonymity and confidentiality will be strictly preserved, and the aim of this study is purely academic. We also requested the respondents to respond within two months (April and May 2022). By this way, we could collect responses of 330 respondents within the stipulated time. These responses were thoroughly scrutinized. After verification of these responses, it was observed that 11 responses were incomplete. We did not consider them. These 11 responses were not considered because the 11 respondents concerned put tick marks in more than one option against each question. We analyzed the responses of 319 respondents against 28 instruments. Table II provides the demographic statistics of 319 respondents.

V. DATA ANALYSIS AND RESULTS

To analyze the results of the survey, we have used partial least square (PLS)-SEM approach [73] with the help of Smart-PLS3.2.3 software [74]. The PLS-SEM technique does not require the data to be normally distributed, which is supposed to be the essential criterion for analyzing data with the help of CB-SEM technique. We have used nonparametric bootstrapping procedure considering 5000 resamples to assess the path coefficients of different linkages, p -values, and R^2 values with the help of SEM.

A. Measurement Properties Along With Test of Discriminant Validity

For verifying the convergent validity, we have estimated the loading factor (LF) of each instrument. To examine the validity, reliability, and internal consistency of each construct, we have estimated average variance extracted (AVE), composite reliability (CR), and α (Cronbach's alpha). The results

TABLE II
DEMOGRAPHIC STATISTICS ($N = 319$)

Particulars	Category	Frequency (N)	Percentage (%)
Gender	Male	224	70.2
	Female	95	29.8
Age	Teenagers (below 19 years)	101	31.7
	Young adult (19–45 years)	143	44.8
	Older adult (more than 45 years)	75	23.5
Educational qualification	Graduate	230	72.1
	Postgraduate	56	17.5
	Doctorate	33	10.4
Geographical location	Asia	202	63.3
	Europe	117	36.7

TABLE III
MEASUREMENT PROPERTIES

Constructs/Items	LF	AVE	CR	α	t-values
LUC		0.600	0.822	0.876	
LUC1	0.841				22.18
LUC2	0.717				26.17
LUC3	0.760				34.11
GAM		0.575	0.811	0.829	
GAM1	0.797				27.29
GAM2	0.0771				21.41
GAM3	0.734				26.38
GAM4	0.724				33.07
EXP		0.681	0.824	0.859	
EXP1	0.793				34.17
EXP2	0.778				36.12
EXP3	0.843				26.37
EXP4	0.866				23.08
CDN		0.683	0.856	0.891	
CDN1	0.871				37.19
CDN2	0.820				24.12
CDN3	0.786				32.21
CSA		0.617	0.822	0.889	
CSA1	0.827				26.38
CSA2	0.755				27.29
CSA3	0.626				36.33
CSA4	0.731				24.17
FIR		0.741	0.851	0.894	
FIR1	0.887				38.21
FIR2	0.897				34.27
FIR3	0.795				32.11
SCP		0.566	0.808	0.843	
SCP1	0.730				24.29
SCP2	0.722				26.55
SCP3	0.740				33.11
SCP4	0.774				30.31
SCP5	0.789				25.27
SCP6	0.727				29.89
SCP7	0.782				38.27

601 highlight that all the estimated values are within the spec- 609
 602 ified range [75], [76]. The lowest allowable values of LF 610
 603 and AVE are 0.7 and 0.5, respectively. Table III provides the
 604 results.

605 To test the discriminant validity, we have used Fornell and
 606 Larcker criteria [77]. We have estimated the square roots of all
 607 the AVEs and found that they all are greater than the respective
 608 bifactor correlation coefficients. This satisfies the Fornell and

Larcker criteria. It confirms discriminant validity of the con- 609
 structs. Table IV provides the results. 610

B. Moderator Analysis [Multigroup Analysis (MGA)] 611

612 For assessing the effects of the moderator, TLS on the linkages
 613 H7 and H6, we have adopted MGA approach [78]. We have
 614 adopted bootstrapping procedure considering 5000 resamples. 614

TABLE IV
DISCRIMINANT VALIDITY TEST (FORNELL AND LARCKER CRITERIA)

Constructs	LUC	GAM	EXP	CDN	CSA	FIR	SCP	AVE
LUC	0.245							0.600
GAM	0.117	0.240						0.575
EXP	0.112	0.137	0.260					0.681
CDN	0.201	0.121	0.210	0.261				0.683
CSA	0.191	0.192	0.116	0.195	0.248			0.617
FIR	0.210	0.189	0.196	0.112	0.189	0.272		0.741
SCP	0.126	0.106	0.122	0.162	0.175	0.182	0.238	0.566

TABLE V
STRUCTURAL EQUATION MODELING

Linkages	Hypotheses	Path coefficients	p-values	Remarks
LUC→CSA	H1a	0.21	p<0.01(**)	Supported
LUC→FIR	H1b	0.24	p<0.05(*)	Supported
GAM→CSA	H2a	0.17	p<0.001(***)	Supported
GAM→FIR	H2b	0.19	p<0.05(*)	Supported
EXP→CSA	H3a	0.02	p>0.05(ns)	Not Supported
EXP→FIR	H3b	0.25	p<0.01(**)	Supported
CDN→CSA	H4a	0.18	p<0.05(*)	Supported
CDN→FIR	H4b	0.01	p>0.05(ns)	Not Supported
FIR→CSA	H5	0.29	p<0.001(***)	Supported
FIR→SCP	H6	0.31	p<0.01(**)	Supported
CSA→SCP	H7	0.32	p<0.001(***)	Supported
(FIR→SCP)×TLS	H8a	0.26	p<0.01(**)	Supported
(CSA→SCP)×TLS	H8b	0.22	p<0.001(***)	Supported

615 In this study, we have analyzed the moderating effect of TLS
 616 by categorizing it into two groups, strong TLS and weak TLS.
 617 It appears that the *p*-value differences for the effects of the two
 618 categories of the moderator TLS on H7 and H6 are 0.03 and
 619 0.01, respectively, both being less than 0.05. It confirms that
 620 moderating effects of TLS on H7 and H6 are significant [73],
 621 [78].

622 *C. Common Method Bias (CMB)*

623 In the survey-based data, there is a chance of having CMB.
 624 To mitigate the biased replies, we have taken some procedural
 625 remedies as a pre-emptive measure. We have fine-tuned the
 626 questionnaire through pretest and pilot test as well as we assured
 627 the respondents during the survey that their anonymity and
 628 confidentiality will be strictly preserved. Also, we have tested
 629 the severity of CMB by performing two statistical tests. We
 630 have conducted post hoc Harman’s first factor test (FFT) where
 631 the first factor value came out as 21.48, which is within the
 632 permissible limit [79]. To supplement Harman’s FFT, we also
 633 conducted a marker correlation test [80]. The results of both the
 634 tests confirmed that CMB could not pose a major challenge in
 635 this study.

636 *D. Hypotheses Testing (SEM)*

637 For hypotheses testing, we have adopted bootstrapping pro-
 638 cedure by considering 5000 resamples. With the consideration
 639 of omission–separation 7, we have assessed Q^2 value to verify
 640 cross-validated redundancy. The positive value of Q^2 confirmed

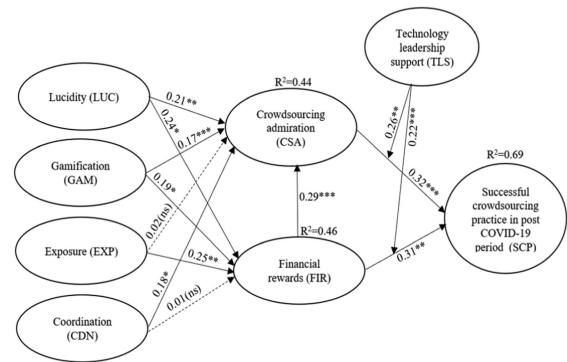


Fig. 3. Validated model (SEM).

641 that the model has predictive relevance [78]. For ascertaining the
 642 model fit, we have considered standardized root-mean-square
 643 residual as a standard index and found that its values are 0.062
 644 for PLS and 0.033 for PLS_c. Both these values are less than the
 645 allowable highest value of 0.08 [81]. The result confirms that
 646 the model is in order [80]. This process helped to estimate the
 647 path coefficients of different linkages, *p*-values, and R^2 values.
 648 Table V provides the results.

649 With all these inputs, the validated model is shown in Fig. 3.

650 VI. FINDINGS AND DISCUSSION

651 As several scholars and observers have noted, the COVID-19
 652 pandemic has generated multiple challenges threatening not only

human lives but also generating social and economic challenges that many organizations were not prepared to face. Those challenges also characterize the present time that for some scholars has been described as the post COVID-19 period. In this article, we had suggested that the challenges related to the COVID-19 pandemic were not over and had generated a shift toward new business models and patterns [82], such as crowdsourcing. This work had highlighted that extreme events, such as pandemics, could be faced by undertaking crowdsourcing initiatives as a coordinating mechanism to successfully harness the potential of the crowd to overcome social and economic challenges. By analyzing the extant literature on crowdsourcing, we found that there is paucity of extensive empirical studies concerning the practices underpinning the execution of crowdsourcing activities in the wake of the COVID-19 pandemic [83]. Accordingly, we had holistically tried to fill up this research gap by investigating how different characteristics of the trustworthiness of the crowdsourcing organizers can influence success in crowdsourcing initiatives. Accordingly, this study had developed a conceptual model consisting of 13 hypotheses, including two hypotheses, also covering the moderating effects of TLS on crowdsourcing success. After a statistical analysis of the data, it appears that 11 out of the 13 hypotheses were supported. Two hypotheses—namely H3a (EXP→CSA) and H4b (CDN→FIR)—were not significant as the concerned path coefficients are too low (0.02 and 0.01, respectively) with levels of nonsignificance in each case as $p > 0.05$ (ns). The reasons of the rejection of H3a are that the respondents in the survey believe that the exposure of crowdsourcing organizers is not an essential quality for the prediction of admiration of crowdsourcing contributors (H3a). In relation to the lack of support for H4b, the respondents subscribed to the fact that coordination between organizers and contributors does not have a strong correlation with financial rewards provided to the crowdsourcing contributors.

This study had also used motivation theory to demonstrate that by enhancing extrinsic and intrinsic motivation of the contributors by the organizers through developing different trustworthiness factors, such as gamification, lucidity, and other trust factors along with financial rewards, it is possible to motivate the crowdsourcing contributors to get involved in crowdsourcing activities. This idea has been supported by another study of Xu et al. [26]. The study also demonstrated that LUC, GAM, EXP, CDN, and FIR could predict CSA to the tune of 44% ($R^2 = 0.44$). Also, it appears from the results that LUC, GAM, EXP, and CDN could predict FIR to the tune of 46% ($R^2 = 0.46$). The results also highlighted that CSA and FIR could simultaneously predict SCP to the extent of 69% ($R^2 = 0.69$), which is the explanatory power of the proposed theoretical model.

Now, we shall discuss graphically how strong and weak TLS could influence the relationships covered by the linkages H6 and H7. Figs. 4 and 5 graphically represent the effects of moderator on the linkage CSA→SCP and FIR→SCP, respectively.

In both the graphs, the continuous and the dotted line represent the effects of strong TLS and the effects of weak TLS, respectively. From the graphs, it is observed that with increase of CSA (see Fig. 3) and with the increase of FIR (see Fig. 4), the rates of increase of SCP are more for the effects of strong TLS compared

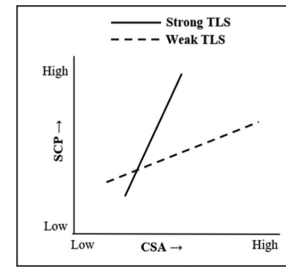


Fig. 4. Effects of moderator TLS on CSA→SCP.

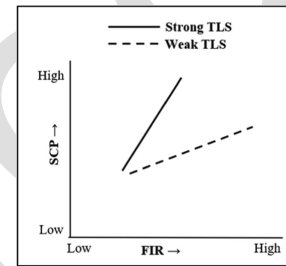


Fig. 5. Effects of moderator TLS on FIR→SCP.

with the effects of weak TLS in both the cases. It is because, in both the graphs, the gradients of the continuous lines are more than the gradients of the dotted lines. A possible interpretation is that with the increase of CSA (see Fig. 4) and FIR (see Fig. 5), the rates of increase of SCP for both the figures are more for the impacts of strong TLS compared with the impacts of weak TLS because, in both the graphs, the inclinations of the continuous lines with the horizontal axes are more comparable with the dotted lines.

A. Theoretical Contribution

This work makes several theoretical contributions. First, while there is a research stream investigating the advantages of outsourcing practices, there is a scarcity of empirical studies examining the factors driving crowdsourcing initiatives, especially in the wake of the COVID-19 pandemic. While most of the existing studies have focused only on specific crowdsourcing initiatives [84], this work has examined the factors that drive successful crowdsourcing initiatives in the wake of the COVID-19 pandemic. Second, we have extended extant knowledge by investigating the moderating role of TLS on two relationships—CSA and SCP on one hand and FIR and SCP on the other hand. So far, no other studies have investigated the influence of such type of moderator on drivers of SCPs. Thus, the empirical findings of the present study have been able to substantiate the relevance of investigating and analyzing the crowdsourcing effects in the wake of the COVID-19 pandemic. In such context, this study has demonstrated how crowdsourcing initiatives have been able to highlight that crowdsourcing practices, fostered by different digital tools, are able to convey effective and useful solutions in the wake of the COVID-19 pandemic. Third, this study is claimed to be one of the first studies that explained extensively

the impact of trustworthiness of the crowdsourcing organizers to achieve success in crowdsourcing activities. Most of the extant studies only analyzed the factors influencing successful crowdsourcing activities either from the perspectives of the internal and external aspects of the crowdsourcing contributors or from the perspectives of the development of system software [35], [85]. Such studies did not extensively examine and analyze the key role of crowdsourcing organizers. Fourth, this work has discussed as well as investigated the role of organizers also for achieving success in crowdsourcing practices even in the wake of the COVID-19 pandemic by highlighting that distrust toward the organizers is one of the most important factors reducing the contributors' participation in crowdsourcing activities.

Fifth, this study is claimed to have successfully leveraged trust theory and motivation theory to show that crowdsourcing practices under a pandemic constraint can be enhanced by driving higher levels of trustworthiness (which could help to motivate the crowdsourcing contributors) and motivation (both intrinsic and extrinsic motivation play a key role in crowdsourcing activities). Sixth, this study has enhanced the existing literature on the job characteristics model [86] by suggesting that the model can hardly be able to capture different dimensions of crowdsourcing practices. Instead through our analysis, we have been able to extend the job characteristics model in terms of crowdsourcing market by considering new crowdsourcing drivers. Indeed, as suggested by Alcover and Topa [87], the job characteristic model does not consider social and situational characteristics of works. Seventh, the present study has contributed to the literature of crowdsourcing by exploring the intimate nexus between the situational factors of crowdsourcing (one of which is the trust factor) and perceived work efforts by the contributors (one of which is the motivational factor). This is essential because the high uncertainty in the crowdsourcing market has made trust in the organizers a critical driver. Finally, we also extend the work by Xu et al. [26], as we have considered a wider range of drivers (including lucidity, gamification, exposure, and coordination) between the crowdsourcing organizers and contributors for achieving SCPs by paying attention to contextual factors, such as financial rewards and CSA.

B. Implication to Practice

This study has demonstrated that by enhancing the trustworthiness of the crowdsourcing organizers, it is possible to motivate the crowdsourcing contributors to participate in the crowdsourcing activities. Hence, this study has facilitated the consideration of the incentive design along two perspectives: the crowdsourcing organizers' perspective and the crowdsourcing contributors' perspective. This implies that crowdsourcing organizers are also needed to improve their positive image of being trusted in addition to their (organizers) role to motivate the contributors for participating in the crowdsourcing activities/practices. The crowdsourcing organizers should try to solve problems of information asymmetry that causes distrust in the minds of the crowdsourcing contributors resulting in low participation rates. The organizers must coordinate with the contributors by addressing all the doubts of the contributors. This will help enhance the confidence of the contributors as they will

think that they will be properly rewarded for the performance of their tasks based on the assurance of the crowdsourcing organizers. By continuously interacting with the contributors to understand their constraints, it will be possible for the organizers to enhance their exposure to the audience helpful to achieve better trust toward them (organizers) that eventually will help to ensure success in crowdsourcing practices.

This study has provided effective insights to explore relationship management in the context of three stakeholders. They are the crowdsourcing organizers, the crowdsourcing contributors, and the crowdsourcing platform managers. The crowdsourcing organizers should use gamification-related initiatives (e.g., better design) as well as nongamification-related factors (transparency, financial rewards, identity) to improve their image to be trusted by the contributors, which will help to enhance the motivation of the contributors toward participating in the crowdsourcing activities. The organizers should provide proper feedback in real time to the contributors and should also appreciate the contribution of the crowdsourcing contributors for their effective performance, which will help to attract more contributors toward crowdsourcing activities. In brief, crowdsourcing organizers should maintain a cordial and intimate relationship with the crowdsourcing contributors as well as the crowdsourcing platform managers. This should ensure success toward the crowdsourcing initiatives and such a close relationship will enhance the motivation of the contributors toward participating in crowdsourcing activities even in unfavorable circumstances.

C. Limitations and Future Research Direction

Although this study has made several theoretical contributions to extant research and knowledge, as well as developed managerial implications, it displays some limitations. First, the findings depend on the cross-sectional data, which have been collected at a single point of time by using self-reported measures. Hence, we cannot claim causality in the relationships identified. Second, cross-sectional studies are often prone to endogeneity bias. It is recommended that researchers conduct longitudinal field research to control this limitation. Second, the findings rely on respondents based in Asia and Europe. Hence, there is an external validity issue that should be addressed by collecting data from respondents located in other geographical areas. Third, the explanatory power of the proposed theoretical model is 69%. Future researchers may consider other characteristics of the organizers in addition to trustworthiness (e.g., justice [88]) and examine if adding a driver may improve the percentage of variance explained. Fourth, despite we have both European and Asian respondents, we could have analyzed and compared the responses regionwise. Future researchers might conduct a similar study but also distinguish countries and regions. Fifth, in this work, we have only included one typical system design feature, such as gamification, on the crowdsourcing platform, although crowdsourcing applications contain multifarious attributes (such as aesthetics and stories) that drive use. In future research, scholars might consider system motivational features to assess how they could influence contributor participation. Sixth and last, this study did not consider a rival model. Future research might address this limitation.

APPENDIX

TABLE VI
SUMMARY OF QUESTIONNAIRE

Items	Source	Statements	Response
			[SD], [D], [N], [A], [SA]
LUC1	[17]	I believe that lucidity helps to develop trust between both crowdsourcing organizers and contributors.	[1], [2], [3], [4], [5]
LUC2	[8], [45], [46]	I think that the lucidity of the crowdsourcing organizers helps to increase participation of the contributors to do the tasks in post COVID-19 period.	[1], [2], [3], [4], [5]
LUC3	[46], [47]	Lucidity helps in impacting the crowdsourcing contributors to admire the crowdsourcing organizers.	[1], [2], [3], [4], [5]
GAM1	[18], [49]	I believe that gamification-related indicators can estimate organizers' trustworthiness, especially in the post COVID-19 period.	[1], [2], [3], [4], [5]
GAM2	[50]	Competitive gamification-based indicators disclose the skills and competencies of the crowdsourcing organizers.	[1], [2], [3], [4], [5]
GAM3	[51]	I think that different types of gamifications help to improve the trust levels of the crowdsourcing contributors.	[1], [2], [3], [4], [5]
GAM4	[48], [49]	Through gamification process, contributors feel assured of being rewarded appropriately by the organizers.	[1], [2], [3], [4], [5]
EXP1	[5], [52]	I think that maturity of the skills and knowledge of the crowdsourcing organizers is important, especially in the post COVID-19 period.	[1], [2], [3], [4], [5]
EXP2	[53]	I believe that as the crowdsourcing organizers gather more experience, the organizers gain more superiority in crowdsourcing activities.	[1], [2], [3], [4], [5]
EXP3	[25]	Acquiring more crowdsourcing competence can help to improve trust level of the crowdsourcing contributors.	[1], [2], [3], [4], [5]
EXP4	[27], [52]	Contributors will feel more assured of being appropriately rewarded from the mature crowdsourcing organizers.	[1], [2], [3], [4], [5]
CDN1	[2], [54], [85]	Coordination between crowdsourcing organizers and contributors is an important factor during and after COVID-19 pandemic when social distancing is important.	[1], [2], [3], [4], [5]
CDN2	[55]	I believe that stakeholders in crowdsourcing activities should jointly work together to achieve a common goal.	[1], [2], [3], [4], [5]
CDN3	[57], [84]	Improper coordination among the crowdsourcing stakeholders can jeopardize the project especially during and after COVID-19 when mobility is restricted.	[1], [2], [3], [4], [5]
CSA1	[51], [60]	Admiration of contributors to participate in a crowdsourcing project is an important aspect.	[1], [2], [3], [4], [5]
CSA2	[59]	Crowdsourcing contributors are more motivated to participate in a crowdsourcing project if appropriate reward is assured.	[1], [2], [3], [4], [5]
CSA3	[51]	I believe that organizations that have more experience in crowdsourcing projects are more attractive for the crowdsourcing contributors to participate.	[1], [2], [3], [4], [5]
CSA4	[60]	I believe that if the crowdsourcing organizers disclose their identity, then the contributors admire more to participate in the crowdsourcing projects.	[1], [2], [3], [4], [5]
FIR1	[61]	I believe that financial rewards are the most important aspect to attract the contributors to take part in a crowdsourcing project.	[1], [2], [3], [4], [5]
FIR2	[11], [59]	I think that an attractive reward can ensure the success of a crowdsourcing project.	[1], [2], [3], [4], [5]
FIR3	[21], [57]	Financial reward can motivate the crowdsourcing contributor to choose one project than another.	[1], [2], [3], [4], [5]
SCP1	[51], [60]	I believe that revealing identity, history, and mode of work can help crowdsourcing organizations to become more popular.	[1], [2], [3], [4], [5]
SCP2	[1], [5]	Attracting skillful and knowledgeable contributors in a crowdsourcing project is an important aspect for project success.	[1], [2], [3], [4], [5]
SCP3	[2], [3]	Financial incentive to the crowdsourcing contributors can enhance the success rate of a crowdsourcing project.	[1], [2], [3], [4], [5]
SCP4	[2], [3]	I believe that crowdsourcing practices can minimize the overall project cost.	[1], [2], [3], [4], [5]
SCP5	[8], [18]	I think that in the post COVID-19 scenario, crowdsourcing practices by the organizations have accelerated.	[1], [2], [3], [4], [5]
SCP6	[61], [84]	I believe that during and post COVID-19 period, crowdsourcing practices have become more popular.	[1], [2], [3], [4], [5]
SCP7	[28], [29]	I think in the post COVID-19 scenario, it is easier to find skillful resources to contribute for crowdsourcing projects.	[1], [2], [3], [4], [5]

SD = Strongly Disagree; D = Disagree; N = Neither agree nor disagree; A = Agree; SA = Strongly Agree.

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Examining the Influence of Trustworthiness, Financial Rewards, and Admiration for Crowdsourcing in the Post COVID-19 Period

Marcello Mariani  and Sheshadri Chatterjee 

Abstract—Over the past two decades, crowdsourcing activities have expanded considerably. More recently, the COVID-19 pandemic has radically changed the way people live and work, and the way organizations do business. So far, not many studies have analyzed if and to what extent trustworthiness can influence the admiration to practice crowdsourcing and could reward financial benefits in the COVID-19 period. Against this background, in this article, the aim is to investigate the influence of crowdfunding trustworthiness and financial rewards on the success of crowdsourcing activities. The analysis is made more complete by including technology leadership support as a moderator. With the help of the existing literature and theories, a research model has been developed conceptually, which was later validated using the partial least square-structural equation modeling technique on a sample of 319 responses from participants based in Europe and Asia. The study found that lucidity, gamification, exposure, and coordination along with financial rewards positively influence admiration for crowdsourcing, which, in turn, positively impacts successful crowdsourcing practices in the COVID-19 period. The study also shows that there is a significant moderating impact of technological leadership support on successful crowdsourcing practices in the COVID-19 period.

Index Terms—Admiration, coordination, COVID-19, crowdsourcing, entrepreneurship, financial rewards, gamification, lucidity, technology leadership support (TLS), trustworthiness.

I. INTRODUCTION

FROM a societal and economic perspective, the COVID-19 pandemic can be considered as a disruptive event [1]. This health crisis has led to unforeseen consequences in most of the sectors and society [2], [3]. More specifically, the COVID-19 pandemic has acted as a catalyst to bring a change to business activities and patterns [4]. During and after the worst moments of the COVID-19 outbreak, resilience, coordination, and synergy have been critical elements for crisis management also in relation

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to business [5]. The challenging scenario brought about by the COVID-19 pandemic highlights that the existing traditional processes of doing business are often not adequate. More efforts are needed to appropriately coordinate resources. More specifically, digital technologies and innovative digitally informed processes are increasingly deployed to coordinate and organize resources useful to address the global pandemic. Organizations that can rely on platform business models and that are digital oriented can reach out to a global audience by using crowdsourcing to counteract societal and medical issues. By leveraging the enormous power of the crowd, crowdsourcing is considered a substantial and effective mechanism for facilitating the coordination of large groups of individuals that can help solving various business-related problems. More specifically, crowdsourcing is particularly effective in generating new information relevant to the business context along with the creation of innovative ideas [6]. This process has been widely recognized as an additional coordinative technique for businesses that need to access quickly and conveniently essential resources and outside knowledge [7]. Examples are not rare in medical contexts, where through crowdsourcing, it has been possible to collect large volumes of valuable data to develop the accurate research responses to address the outbreak of diseases brought about by the COVID-19 pandemic [8], [9]. Crowdsourcing activities help establishing working relationships with outside providers possessing specific know-how that helps crowdsourcing-seeking organizations to improve their processes in the areas of product development and supply chain reconfiguration [10]. Apart from generating quick responses to urgent business and societal needs, crowdsourcing can provide access to solutions from remote knowledge domains. Recently, crowdsourcing is effectively helping governments coordinating appropriate resources to solve multifarious societal issues and is supporting nongovernmental organizations to be able to identify novel solutions to address different societal challenges [11]. Several initiatives demonstrate that organizations have already started to harness crowdsourcing activities to address issues, such as the COVID-19 pandemic. For instance, a recent report [12] shows that the World Health Organization had developed an important database leveraging data collected from different hospitals globally. These data consist of anonymous records regarding patients who had contracted the COVID-19 viruses

that provide details about treatment procedures and prescribed medicines. This database, which is the byproduct of crowdsourcing, is tangible global evidence of how crowdsourcing can help address societal issues and unforeseen detrimental crises situations in the present but also in the future. Crowdsourcing refers to the practice of an organization or an agent of outsourcing tasks to the wider public/society who are usually recruited using the internet [13]. To develop innovative works, many organizations are using the crowdsourcing approach in different fields [14], [15]. Many global organizations, such as Google, Dell, P&G, SAP, and others, have become successful by building their own crowdsourcing platforms to handle such tasks that need human contribution [16], [17]. These tasks include knowledge sharing and intelligence assimilation [7], operational cost saving [18], and improving organizational innovative system [19]. However, despite all these advantages, it has been observed that all the crowdsourcing initiatives have not yielded successful results in the guise of innovative outcomes, operational cost savings, and so on [15], [18], [20]. Organizations are experiencing such challenges to fetch successful outcomes using crowdsourcing due to paucity of knowledge of the salient factors that could accurately predict the success of crowdsourcing in the wake of the COVID-19 crisis [15], [21].

Apart from financial rewards, proper exposure and lucidity of the organizations seeking crowdsourcing along with trustworthiness have been considered as a decisive factor for successful crowdsourcing initiatives especially during and in the wake of the COVID-19 pandemic [6], [22], [23], [24]. Crowdsourcing may help organizations to successfully coordinate with external players for establishing working relationships to reconfigure their efficiency in supply chains, improve their processes for product development, along with enhancing specific features and functionalities of the products [10], [25]. Based on the critical role played by crowdsourcing to address the challenges brought about by the COVID-19 pandemic, this study addresses opportunities and challenges linked to crowdsourcing from a managerial and societal perspective. This can lead to develop readiness and resilience in the wake of the lingering COVID-19 pandemic and in view of similar extreme events and crises. However, unless the factors that could impact crowdsourcing practices in the wake of the COVID-19 pandemic period are properly identified to improve organizational innovation [19], it would not be possible to harness the potential stemming from crowdsourcing initiatives [26]. It is argued that technology leadership support (TLS) can influence the crowdsourcing process. Indeed, TLS encompasses how a leader uses technology during her daily tasks while leading others to successfully complete their assigned tasks [15], [27]. This can eventually influence the success of crowdsourcing activities. The process of crowdsourcing is mostly impeded because crowdsourcing seekers neither do clearly expose the rewards to be given to the crowdsourcing contributors nor do the seekers explicitly communicate to potential contributors the specific conditions for providing contributions. As a result, most of the contributors cannot trust the crowdsourcing seekers. Thus, trustworthiness and support of the crowdsourcing seekers are perceived to be highly important since they will help address

information asymmetry issues, enhance effective communication and coordination with the contributors of crowdsourcing initiatives, and reduce uncertainty in the minds of the external participants as to whether the organizations will keep their promises and deliver rewards after project completion [26].

Existing studies have highlighted that despite the multiple advantages of crowdsourcing, such as intelligence assimilation, cost savings, as well as the improvement of organizational innovation capabilities [7], [18], [19], organizations have been experiencing entangled challenges to harness the potential of crowdsourcing [20]. To address such challenges, trustworthiness of the organizations involved in crowdsourcing activities is one of the main critical factors [6], [22]. In such context, although the success of crowdsourcing is increasing rapidly [17], the factors that could impact trustworthiness, financial rewards to the contributors, as well as admiration to the seekers for improving the overall crowdsourcing activities are severely underexplored [26]. Researchers have emphasized the importance of studying the success and outcomes of crowdsourcing activities [17]. However, most of these research studies have been conceptual in nature. Those studies tried to identify the factors predicting trustworthiness in the context of crowdsourcing [26]. However, those few empirical studies neither explicitly investigate the impact of trustworthiness on successful crowdsourcing activities nor did these studies analyze the moderating role that TLS can play in successful crowdsourcing activities. To bridge this research gap, the aim of this study is to address the following research questions (RQs).

RQ1: How does crowdsourcing trustworthiness impact successful crowdsourcing practices (SCPs) in the wake of the COVID-19 pandemic?

RQ2: Does TLS moderate successful crowdsourcing activities?

Our findings contributed to enhancing both theoretical and managerial knowledge by investigating the success of crowdsourcing from the organizers' trustworthiness perspective. This study, therefore, provided a granular investigation on determining how different salient factors of crowdsourcing trustworthiness are effective especially in the wake of the COVID-19 pandemic to achieve successful crowdsourcing with the help of effective technological support. To address the RQs, we have developed a theoretical model and validated it by deploying a partial least square (PLS) structural equation modeling (SEM) technique through the analysis of 319 responses from European and Asian respondents. To empirically substantiate the research findings, this study successfully integrated trust theory [28] and motivational theory [29] to explain how different factors could help improve crowdsourcing practices in the wake of the COVID-19 pandemic, considering, as a moderator, TLS.

The rest of this article is organized as follows. Section II illustrates the literature review, and it is followed by the theoretical foundations and hypotheses development in Section III. Thereafter, Section IV describes the research methodology that is followed by data analysis and results presented in Section V. Finally, Section VI develops the discussion, illustrates the theoretical contributions, the practical implications, identifies the limitations, and develops a research agenda.

II. LITERATURE REVIEW

The COVID-19 pandemic not only posed multiple challenges to individuals' health but it also affected several businesses and kept on affecting both individuals and organizations in the wake of the COVID-19 pandemic [30]. The challenging scenario set by COVID-19 has suggested that the prevailing business practices are not adequate, and that the world requires searching for innovative and digital means to adequately respond to such apocalyptic challenges [5], [31]. With its platform structure as well as digital nature capable of reaching global audience, crowdsourcing is perceived to be one of the most promising remedies to critical pandemic crises [9], [32]. Several studies have highlighted that crowdsourcing may be conceptualized as the activity for advertising a task to an unknown crowd rather than to a team or a designated organization [33]. Not many studies dealing with crowdsourcing have analyzed factors, such as the trust of the organizers, and no analysis has been conducted on the incentive toward participating in crowdsourcing activities. Crowdsourcing could help business organizers to address issues in the wake of COVID-19. It might also help different governments coordinate resources to solve various societal problems [11]. Some research has demonstrated that nonspecific public volunteers help the organizers of crowdsourcing, and these nonspecific volunteers are mostly recruited through virtual platforms [13], [17]. However, none of these studies have investigated the issue of incentivization of crowdsourcing and its popularity. Crowdsourcing is gaining momentum in the business domain [20], and as such, it has become an important topic for researchers to analyze how to be successful in crowdsourcing initiatives [34]. Extant studies have illustrated that the success of crowdsourcing principally depends on, and is related to, three specific factors, which include the following:

- 1) optimization of crowdsourcing management task design;
- 2) stimulation of participation toward crowdsourcing;
- 3) improvement of technologies for being more involved in crowdsourcing activities [19], [35].

Thus, not many studies are found in the extant literature on how trustworthiness of the organizers of crowdsourcing activities may act as an essential predictor for achieving success in crowdsourcing practice [7], [18]. Several studies have shown that the main actors and beneficiaries of crowdsourcing are the organizers who are the crowdsourcing seekers, and whose characteristics are critical to achieve success in crowdsourcing practices [22], [36]. Several studies have identified factors, such as the admiration of the crowdsourcing organizers [26], their lucidity in actions, and ability for better coordination with the crowdsourcing contributors [26] that are critical in SCPs. A study has observed that since crowdsourcing contributors are supposed to enjoy more freedom in choosing their tasks, motivating these contributors to participate in the crowdsourcing activities is also considered as a key issue for successful crowdsourcing activities [37]. To motivate the contributors, it is essential for the crowdsourcing organizers to enhance the way they present the crowdsourcing activity through game-like system designs, appropriate exposure, and ability to reward financially the contributors: this could lead the contributors to

admire the organizers [38]. If these qualities of the crowdsourcing organizers are cultivated, it is argued that crowdsourcing activities will be successful even after the COVID-19 pandemic period. However, in such context, the crowdsourcing organizers need to act as champions to ensure success in crowdsourcing activities by using advanced (digital) technologies [38]. Thus, it is argued that trust in the crowdsourcing organizers and the motivation of the crowdsourcing contributors play critical role to achieve success in crowdsourcing activities even after any crisis. This corroborates motivation and trust theories [28], [29], [39]. Extant literature has emphasized that due to the abrupt outbreak of COVID-19 pandemic, the existing business practices are not adequate to address the apocalyptic situation [31] and several scholars have suggested that to reach out to a global audience in such a crisis, crowdsourcing is one of the best available solutions [9], [32]. Other studies have also demonstrated that trust of the organizations in the matter of crowdsourcing for attracting the contributors is deemed to be important [6], [22]. However, extant literature has not explicitly explained how factors, such as trustworthiness, rewarding, and innovativeness, could impact SCPs in the wake of the COVID-19 period. Consequently, there is an important gap in the literature that this study tries to bridge. To visualize the literature and the contributions, a summary has been included in Table I.

III. THEORETICAL FOUNDATIONS AND HYPOTHESES DEVELOPMENT

A. Theoretical Foundations

The crowdsourcing organizers need to motivate the contributors to perform their tasks. This can be accomplished by modifying the attributes and qualities of the organizers that can ultimately drive crowdsourcing contributors. Based on the motivation theory [29], motivation is concerned with intrinsic as well as extrinsic factors that could drive human actions [40]. Intrinsic motivation is associated with developing satisfaction as well as pleasure concerning the activities, whereas extrinsic motivation is associated with desire of the actors for some specific outcomes, such as financial rewards. Again, motivations toward participating in crowdsourcing practices include enhancing skills, earning income, seeking entertainment, finding job opportunities, as well as passing time [41]. In the context of crowdsourcing, there are different types of extrinsic motivations, which are feedback-based rewards, recognition-related rewards, monetary rewards, and reputation-oriented rewards, whereas intrinsic motivation includes eudemonic rewards as well as hedonic rewards [42]. Hedonic rewards refer to the needs of crowdsourcing workers for seeking relaxation and enjoyment, whereas eudemonic rewards pertain to the needs of the crowdsourcing contributors to achieve self-determination values and to fulfil their life goals. In the context of achieving success in crowdsourcing practices, it is observed that there are different effects of extrinsic and intrinsic motivations [36]. In the perspective of achieving success in crowdsourcing initiatives, motivational factors play a crucial role, which especially help the crowdsourcing contributors to be motivated to perform their

TABLE I
SUMMARY OF LITERATURE

Author(s) and Year	Study area/Theme	Literature gap	Contribution of present study
[7]	How firms develop capabilities for crowdsourcing to increase open innovation performance: The interplay between organizational roles and knowledge processes.	This study deals with the development of crowdsourcing to improve open innovation performance. However, this study does not deal with any moderating impacts of TLS.	The present study has contributed to the moderating effects of TLS on SCPs, especially in the wake of the COVID 19 pandemic period.
[14]	How crowdsourcing improves prediction of market-oriented outcomes.	This study explains how crowdsourcing activities can help in predicting market-oriented outcomes that can help businesses. Although this study describes prediction of market-oriented outcomes, it does not explain issues, such as lucidity, gamification, and so on, for crowdsourcing activities.	The present study contributes to SCPs in the wake of the COVID-19 pandemic period, along with factors, such as lucidity, gamification, exposure, and so on. This is a unique contribution of the present study.
[15]	A new model for crowdsourcing innovation.	This study presents a new model for crowdsourcing innovation. But this study does not discuss financial rewards, any crisis, and other scenarios, which is a limitation.	The present study deals with CSA along with financial rewards in the wake of the COVID-19 pandemic period.
[22]	From the crowd to the market: The role of reward-based crowdfunding performance in attracting professional investors.	This study shows how reward can help crowdsourcing activities. This study especially deals with attracting professional investors in crowdsourcing activities through incentives. But the study does not investigate the role of leadership support in using modern technology in post COVID-19 pandemic.	The present study Investigates the moderating role of TLS for crowdsourcing activities in the post COVID-19 scenario. The present study also examines the necessity of an attractive reward system to attract professionals in crowdsourcing activities.
[24]	Creativity on Paid Crowdsourcing Platforms.	This study has shown how creativity can help in paid crowdsourcing platforms. But this study is silent on matters, such as turbulent situation, gamification, lucidity, and other factors, which are considered a limitation of this study.	The present study contributes toward crowdsourcing activity from different factors, such as gamification, exposure, lucidity, and so on, along with the moderating role of TLS. Thus, the present study bridges the concerned research gap.
[10]	Ideator expertise and cocreator inputs in crowdsourcing-based new product development.	This study shows the importance of cocreator inputs for launching and developing crowdsourcing-based new product development process. But this study does not clarify the role of financial rewards as well as the role of TLS. Thus, there is a clear research gap.	The present study deals with intermediate factors, such as CSA as well as financial rewards. The present study also deals with the role of TLS in the wake of the COVID-19 pandemic period. Thus, the present study tries to address some of these gaps, which is also a unique contribution of the present study.

304 allocated tasks. This concept is in consonance with motivation
 305 theory. Again, contributors' trust in the crowdsourcing organ-
 306 nizers plays a crucial role to improve crowdsourcing initiatives
 307 [26]. Trust can be defined as "the extent to which one is willing
 308 to ascribe good intentions to and have confidence in the words
 309 and actions of other people." [43, p.709]. Also, Mayer et al.
 310 [43] identified three salient dimensions of trust that are integrity,
 311 ability, as well as benevolence. In virtual settings, trust plays a
 312 critical role in relationship setting [44]. This concept is in con-
 313 sonance with trust theory [28]. In the context of crowdsourcing
 314 activities, crowdsourcing contributors give their efforts to pro-
 315 vide suitable solutions, but whether they will get their rewards
 316 largely depends on the task requesters. In the perspective of such
 317 bilateral relationship between the crowdsourcing organizers and
 318 the contributors, trust plays a vital role. The trust theory posits
 319 the essence of development of internal relationships between
 320 the parties involved in any activities [28]. In this study, we argue
 321 that the trustworthiness of the crowdsourcing organizers is deter-
 322 mined by their lucidity, exposure, capability to attract (through
 323 gamification and playful tasks), and coordinating capabilities.
 324 These are likely to attract contributors. Thus, trustworthiness of
 325 the crowdsourcing organizers is perceived as a driving factor to
 326 help improve crowdsourcing practices, especially in the wake of
 327 the COVID-19 pandemic.

328 B. Hypotheses Development

329 Based on the literature and theories reviewed, we have been
 330 able to identify the factors that drive SCPs in the wake of the
 331 COVID-19 pandemic. We have considered TLS as a moderator
 332 that could moderate the relationships between SCPs in the wake
 333 of the COVID-19 pandemic period with its two predictors. We
 334 will explain all these factors in the ensuing sections and will
 335 formulate the hypotheses that will then be encapsulated in our
 336 conceptual model.

337 1) *Lucidity (LUC)*: Lucidity is related to the quality of being
 338 rational, clear, and clearly understanding the reality. Accord-
 339 ingly, lucidity can be conceptualized with the characteristics of
 340 seeing things closely and rationally. The concept of lucidity is
 341 associated with clearness, clarity, and limpidity. In the perspec-
 342 tive of crowdsourcing, lucidity is conceptualized as the extent
 343 to which an organization or a person reveals her/his identity
 344 by disclosing information regarding her/his real identity: this
 345 implies not operating anonymously [20]. Studies have demon-
 346 strated that lucidity helps to develop trust in the crowdsourcing
 347 organizers by the contributors and helps reducing perceived risks
 348 [45], [46]. The idea supplements trust theory. Lucidity of the
 349 crowdsourcing organizers helps to increase participation of the
 350 contributors to undertake the tasks. Although identity disclo-
 351 sure and task popularity are known to have opposite relation
 352 in some outsourcing cases [7], it appears that proper identity
 353 disclosure helps to promote trust between the organizers and
 354 the contributors [47]. Since the lucidity of the organizers helps
 355 to grow trust in the mind of the contributors, this quality of
 356 the organizer is perceived to have an impact on contributors,
 357 leading them to admire the organizers. This way the contributors
 358 will be persuaded that they will be appropriately rewarded for

the performance of their allocated tasks [46]. In the context
 of this study, performance is conceptualized as the outcome
 of an action. All these inputs help to formulate the following
 hypotheses.

*H1a: Lucidity (LUC) of the crowdsourcing organizer will positively
 impact the crowdsourcing admiration (CSA) of the contributors.*

*H1b: Lucidity (LUC) of the crowdsourcing organizer will positively
 impact on the opportunity of gaining financial rewards (FIR) of the
 contributors.*

2) *Gamification (GAM)*: Gamification describes the incor-
 poration of game-style incentives into nongame activities. It is
 concerned with the use of game elements in nongame activities.
 Through gamification, it is deemed possible to enhance the en-
 gagement of seekers and contributors. Indeed, gamification can
 enhance crowdsourcing activities and reduce costs. Game-like
 services and system design are normally conceptualized as gam-
 ification [48]. Gamification-related indicators are the outcomes
 of the game-like design displayed regarding the organizers' iden-
 tity. By assessing the identity of the crowdsourcing organizers,
 the contributors can estimate the organizers' trustworthiness
 [49]. Again, competitive gamification-based indicators, such
 as levels and badges, disclose the skills and competencies of
 the organizers responsible to develop crowdsourcing initiatives
 successfully [50]. The information of different types of gamifi-
 cations helps improve contributors' trust levels in the organizers.
 It can further help to increase the willingness of the contributors
 to participate in the crowdsourcing activities [51]. Contributors
 feel assured of being rewarded appropriately by the organizers
 and such a feeling of assurance leads contributors to admire
 crowdsourcing organizers. These ideas, that are in consonance
 with trust theory, lead us to hypothesize that the following.

*H2a: The gamification (GAM) factor will positively influence the
 CSA of the contributors.*

*H2b: The gamification (GAM) factor will positively influence the
 financial rewards (FIR) opportunity of the contributors.*

3) *Exposure (EXP)*: Exposure is associated with the concept
 of being affected by something or experiencing something. In
 the context of crowdsourcing and in the context of this study, the
 organizers seeking crowdsourcing must explicitly elaborate the
 terms and conditions toward the crowdsourcing activities so that,
 by realizing those conditions, the contributors may or may not
 be motivated to participate in the crowdsourcing activities. The
 exposure factor is conceptualized as the maturity of the skills
 and knowledge of the organizers involved in crowdsourcing
 initiatives [52]. Understanding the features and activities of past
 tasks provides the organizers with the value of exposure. When
 the organizers gather more experience, they are said to have
 acquired more ability [53] and by that acquisition of compe-
 tence, the organizers are trusted by the contributors. Exposure
 of the organizers helps to develop knowledge and skills of the
 crowdsourcing activities and their know-how helps to attract the
 crowdsourcing contributors [26]. This helps make the organizers
 more trustworthy. As a result, the contributors will feel assured
 of being appropriately rewarded and the contributors will get
 motivation for admiring the crowdsourcing organizers, which

414 is in consonance with motivation theory [29]. Based on the
415 discussion, the following hypotheses are developed.

416 *H3a: The past exposure (EXP) of a crowdsourcing organizer will*
417 *positively influence the CSA of the contributors.*

418 *H3b: The past exposure (EXP) of a crowdsourcing organizer on*
419 *financial aspects will positively influence the financial rewards (FIR)*
420 *opportunity of the contributors.*

421 4) *Coordination (CDN)*: There are many studies concerning
422 the topic of coordination [54], but there is no specific definition
423 of coordination between the organizers and contributors concern-
424 ing outsourcing practices. Coordination is considered an impor-
425 tant factor as it can deliver benefits to the business activities,
426 thus improving the management of inter-related businesses [55].
427 Key aspects of coordination contemplate that all the stakeholders
428 jointly work on the same activities by sharing their views and
429 with an understanding of their specific responsibilities to achieve
430 a common goal [48], [56]. In the context of crowdsourcing
431 activities, unless there exists proper coordination between the or-
432 ganizers and the contributors, crowdsourcing initiatives will not
433 be successful [57]. A robust coordination between the organizers
434 and the contributors could help to enhance the level of trust of
435 the contributors toward the organizers that could eventually lead
436 the contributors to believe that they will get a financial reward; in
437 such a case, the contributors would admire the crowdsourcing
438 organizers. Such confidence in the contributors will improve
439 the trustworthiness of the organizers that corroborates with the
440 concept of trust theory [28]. Accordingly, it is hypothesized the
441 following.

442 *H4a: Better coordination (CDN) activities between crowdsourcing*
443 *organizers and contributors will positively influence the CSA of the*
444 *crowdsourcing contributors.*

445 *H4b: Better coordination (CDN) activities between crowdsourcing*
446 *organizers and contributors will improve the financial rewards (FIR)*
447 *opportunity of the crowdsourcing contributors.*

448 5) *Financial Rewards (FIR)*: Apart from the fact that trust-
449 worthiness of the organizers in crowdsourcing is an important
450 predictor of SCPs, financial rewards to the contributors are also
451 considered as a vital factor for motivating the contributors to
452 participate in the crowdsourcing activities [15]. A study has
453 demonstrated that financial rewards influence the job satisfac-
454 tion of the crowdsourcing contributors, and it also influences
455 the trustworthiness of the organizers [18]. By getting proper
456 financial rewards, the contributors' trust toward the organizer is
457 enhanced that also helps to improve the crowdsourcing activities
458 as well as helps to motivate the contributors to exhibit admiration
459 toward the crowdsourcing organizers [58]. When the contrib-
460 utors find that the organizers are rewarding them financially
461 as per the assurance, the contributors do not suffer from the
462 uncertainty and acquire a sense of respect and admiration toward
463 the crowdsourcing organizers. In such a case, the motivation
464 of the contributors is enhanced in line with motivation theory
465 [29]. Consequently, crowdsourcing activities could become suc-
466 cessful under any challenging situation. In terms of the above
467 discussion, the following hypotheses are put forward.

H5: Appropriate financial rewards (FIR) to the crowdsourcing con-
468 *tributors positively influence their CSA toward crowdsourcing orga-*
469 *nizers.*
470

H6: Appropriate financial rewards (FIR) to the crowdsourcing con-
471 *tributors positively influence the achievement of SCPs.*
472

6) *CSA and SCPs in the Wake of the COVID-19 Pandemic*: In
473 the perspective of crowdsourcing activities, when the organizers
474 reveal their identity, history, and mode of works—factors that
475 help to attract the contributors—many individuals contribute
476 by taking a part in the crowdsourcing activities [59]. This will
477 help to enhance the popularity of the organizers [51], [60]. The
478 contributors then admire the crowdsourcing activities initiated
479 by the organizers. Being admired by the contributors, the orga-
480 nizers are also positively motivated and take more initiatives
481 toward attracting and motivating the contributors that could
482 eventually influence the success of crowdsourcing practices,
483 especially in the wake of the COVID-19 pandemic [61]. Thus,
484 admiration by the contributors for the crowdsourcing organizers
485 is enhanced when the contributors get assurance that they will
486 get the promised reward [15]. Such assurance of rewards to the
487 contributors by the crowdsourcing seekers is likely to motivate
488 the contributors to be involved in crowdsourcing activities by
489 providing their valuable inputs to the crowdsourcing seeker orga-
490 nizations. Consequently, crowdsourcing activities become more
491 successful. Hence, from the above discussion, the following
492 hypothesis is developed.
493

H7: CSA of the contributors positively influences achieving SCPs in
494 *the wake of the COVID-19 pandemic.*
495

7) *Moderating Role of TLS*: Crowdsourcing is considered as
496 a kind of business model whose adoption has accelerated be-
497 cause of the COVID-19 pandemic [3]. The main responsibilities
498 in crowdsourcing are with the organizers seeking crowdsourc-
499 ing. For this reason, the organizers must take a leadership role
500 to help the contributors motivationally and technologically so
501 that crowdsourcing activities can unfold smoothly [62], [63],
502 [64]. For this, it is the duty of the organizers involved in
503 such crowdsourcing activities to apprise the contributors how
504 to be involved in the crowdsourcing process with the help of
505 appropriate technology [65], [66], [67]. The organizer should
506 take a leadership role to explain to the contributors the pro-
507 cess and practices and should ensure rewards to them after
508 successful completion of the tasks. It helps motivating the
509 contributors to contribute for completion of the tasks promptly
510 and accurately [15], [27], [68], [69]. Thus, technology plays a
511 vital role toward attracting contributors for participating in the
512 crowdsourcing activities and technology also helps propagate
513 effective and timely communication between the organizers
514 and contributors as they could be physically located far from
515 each other [70]. Therefore, appropriate use of technology can
516 help to achieve SCPs, especially in the wake of the COVID-
517 19 pandemic. Accordingly, the following hypotheses are
518 formulated.
519

H8a: TLS moderates the relationship between CSA and SCPs in the
520 *wake of the COVID-19 pandemic.*
521

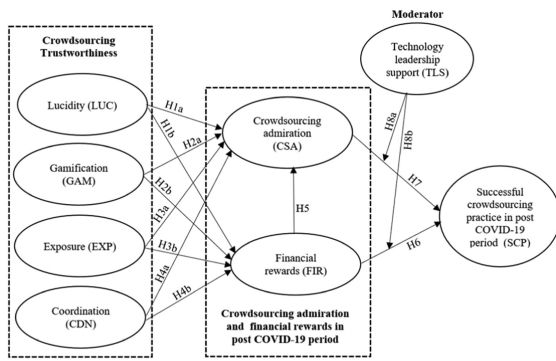


Fig. 1. Conceptual model (adopted from motivation and trust theories).

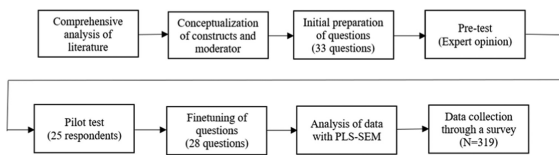


Fig. 2. Research flow diagram.

522 *H8b: TLS moderates the relationship between appropriate financial*
 523 *rewards (FIR) and SCPs in the wake of the COVID-19 pandemic.*

524 Based on the hypotheses formulated, we have developed a
 525 conceptual model that is represented in Fig. 1.

526 **IV. RESEARCH METHODOLOGY**

527 The hypotheses developed in this study need to be tested
 528 statistically. To achieve this aim, we have deployed a quantitative
 529 approach, conducted a survey, and then analyzed the data. The
 530 research flow diagram is illustrated in Fig. 2.

531 **A. Preparation of Instruments**

532 Building on the extant literature, we have developed the
 533 instruments. Initially, we prepared 33 instruments in the form
 534 of statements. The instruments were pretested by obtaining the
 535 opinion of six experts from industry having practical knowledge
 536 in this study domain. We also sought opinion from the four
 537 academicians who are engaged in research works in different
 538 aspects of crowdsourcing. With their opinion, the languages of
 539 the instruments were made simpler so that the respondents can
 540 respond without any difficulty understanding the instruments.
 541 After completion of pretest, pilot test has been undertaken with
 542 a small sample of 25 gathered through purposive sampling
 543 process [71], [72]. These 25 respondents were not included in
 544 the main survey. The inputs of these 25 respondents helped us to
 545 rectify the recitals of the instruments to increase their readability
 546 and understandability. The outcomes of the pilot test helped to
 547 rectify the questionnaire and helped to drop five instruments
 548 that could not support to enhance the constructs' reliability. In
 549 this way, eventually 28 instruments were fine-tuned. The survey

instrument, along with the sources, is provided in Table VI of
 the Appendix.

552 **B. Strategy for Data Collection**

553 We have deployed social media platforms for reaching the
 554 targeted respondents who are associated with crowdsourcing
 555 activities in different ways, such as crowdsourcing organiz-
 556 ers, crowdsourcing contributors, and so on. Hence, to select
 557 the respondents, convenience sampling and purposive sampling
 558 have been used. We used Google docs for sending the survey
 559 instruments to the targeted respondents. The survey process was
 560 conducted over the period January 2022–May 2022. We sent
 561 the response sheet containing 28 instruments to the intended
 562 participants. Since the responses were quantified in a five-point
 563 Likert scale anchoring strongly disagree (SD) marking as 1 to
 564 strongly agree (SA) marking as 5, each instrument was provided
 565 with these five options. Each respondent is to put one tick mark in
 566 one option out of five options in the response sheet. On scrutiny
 567 of the responses, it was found that most of the respondents were
 568 from Asian or European countries. We selected these respon-
 569 dents as our targeted respondents. With each response sheet, a
 570 guideline was provided describing how to fill up the response
 571 sheet. Also, with the response sheet, we appraised the respon-
 572 dents that their anonymity and confidentiality will be strictly
 573 preserved, and the aim of this study is purely academic. We also
 574 requested the respondents to respond within two months (April
 575 and May 2022). By this way, we could collect responses of 330
 576 respondents within the stipulated time. These responses were
 577 thoroughly scrutinized. After verification of these responses, it
 578 was observed that 11 responses were incomplete. We did not
 579 consider them. These 11 responses were not considered because
 580 the 11 respondents concerned put tick marks in more than one
 581 option against each question. We analyzed the responses of
 582 319 respondents against 28 instruments. Table II provides the
 583 demographic statistics of 319 respondents.

584 **V. DATA ANALYSIS AND RESULTS**

585 To analyze the results of the survey, we have used partial
 586 least square (PLS)-SEM approach [73] with the help of Smart-
 587 PLS3.2.3 software [74]. The PLS-SEM technique does not
 588 require the data to be normally distributed, which is supposed
 589 to be the essential criterion for analyzing data with the help of
 590 CB-SEM technique. We have used nonparametric bootstrapping
 591 procedure considering 5000 resamples to assess the path coef-
 592 ficients of different linkages, *p*-values, and *R*² values with the
 593 help of SEM.

594 **A. Measurement Properties Along With Test of Discriminant**
 595 **Validity**

596 For verifying the convergent validity, we have estimated
 597 the loading factor (LF) of each instrument. To examine the
 598 validity, reliability, and internal consistency of each construct,
 599 we have estimated average variance extracted (AVE), com-
 600 posite reliability (CR), and α (Cronbach's alpha). The results

TABLE II
DEMOGRAPHIC STATISTICS ($N = 319$)

Particulars	Category	Frequency (N)	Percentage (%)
Gender	Male	224	70.2
	Female	95	29.8
Age	Teenagers (below 19 years)	101	31.7
	Young adult (19–45 years)	143	44.8
	Older adult (more than 45 years)	75	23.5
Educational qualification	Graduate	230	72.1
	Postgraduate	56	17.5
	Doctorate	33	10.4
Geographical location	Asia	202	63.3
	Europe	117	36.7

TABLE III
MEASUREMENT PROPERTIES

Constructs/Items	LF	AVE	CR	α	t-values
LUC		0.600	0.822	0.876	
LUC1	0.841				22.18
LUC2	0.717				26.17
LUC3	0.760				34.11
GAM		0.575	0.811	0.829	
GAM1	0.797				27.29
GAM2	0.0771				21.41
GAM3	0.734				26.38
GAM4	0.724				33.07
EXP		0.681	0.824	0.859	
EXP1	0.793				34.17
EXP2	0.778				36.12
EXP3	0.843				26.37
EXP4	0.866				23.08
CDN		0.683	0.856	0.891	
CDN1	0.871				37.19
CDN2	0.820				24.12
CDN3	0.786				32.21
CSA		0.617	0.822	0.889	
CSA1	0.827				26.38
CSA2	0.755				27.29
CSA3	0.626				36.33
CSA4	0.731				24.17
FIR		0.741	0.851	0.894	
FIR1	0.887				38.21
FIR2	0.897				34.27
FIR3	0.795				32.11
SCP		0.566	0.808	0.843	
SCP1	0.730				24.29
SCP2	0.722				26.55
SCP3	0.740				33.11
SCP4	0.774				30.31
SCP5	0.789				25.27
SCP6	0.727				29.89
SCP7	0.782				38.27

601 highlight that all the estimated values are within the spec- 609
 602 ified range [75], [76]. The lowest allowable values of LF 610
 603 and AVE are 0.7 and 0.5, respectively. Table III provides the
 604 results.

605 To test the discriminant validity, we have used Fornell and
 606 Larcker criteria [77]. We have estimated the square roots of all
 607 the AVEs and found that they all are greater than the respective
 608 bifactor correlation coefficients. This satisfies the Fornell and

Larcker criteria. It confirms discriminant validity of the con- 609
 structs. Table IV provides the results. 610

B. Moderator Analysis [Multigroup Analysis (MGA)] 611

612 For assessing the effects of the moderator, TLS on the linkages
 613 H7 and H6, we have adopted MGA approach [78]. We have
 614 adopted bootstrapping procedure considering 5000 resamples. 614

TABLE IV
DISCRIMINANT VALIDITY TEST (FORNELL AND LARCKER CRITERIA)

Constructs	LUC	GAM	EXP	CDN	CSA	FIR	SCP	AVE
LUC	0.245							0.600
GAM	0.117	0.240						0.575
EXP	0.112	0.137	0.260					0.681
CDN	0.201	0.121	0.210	0.261				0.683
CSA	0.191	0.192	0.116	0.195	0.248			0.617
FIR	0.210	0.189	0.196	0.112	0.189	0.272		0.741
SCP	0.126	0.106	0.122	0.162	0.175	0.182	0.238	0.566

TABLE V
STRUCTURAL EQUATION MODELING

Linkages	Hypotheses	Path coefficients	p-values	Remarks
LUC→CSA	H1a	0.21	p<0.01(**)	Supported
LUC→FIR	H1b	0.24	p<0.05(*)	Supported
GAM→CSA	H2a	0.17	p<0.001(***)	Supported
GAM→FIR	H2b	0.19	p<0.05(*)	Supported
EXP→CSA	H3a	0.02	p>0.05(ns)	Not Supported
EXP→FIR	H3b	0.25	p<0.01(**)	Supported
CDN→CSA	H4a	0.18	p<0.05(*)	Supported
CDN→FIR	H4b	0.01	p>0.05(ns)	Not Supported
FIR→CSA	H5	0.29	p<0.001(***)	Supported
FIR→SCP	H6	0.31	p<0.01(**)	Supported
CSA→SCP	H7	0.32	p<0.001(***)	Supported
(FIR→SCP)×TLS	H8a	0.26	p<0.01(**)	Supported
(CSA→SCP)×TLS	H8b	0.22	p<0.001(***)	Supported

615 In this study, we have analyzed the moderating effect of TLS
 616 by categorizing it into two groups, strong TLS and weak TLS.
 617 It appears that the *p*-value differences for the effects of the two
 618 categories of the moderator TLS on H7 and H6 are 0.03 and
 619 0.01, respectively, both being less than 0.05. It confirms that
 620 moderating effects of TLS on H7 and H6 are significant [73],
 621 [78].

622 *C. Common Method Bias (CMB)*

623 In the survey-based data, there is a chance of having CMB.
 624 To mitigate the biased replies, we have taken some procedural
 625 remedies as a pre-emptive measure. We have fine-tuned the
 626 questionnaire through pretest and pilot test as well as we assured
 627 the respondents during the survey that their anonymity and
 628 confidentiality will be strictly preserved. Also, we have tested
 629 the severity of CMB by performing two statistical tests. We
 630 have conducted post hoc Harman’s first factor test (FFT) where
 631 the first factor value came out as 21.48, which is within the
 632 permissible limit [79]. To supplement Harman’s FFT, we also
 633 conducted a marker correlation test [80]. The results of both the
 634 tests confirmed that CMB could not pose a major challenge in
 635 this study.

636 *D. Hypotheses Testing (SEM)*

637 For hypotheses testing, we have adopted bootstrapping pro-
 638 cedure by considering 5000 resamples. With the consideration
 639 of omission–separation 7, we have assessed *Q*² value to verify
 640 cross-validated redundancy. The positive value of *Q*² confirmed

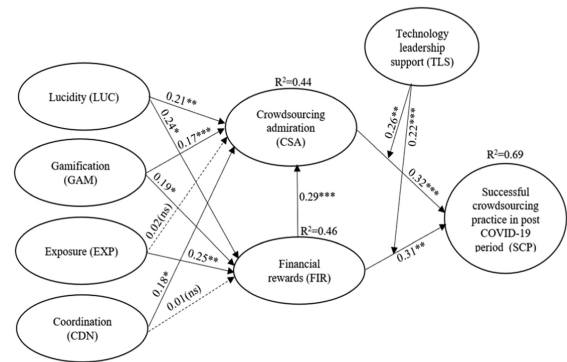


Fig. 3. Validated model (SEM).

641 that the model has predictive relevance [78]. For ascertaining the
 642 model fit, we have considered standardized root-mean-square
 643 residual as a standard index and found that its values are 0.062
 644 for PLS and 0.033 for PLS_c. Both these values are less than the
 645 allowable highest value of 0.08 [81]. The result confirms that
 646 the model is in order [80]. This process helped to estimate the
 647 path coefficients of different linkages, *p*-values, and *R*² values.
 648 Table V provides the results.

649 With all these inputs, the validated model is shown in Fig. 3.

650 VI. FINDINGS AND DISCUSSION

651 As several scholars and observers have noted, the COVID-19
 652 pandemic has generated multiple challenges threatening not only

human lives but also generating social and economic challenges that many organizations were not prepared to face. Those challenges also characterize the present time that for some scholars has been described as the post COVID-19 period. In this article, we had suggested that the challenges related to the COVID-19 pandemic were not over and had generated a shift toward new business models and patterns [82], such as crowdsourcing. This work had highlighted that extreme events, such as pandemics, could be faced by undertaking crowdsourcing initiatives as a coordinating mechanism to successfully harness the potential of the crowd to overcome social and economic challenges. By analyzing the extant literature on crowdsourcing, we found that there is paucity of extensive empirical studies concerning the practices underpinning the execution of crowdsourcing activities in the wake of the COVID-19 pandemic [83]. Accordingly, we had holistically tried to fill up this research gap by investigating how different characteristics of the trustworthiness of the crowdsourcing organizers can influence success in crowdsourcing initiatives. Accordingly, this study had developed a conceptual model consisting of 13 hypotheses, including two hypotheses, also covering the moderating effects of TLS on crowdsourcing success. After a statistical analysis of the data, it appears that 11 out of the 13 hypotheses were supported. Two hypotheses—namely H3a (EXP→CSA) and H4b (CDN→FIR)—were not significant as the concerned path coefficients are too low (0.02 and 0.01, respectively) with levels of nonsignificance in each case as $p > 0.05$ (ns). The reasons of the rejection of H3a are that the respondents in the survey believe that the exposure of crowdsourcing organizers is not an essential quality for the prediction of admiration of crowdsourcing contributors (H3a). In relation to the lack of support for H4b, the respondents subscribed to the fact that coordination between organizers and contributors does not have a strong correlation with financial rewards provided to the crowdsourcing contributors.

This study had also used motivation theory to demonstrate that by enhancing extrinsic and intrinsic motivation of the contributors by the organizers through developing different trustworthiness factors, such as gamification, lucidity, and other trust factors along with financial rewards, it is possible to motivate the crowdsourcing contributors to get involved in crowdsourcing activities. This idea has been supported by another study of Xu et al. [26]. The study also demonstrated that LUC, GAM, EXP, CDN, and FIR could predict CSA to the tune of 44% ($R^2 = 0.44$). Also, it appears from the results that LUC, GAM, EXP, and CDN could predict FIR to the tune of 46% ($R^2 = 0.46$). The results also highlighted that CSA and FIR could simultaneously predict SCP to the extent of 69% ($R^2 = 0.69$), which is the explanatory power of the proposed theoretical model.

Now, we shall discuss graphically how strong and weak TLS could influence the relationships covered by the linkages H6 and H7. Figs. 4 and 5 graphically represent the effects of moderator on the linkage CSA→SCP and FIR→SCP, respectively.

In both the graphs, the continuous and the dotted line represent the effects of strong TLS and the effects of weak TLS, respectively. From the graphs, it is observed that with increase of CSA (see Fig. 3) and with the increase of FIR (see Fig. 4), the rates of increase of SCP are more for the effects of strong TLS compared

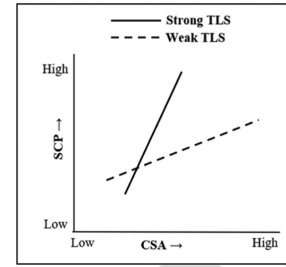


Fig. 4. Effects of moderator TLS on CSA→SCP.

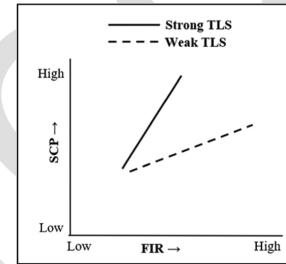


Fig. 5. Effects of moderator TLS on FIR→SCP.

with the effects of weak TLS in both the cases. It is because, in both the graphs, the gradients of the continuous lines are more than the gradients of the dotted lines. A possible interpretation is that with the increase of CSA (see Fig. 4) and FIR (see Fig. 5), the rates of increase of SCP for both the figures are more for the impacts of strong TLS compared with the impacts of weak TLS because, in both the graphs, the inclinations of the continuous lines with the horizontal axes are more comparable with the dotted lines.

A. Theoretical Contribution

This work makes several theoretical contributions. First, while there is a research stream investigating the advantages of outsourcing practices, there is a scarcity of empirical studies examining the factors driving crowdsourcing initiatives, especially in the wake of the COVID-19 pandemic. While most of the existing studies have focused only on specific crowdsourcing initiatives [84], this work has examined the factors that drive successful crowdsourcing initiatives in the wake of the COVID-19 pandemic. Second, we have extended extant knowledge by investigating the moderating role of TLS on two relationships—CSA and SCP on one hand and FIR and SCP on the other hand. So far, no other studies have investigated the influence of such type of moderator on drivers of SCPs. Thus, the empirical findings of the present study have been able to substantiate the relevance of investigating and analyzing the crowdsourcing effects in the wake of the COVID-19 pandemic. In such context, this study has demonstrated how crowdsourcing initiatives have been able to highlight that crowdsourcing practices, fostered by different digital tools, are able to convey effective and useful solutions in the wake of the COVID-19 pandemic. Third, this study is claimed to be one of the first studies that explained extensively

the impact of trustworthiness of the crowdsourcing organizers to achieve success in crowdsourcing activities. Most of the extant studies only analyzed the factors influencing successful crowdsourcing activities either from the perspectives of the internal and external aspects of the crowdsourcing contributors or from the perspectives of the development of system software [35], [85]. Such studies did not extensively examine and analyze the key role of crowdsourcing organizers. Fourth, this work has discussed as well as investigated the role of organizers also for achieving success in crowdsourcing practices even in the wake of the COVID-19 pandemic by highlighting that distrust toward the organizers is one of the most important factors reducing the contributors' participation in crowdsourcing activities.

Fifth, this study is claimed to have successfully leveraged trust theory and motivation theory to show that crowdsourcing practices under a pandemic constraint can be enhanced by driving higher levels of trustworthiness (which could help to motivate the crowdsourcing contributors) and motivation (both intrinsic and extrinsic motivation play a key role in crowdsourcing activities). Sixth, this study has enhanced the existing literature on the job characteristics model [86] by suggesting that the model can hardly be able to capture different dimensions of crowdsourcing practices. Instead through our analysis, we have been able to extend the job characteristics model in terms of crowdsourcing market by considering new crowdsourcing drivers. Indeed, as suggested by Alcover and Topa [87], the job characteristic model does not consider social and situational characteristics of works. Seventh, the present study has contributed to the literature of crowdsourcing by exploring the intimate nexus between the situational factors of crowdsourcing (one of which is the trust factor) and perceived work efforts by the contributors (one of which is the motivational factor). This is essential because the high uncertainty in the crowdsourcing market has made trust in the organizers a critical driver. Finally, we also extend the work by Xu et al. [26], as we have considered a wider range of drivers (including lucidity, gamification, exposure, and coordination) between the crowdsourcing organizers and contributors for achieving SCPs by paying attention to contextual factors, such as financial rewards and CSA.

B. Implication to Practice

This study has demonstrated that by enhancing the trustworthiness of the crowdsourcing organizers, it is possible to motivate the crowdsourcing contributors to participate in the crowdsourcing activities. Hence, this study has facilitated the consideration of the incentive design along two perspectives: the crowdsourcing organizers' perspective and the crowdsourcing contributors' perspective. This implies that crowdsourcing organizers are also needed to improve their positive image of being trusted in addition to their (organizers) role to motivate the contributors for participating in the crowdsourcing activities/practices. The crowdsourcing organizers should try to solve problems of information asymmetry that causes distrust in the minds of the crowdsourcing contributors resulting in low participation rates. The organizers must coordinate with the contributors by addressing all the doubts of the contributors. This will help enhance the confidence of the contributors as they will

think that they will be properly rewarded for the performance of their tasks based on the assurance of the crowdsourcing organizers. By continuously interacting with the contributors to understand their constraints, it will be possible for the organizers to enhance their exposure to the audience helpful to achieve better trust toward them (organizers) that eventually will help to ensure success in crowdsourcing practices.

This study has provided effective insights to explore relationship management in the context of three stakeholders. They are the crowdsourcing organizers, the crowdsourcing contributors, and the crowdsourcing platform managers. The crowdsourcing organizers should use gamification-related initiatives (e.g., better design) as well as nongamification-related factors (transparency, financial rewards, identity) to improve their image to be trusted by the contributors, which will help to enhance the motivation of the contributors toward participating in the crowdsourcing activities. The organizers should provide proper feedback in real time to the contributors and should also appreciate the contribution of the crowdsourcing contributors for their effective performance, which will help to attract more contributors toward crowdsourcing activities. In brief, crowdsourcing organizers should maintain a cordial and intimate relationship with the crowdsourcing contributors as well as the crowdsourcing platform managers. This should ensure success toward the crowdsourcing initiatives and such a close relationship will enhance the motivation of the contributors toward participating in crowdsourcing activities even in unfavorable circumstances.

C. Limitations and Future Research Direction

Although this study has made several theoretical contributions to extant research and knowledge, as well as developed managerial implications, it displays some limitations. First, the findings depend on the cross-sectional data, which have been collected at a single point of time by using self-reported measures. Hence, we cannot claim causality in the relationships identified. Second, cross-sectional studies are often prone to endogeneity bias. It is recommended that researchers conduct longitudinal field research to control this limitation. Second, the findings rely on respondents based in Asia and Europe. Hence, there is an external validity issue that should be addressed by collecting data from respondents located in other geographical areas. Third, the explanatory power of the proposed theoretical model is 69%. Future researchers may consider other characteristics of the organizers in addition to trustworthiness (e.g., justice [88]) and examine if adding a driver may improve the percentage of variance explained. Fourth, despite we have both European and Asian respondents, we could have analyzed and compared the responses regionwise. Future researchers might conduct a similar study but also distinguish countries and regions. Fifth, in this work, we have only included one typical system design feature, such as gamification, on the crowdsourcing platform, although crowdsourcing applications contain multifarious attributes (such as aesthetics and stories) that drive use. In future research, scholars might consider system motivational features to assess how they could influence contributor participation. Sixth and last, this study did not consider a rival model. Future research might address this limitation.

APPENDIX

TABLE VI
SUMMARY OF QUESTIONNAIRE

Items	Source	Statements	Response
			[SD], [D], [N], [A], [SA]
LUC1	[17]	I believe that lucidity helps to develop trust between both crowdsourcing organizers and contributors.	[1], [2], [3], [4], [5]
LUC2	[8], [45], [46]	I think that the lucidity of the crowdsourcing organizers helps to increase participation of the contributors to do the tasks in post COVID-19 period.	[1], [2], [3], [4], [5]
LUC3	[46], [47]	Lucidity helps in impacting the crowdsourcing contributors to admire the crowdsourcing organizers.	[1], [2], [3], [4], [5]
GAM1	[18], [49]	I believe that gamification-related indicators can estimate organizers' trustworthiness, especially in the post COVID-19 period.	[1], [2], [3], [4], [5]
GAM2	[50]	Competitive gamification-based indicators disclose the skills and competencies of the crowdsourcing organizers.	[1], [2], [3], [4], [5]
GAM3	[51]	I think that different types of gamifications help to improve the trust levels of the crowdsourcing contributors.	[1], [2], [3], [4], [5]
GAM4	[48], [49]	Through gamification process, contributors feel assured of being rewarded appropriately by the organizers.	[1], [2], [3], [4], [5]
EXP1	[5], [52]	I think that maturity of the skills and knowledge of the crowdsourcing organizers is important, especially in the post COVID-19 period.	[1], [2], [3], [4], [5]
EXP2	[53]	I believe that as the crowdsourcing organizers gather more experience, the organizers gain more superiority in crowdsourcing activities.	[1], [2], [3], [4], [5]
EXP3	[25]	Acquiring more crowdsourcing competence can help to improve trust level of the crowdsourcing contributors.	[1], [2], [3], [4], [5]
EXP4	[27], [52]	Contributors will feel more assured of being appropriately rewarded from the mature crowdsourcing organizers.	[1], [2], [3], [4], [5]
CDN1	[2], [54], [85]	Coordination between crowdsourcing organizers and contributors is an important factor during and after COVID-19 pandemic when social distancing is important.	[1], [2], [3], [4], [5]
CDN2	[55]	I believe that stakeholders in crowdsourcing activities should jointly work together to achieve a common goal.	[1], [2], [3], [4], [5]
CDN3	[57], [84]	Improper coordination among the crowdsourcing stakeholders can jeopardize the project especially during and after COVID-19 when mobility is restricted.	[1], [2], [3], [4], [5]
CSA1	[51], [60]	Admiration of contributors to participate in a crowdsourcing project is an important aspect.	[1], [2], [3], [4], [5]
CSA2	[59]	Crowdsourcing contributors are more motivated to participate in a crowdsourcing project if appropriate reward is assured.	[1], [2], [3], [4], [5]
CSA3	[51]	I believe that organizations that have more experience in crowdsourcing projects are more attractive for the crowdsourcing contributors to participate.	[1], [2], [3], [4], [5]
CSA4	[60]	I believe that if the crowdsourcing organizers disclose their identity, then the contributors admire more to participate in the crowdsourcing projects.	[1], [2], [3], [4], [5]
FIR1	[61]	I believe that financial rewards are the most important aspect to attract the contributors to take part in a crowdsourcing project.	[1], [2], [3], [4], [5]
FIR2	[11], [59]	I think that an attractive reward can ensure the success of a crowdsourcing project.	[1], [2], [3], [4], [5]
FIR3	[21], [57]	Financial reward can motivate the crowdsourcing contributor to choose one project than another.	[1], [2], [3], [4], [5]
SCP1	[51], [60]	I believe that revealing identity, history, and mode of work can help crowdsourcing organizations to become more popular.	[1], [2], [3], [4], [5]
SCP2	[1], [5]	Attracting skillful and knowledgeable contributors in a crowdsourcing project is an important aspect for project success.	[1], [2], [3], [4], [5]
SCP3	[2], [3]	Financial incentive to the crowdsourcing contributors can enhance the success rate of a crowdsourcing project.	[1], [2], [3], [4], [5]
SCP4	[2], [3]	I believe that crowdsourcing practices can minimize the overall project cost.	[1], [2], [3], [4], [5]
SCP5	[8], [18]	I think that in the post COVID-19 scenario, crowdsourcing practices by the organizations have accelerated.	[1], [2], [3], [4], [5]
SCP6	[61], [84]	I believe that during and post COVID-19 period, crowdsourcing practices have become more popular.	[1], [2], [3], [4], [5]
SCP7	[28], [29]	I think in the post COVID-19 scenario, it is easier to find skillful resources to contribute for crowdsourcing projects.	[1], [2], [3], [4], [5]

SD = Strongly Disagree; D = Disagree; N = Neither agree nor disagree; A = Agree; SA = Strongly Agree.

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