Online Review Response Strategy and Its Effects on Competitive Performance.

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Highlights

- The quantity of managerial responses positively impact hotels performance.
- Managerial responses have a stronger positive impact on negative reviews.
- A defined response strategy is more effective than no strategy.
- Having a certain level of responses is more effective than not responding.
- A selective response strategy is more effective than responding to all reviews.

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1 Online Review Response Strategy and Its Effects on Competitive Performance. 2 3 Abstract 4 Online reviews have transformed consumer behavior in information searching and sharing. Their growing popularity has enabled new differentiation strategies for lodging 5 6 operators. More subtly, online review systems have forced hotel managers to compete 7 through the effective use of information systems that they have not created or purchased. 8 Therefore, managers in the tourism industry must adapt to the widespread use of external 9 systems, incorporate them in their strategy and evaluate their effects. 10 This study focuses on the impact of managements' quantity and quality of usage of online review systems. Our findings show that managerial response quantity positively impacts 11 12 hotels' competitive performance. Moreover, responses have a stronger positive impact 13 when they address negative reviews. We evaluate four response strategies and find 14 significant performance differences among them. Our finding demonstrates the 15 importance of proficiency in external information systems use because performance 16 differs by "how" the system is used – not only "how much." 17 18 Keywords: online review; managerial response; quantity of response; quality of response; 19 response strategy

1. Introduction

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2 Travel is one of the most expensive items purchased regularly by households, and it 3 represents a significant proportion of individual's annual budget. Travel budgets also 4 represent a significant expense for many corporations. Tourism and travel products (e.g., 5 hotel rooms) are experience goods (Nelson 1970) where customers must purchase and 6 utilize the service to ascertain its quality. That is, unlike search goods which the 7 customers have an opportunity to evaluate before purchasing, hotel accommodation has 8 always been impossible to "test" a priori. Experience goods are therefore characterized by a disproportionate importance of reputation which is used as a proxy for gauging 9 10 quality prior to consumption (Nelson 1970). The importance of brands is widely 11 recognized in the hotel industry and it has been one of the historic drivers of industry 12 consolidation (Prasad and Dev 2000). While the nature of travel services as experience goods has not changed, the continuing 13 14 evolution of Information Technology (IT), and the widespread adoption of the Internet, 15 contributed to virtualizing the information gathering process (Overby 2008). For example, 16 the Internet has enabled the virtualization of tourism information search with dramatic 17 changes in consumers' behavior (Buhalis and Law 2008) and the strategic balance of 18 power between operators and intermediaries. The success of alternative accommodation 19 arrangements, such as AirBnB, is arguably enabled by the digitalization of trust and reputation enabled by the IT. Social media and opinion platforms today are mainstream 20 21 communications media in the tourism industry (Schmidt et al. 2008). Having virtualized 22 the information search process, IT shifted the source of hotel information from traditional 23 intermediaries and operators, to two categories of internet-based entities: (1) online travel 24 agencies (e.g., Expedia) and, (2) online review specialists (e.g., TripAdvisor, Oyster). 25 Online reviews are evaluative statements, written by actual or potential customers, 26 available to end user and institutions via the Internet (Stauss 2000). They represent a 27 critical information resource enabling prospective hotel guests to leverage the experience 28 of other travelers in their selection process (Levy et al. 2013). 29 Recent industry data indicates that about 53% of travelers would not make a reservation

until they read hotel online reviews and 77% of prospective guests report reading reviews

- before they choose a hotel either "always" or "usually" (TripAdvisor 2014). The
- 2 academic literature shows that positive online hotel reviews enhance customers' trust in
- 3 the hotel (Sparks and Browning 2011) resulting in improved financial performance (Öğüt
- 4 and Onur Taş 2012).
- 5 One critical, yet understudied, characteristic of modern online review systems is the
- 6 ability of operators to respond to guest reviews. This feature enables managers to join the
- 7 conversation about their products or services by responding publicly to online comments.
- 8 Thus, online review systems are socio-technical artefacts (Silver and Markus 2013) that
- 9 mediate the interaction between the firm and its customers. The ability to respond affords
- the hotel managers an opportunity to further enhance the hotel performance by better
- 11 utilizing this online communication channel. Yet, despite the potential value offered by
- 12 response features, there is a lack of research focusing on response management strategies
- in the hotel industry (Abramova et al. 2015). In this paper, we focus on the question of
- 14 how profit-maximizing hotel operators should respond to online reviews
- 15 Practicing managers have long intuited that partaking in the conversation is important.
- 16 An early industry study by TripAdvisor shows that responding to online reviews
- improves customers' likelihood of recommending a hotel by more than 20% (Barsky and
- Frame 2009). However, there is a lack of research that rigorously and empirically
- 19 classifies and evaluates response management strategies (Liu et al. 2015). We pursue the
- 20 question by conceptualizing online reviews platforms as socio-technical artefacts that
- virtualize the communication process between the customers and the hotels. We
- 22 categorize and analyze firms' online review response strategies in terms of the quantity
- 23 and quality of online review system use. Our results extend previous work on the effect
- 24 of review valence and review quantity on hotel performance. More importantly, ours is
- 25 the first study to measure the competitive performance effect of managerial responses to
- 26 online reviews. Our contribution is in the empirical demonstration that hotels benefit
- 27 from both the quantity and quality of online review systems use. Specifically, those
- 28 hotels that embrace externally developed online review system to respond to customer
- 29 comments display superior competitive performance, and this effect is stronger when the

- 1 hotel uses the system to address negative comments. Finally, we also demonstrate the
- 2 comparative effect of four different classes of response strategies.
- 3 The paper is organized as follows. In the next section, we introduce our theoretical
- 4 framework and discuss previous literature on online reviews and management
- 5 responsiveness. We then introduce the context, methods and data used in our work. We
- 6 conclude by reporting and discussing our findings.

8

2. Theoretical Framework

9 2.1. Online Reviews

- 10 The literature shows that online consumer reviews have a significant influence on travel
- information search and product sales (Duan et al. 2008; Xiang and Gretzel 2010; Mauri
- 12 and Minazzi 2013). In the hotel industry, for example, online hotel reviews increase
- customers' awareness of the hotel and enhance hotel consideration in the customers'
- mind (Vermeulen and Seegers 2009). High review scores convey: (1) product quality and
- 15 (2) social validation (Cialdini 2000). The research has reached consensus on the finding
- that higher review scores increase sales (e.g., Chevalier and Mayzlin 2006; Sparks and
- Browning 2011), while negative reviews are known for having a negative impact on
- customers' attitudes (e.g. Lee et al. 2008). Prior research has also established that the
- 19 total number of reviews a product or service receives leads to higher sales and improved
- brand reputation (e.g., Amblee and Bui 2011). While not the focus of our work, we seek
- 21 to establish that the same relationships hold in our context. Thus, we hypothesize:
- 22 H1a: Cumulative review scores are positively related to firm's competitive performance.
- 23 H1b: The total number of the online reviews positively impacts the firm's competitive
- 24 performance.

2.2. Firm Responsiveness

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2 An online review system is an IT-enabled customer service system (Lui and Piccoli, 2016) 3 that, because of the reach capability of information technology (Overby 2008), has the 4 characteristics of a broadcast communication medium. The firm can utilize such a 5 communication channel to collect intelligence and to respond to consumers' comments. 6 Managerial response is one of the functionalities of the online review systems used for 7 the support of customer relationship, reputation and brand management (Van Noort and 8 Willemsen 2012; Baka 2016). We define managerial response as an answer posted on 9 behalf of a tourism operator by its employees, addressing a specific comment contributed 10 by a guest. Traditionally, customers interact with a few frontline employees during the 11 service encounter, and typically develop an overall image of the emotions that members 12 of a given organization will display (Sutton and Rafaeli 1988). Given that managerial 13 response is publicly available online and will be viewed by potential customers, readers 14 of online reviews can now form a similar perception of the firm's customer orientation 15 strategies without physically interacting with employees. They do so by reading 16 management responses rather than interacting first hand with the staff. In other words, 17 while hotel services remain largely an experience product, perspective guests can 18 vicariously "test it" by reading other guest comments and managerial responses. A 19 positive link exists between a service-oriented business strategy and company 20 performance. For example, managers respond to negative reviews, in some situations, to 21 ensure to customers that the experience described in the negative reviews is unlikely to be 22 repeated (Chevalier et al. 2016). In the absence of much academic literature there is some 23 evidence of the importance of managerial responses from consulting firms. For example, 24 analyzing a survey with 12,225 global consumers, PhoCusWright (2013) reported that 25 over half of the respondents are more likely to book a hotel that displays managerial 26 response compared to a hotel that does not. However, this work does not explain how or 27 why managerial responses produce their effects. 28 Early academic research in this area suggests that managerial responses positively impact 29 subsequent review rating and review volume, especially in the case of unsatisfied 30 customers (Gu and Ye 2014). More importantly, archival research using TripAdvisor data

1 shows that providing timely and lengthy responses to reviews enhances the hotels' future 2 financial performance (Xie et al. 2017). We borrow the concept of usage quality from the 3 information systems literature, which claims that the quantity of usage alone does not 4 guarantee the best outcomes. Quality of system usage (i.e., effective use of the system) is 5 crucial to obtain maximum benefits of the system (Burton-Jones and Grange 2012). That 6 is, ineffective usage of the system (low system usage quality) wastes firm's time and 7 resources without satisfying the objectives of system utilization (Bevan 1995). We thus 8 theorize that, at the firm-level, managerial responses to online reviews reflect the firm's 9 underlying capability in using online review systems. In other words, the emergence of 10 social media and user generated content has forced hotel operators to develop the ability 11 to manage the hotel's reputation online, engage customers, address customers' concerns, 12 and restore customer satisfaction (Xie et al. 2016). The hotels that are able to develop 13 such capabilities, send a credible signal to potential guests, that the management team is 14 reading and responding to the suggestions and comments of their customers. It is such a 15 signal that stimulates future reviewing activities and fosters communications between the 16 customers and the hotels (Chevalier et al. 2016; Wang and Chaudhry 2017). When the 17 hotels start responding to reviews, they receive fewer but longer negative reviews 18 because the customers are willing to invest the extra effort to provide more details in the 19 reviews (Proserpio and Zervas 2016). In summary, managerial responses are the 20 manifestation of the operator's capability to utilize an online review system to implement 21 their service-oriented business strategy.

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2.2.1. Quantity of Responses

Information systems theory predicts that the benefits of new sociotechnical systems
adoption accrue to those organizations that utilize it (Silver et al. 1995). Previous
research has established a direct link between systems usage and firm performance
(Devaraj and Kholi 2003). With the emergence of online review systems and their
opening of a managerial response channel, firms have the opportunity to use the system
to contribute new information about their product or service. Customers perceives
managerial responses as an indicator of the fact that the firm cares about customer service

- 1 (Lee and Hu 2005). Thus, the presence of a managerial response conveys an important
- 2 message of the firm's customer-orientation strategy and is correlated with greater sales
- 3 and improved satisfaction of complaining customers (Gu and Ye 2014). Those
- 4 organizations that recognized the nature of online review systems as broadcast channels
- 5 and their role in customer decision-making devote organizational resources to its use. As
- a consequence, managerial response correlates with increased hotel ratings and review
- 7 volume on TripAdvisor (Xie et al. 2016). We propose that there is a direct link between
- 8 online review systems use and financial performance.
- 9 H2: The cumulative percentage of managerial response to online reviews is positively
- related to the firm's competitive performance

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2.2.2. Quality of Responses

- While recent academic research has begun to investigate the relationship between
- managerial response and hotel financial performance, no work to date has investigated
- the relative effect of different response strategies. In other words, while managerial
- 16 response in online review systems is a type of digital firm competence, there is no work
- to date mapping the impact of this competency on hotels' competitive performance. We
- argue that different response strategies are indicative of different degrees of competence
- by the hotel in adapting to the emergence of online review systems. Thus, they result in
- 20 different competitive performance outcomes. Information systems scholars have
- 21 empirically investigated the link between quantity of system usage and firm performance.
- 22 Conversely, the role of quality of system usage has proven elusive (Sabherwal and
- 23 Jeyaraj 2015). Burton-Jones and Grange (2012) defined effective use as "using a system
- in a way that helps attain the goals for using the system" (p.2). This characterization
- 25 provides a general definition, which can be applied to any context and level of analysis.
- However, it lacks specificity. In the context of online review systems, the quality of use
- 27 relies on the firms' capability to utilize the information in the system effectively and
- 28 produce responses to help attract more customers. Effective information use is defined as
- 29 "the extent to which information provided by the organization's information systems is
- 30 successfully utilized to enable and support its business strategies and value-chain

- activities" (Kettinger et al. 2013). Building on these definitions, we describe the quality
- 2 of review system usage as the extent to which the firm employs the online review system
- 3 to enable its customer orientation strategy. Quality of usage stems from the firms' ability
- 4 to optimize its resource allocation to the managerial response activity.
- 5 The online review literature has demonstrated the disproportionate impact that negative
- 6 reviews have on user decision-making. Specifically, there is an inverse relationship
- 7 between review rating and review diagnosticity, with negative reviews perceived as
- 8 significantly more helpful by readers (Archak et al. 2011). Moreover, negative reviews
- 9 have a greater effect on customers due to the "negativity bias." The bias leads customers
- to pay more attention to negative information than positive inputs (Vaish et al. 2008).
- Because they counterbalance the negativity bias, specific management responses to
- 12 negative online reviews engender more trust and deliver higher perceived communication
- quality than generic responses (Wei et al. 2013). It follows that managerial response
- should have the greatest impact when it addresses negative online reviews. In other words,
- on average, the positive impact of managerial response on competitive performance is
- stronger when the review rating is lower. Formally:

- 17 H3a: The cumulative review scores moderates the relationship between cumulative
- percentage of managerial response to online reviews and firm's competitive performance
- 20 One aspect of quality of usage is captured by the prioritization of resource allocation
- 21 toward negative reviews. However, such conceptualization does not capture the variety of
- 22 response strategies the firm may enact. We posit that the quantity of managerial response
- 23 impact firm performance (H2), and responses will have the greatest impact when
- 24 addressing negative responses (H3a). However, a firm can enact a range of response
- strategies. Most research in the field has analyzed guests' perceptions of the response
- strategies hotels use to address negative reviews (e.g., Lee and Song 2010; Lee and
- 27 Cranage 2012; van Noort and Willemsen 2012; Treviño and Castaño 2013; Abramova et
- al. 2015). These works address the effects of a combination of the following strategies:

- 1 Confession/Apology strategies: The managers politely recognize and apologize for
- 2 the situation but do not offer compensation or follow up actions (Treviño and Castaño
- 3 2013, Abramova et al. 2015).

- Changing/Accommodative strategies: The managers politely recognize the situation
- 5 and explain how they will redress the situation for future occasions. These strategies
- 6 encompass any form of apology, compensation, and/or corrective action (Lee and
- 7 Song 2010, Treviño and Castaño 2013).
- 8 Denial/Defensive strategies: The managers deny the existence of the negative
- 9 experience mentioned in the review, deny responsibility for the negative events, and,
- sometimes attack the customers who leave the negative reviews. The managers
- disagree with the negative statements either directly by saying "I do not agree", "It is
- not true" or indirectly by providing counterarguments to show that the truth is
- different from the events described in the negative reviews (Lee and Song 2010,
- Treviño and Castaño 2013, Abramova et al. 2015).
- Excuse strategies: The managers introduce uncontrollable causes of the negative
- event as an explanation to distance themselves from the responsibility for the incident
- or to shift the blame to a third party (Weiner 2000, Abramova et al. 2015).
- No Response strategies: The managers offer no response to the negative comments or
- take no overt action with the purpose of separating themselves from the negative
- events by remaining silent in the online review platforms (Lee 2004).
- 22 The findings of this research in laboratory settings, suggest that managerial responses to
- 23 negative reviews increase customers' trust toward the firm (Sparks et al. 2016). That an
- 24 accommodative response strategy to negative reviews has a more positive impact on
- customers' evaluation of the company, compared to a defensive response strategy or a no
- 26 response strategy (Lee and Song 2010). That unsatisfied customers expect
- accommodative response from the hotel, when they strongly perceive that the causes of
- 28 the negative event are controllable by the hotel (Coombs 1999). This approach can reduce
- 29 feeling of aggression (Conlon and Murray 1996), which in turn leads to favorable
- evaluation of product or service providers. More specifically, a recent study of response

- strategies on Airbnb shows that when customers' complaints are related to a factor
- 2 controllable by the firm (e.g., cleanliness), a confession/apology strategy results in higher
- 3 customers' trust toward the firm while an excuse strategy will reduce trust. On the other
- 4 hand, when the complaints are beyond the control of the firm, a confession/apology
- 5 strategy or an excuse one positively influence the customers' trust, while a denial strategy
- 6 will have a negative effect (Abramova et al. 2015). Finally, a no response strategy may
- 7 risk allowing negative information about the company to stand unchallenged, which in
- 8 turn may damage the company's reputation and cause potential reputation damage and
- 9 consequent business loss in the future (Chan and Guillet 2011). As these strategies
- studied in the past mainly concerns negative online reviews, very little research to date
- examines empirically the managerial response strategies to all of the reviews present on
- the online review systems. Moreover, no empirical research to date has formally
- evaluated the impact of different response strategies on the competitive performance of
- the hotels adopting them.
- 15 Given the paucity of research on this subject we abstract and categorize response
- strategies empirically. Specifically, we identify the following four managerial response
- 17 archetypes:
- No response strategy (NRS): the hotel never addresses any of the guests' online
- concerns. The NRS is the least costly approach to online review systems usage since
- 20 the hotel devotes zero resources to the effort.
- Strategic customer orientation strategy (SCO): the hotel selectively responds to
- 22 extreme customers' comments (the online reviews with the lowest and highest
- evaluations).
- Full response strategy (FRS): the hotel responds indiscriminately to all guest
- comments in an effort to signal its attention to all customers, regardless of their
- comments.
- No strategy (NS): the hotel displays no discernible response strategy and managers
- address customer comments seemingly at random.

- When a hotel has a clearly defined managerial response strategy, customers can structure
- 2 their expectation of accommodation experience based on the customer-orientation
- 3 strategies the hotel implemented. Without a clearly defined pattern of managerial
- 4 response, it is difficult for prospective guests to create a perception of the hotel and to
- 5 vicariously test the quality of an experience good (e.g., hotel rooms) before consumption.
- 6 Therefore, we propose:
- 7 H3b: A defined response strategy (SCO, FRS and NRS) has a stronger positive effect on
- 8 firm's competitive performance than the no strategy (NS).

- 10 The presence of managerial response creates a dynamic and interactive communication
- between the hotels and the customers. This two-way communication reduces the issue of
- information asymmetry for experience goods (Litvin et al. 2008; Xie et al. 2014). Having
- developed a response strategy signals the operator's care for guests and service quality.
- 14 Previous work shows that this signaling effect leads to improved review valence, number
- of reviews and hotel ratings (Li et al. 2017). As a consequence, we expect this approach
- to also reflect in superior competitive performance of the hotel as compared to a no
- 17 response strategy. Therefore, we propose:
- H3c: The effect of a strategy with different levels of managerial response (CSO and FRS)
- on firm's competitive performance is stronger than the effect of a no response strategy
- 20 (NRS).

- 22 Customer reviews display a J-shaped distribution due to purchasing bias (i.e., the
- 23 prospective customers with lower valuations are less likely to purchase the product) and
- 24 underreporting bias (i.e., the customers with extreme ratings are more likely to write
- 25 reviews than the ones with moderate reviews) (Hu et al. 2009). Rational people react to
- these two biases by paying more attention to extreme reviews compared to moderate
- 27 reviews and even more attention to extreme negative reviews to avoid making mistakes
- 28 on product choice (Hu et al. 2009). On the other hand, responding to positive reviews
- 29 publicly recognizes customers' compliment and creates a positive emotion in the hotel's

- 1 online interactions with customers (Dickinger and Lalicic 2014). A template response
- 2 that simply shows gratitude to customer online compliments when the customers write to
- 3 express their positive feelings about the experience can enhance future customers'
- 4 attitudes (Deng and Ravichandran 2016). It signals that the hotel care about showing
- 5 appreciation of customers' business and experience more than just fighting the negative
- 6 reviews. In addition, when the management provides a personalized response to altruistic
- 7 positive reviews (the ones that providing knowledge sharing benefits to other future
- 8 customers), customers perceive higher usefulness of the response and are more likely to
- 9 agree with the compliment to leave a positive comment. As a result, the managerial
- 10 response will have a positive influence on future review valence (Deng and Ravichandran
- 11 2016). Therefore, focusing on responding to extremes, positive and negative reviews,
- 12 should yield a higher return. We propose:
- 13 H3d: The effect of a strategic customer orientation strategy (SCO) on firm's competitive
- 14 performance is stronger than the effect of a full response strategy (FRS).

Methodology

- 17 The context of this study is the lodging industry, in which travelers make decisions based
- 18 on their own past experience with the hotel or the brand; and/or others' experiences
- shared over the Internet. Therefore, positive online hotel reviews can enhance customers' 19
- 20 trust in a hotel (Sparks and Browning 2011) and, as a consequence, increase the hotel's
- 21 financial performance (Öğüt and Onur Taş 2012). Moreover, as customers become more
- 22 discerning, they use online reviews to better specify their service requirements and
- 23 uncover the best value propositions in the market. As a result, it is common for people to
- 24 read comments about other's experiences to reduce uncertainly before they make a
- 25 purchase (Zheng et al. 2011; Archak et al. 2011).
- 26 We developed a dataset uniquely suited to test our hypothesis by joining financial data
- 27 with online reviews and responses for 39 international hotels in Taipei, Taiwan. For the
- 28 July 2012 to January 2017 timeframe our dataset includes the hotels' monthly average
- 29 room rate, monthly average occupancy percentage, and the total number of employees of

- 1 the month. The choice of the Taipei market was dictated by the fact that it is one of the
- 2 few markets where the government collects and publicizes monthly hotel performance
- data. We complemented performance data with review data from TripAdvisor from June
- 4 20, 2004, the date when the first review appeared in one of the 39 hotels, to January 31,
- 5 2017. The total sample comprises 27,635 unique individual reviews.

7

3.1. Measures

- 8 Cumulative review scores (Cum AvgR) is the running average, for each review, of all
- 9 chronological prior rating for the hotel. This represents the aggregated review score of the
- 10 hotel on TripAdvisor page. We then aggregate the cumulative review scores by averaging
- by month to match with the monthly performance data. The total number of review is the
- review count of the month (TotR). Managerial response capabilities are not a native
- feature of the TripAdvisor platform. The first managerial response for our sample of
- hotels appeared on June 28, 2009. Thus, cumulative response percentage (Cum RespP) is
- 15 computed by dividing the monthly running total of response number and the monthly
- running total of the review posted since July 2009¹.
- We measure competitive performance through Revenue per Available Room (RevPAR)
- 18 Index. RevPAR is a standard measure of financial performance in the hotel industry,
- 19 allowing comparison across hotels with different number of rooms and characteristics. It
- 20 is computed as the product of the occupancy percentage and the average daily room rate.
- 21 RevPAR Index compares an individual property's RevPAR to its competitive set, thereby
- creating a standardized RevPAR measure. We divide the 39 hotels into 5 equally
- 23 distributed groups based on average daily room rate (4 groups of 8 hotels and 1 group of
- 24 7 hotels). The hotels within each group are the competitors to each other. RevPAR Index
- 25 is computed as the hotel's RevPAR divided by the competitors' average RevPAR times
- 26 100. Therefore, a RevPAR Index that is greater than 100 indicates that the hotel
- outperforms its competitive set within the comparable room rate group while numbers
- 28 below 100 indicate relative underperformance. Using RevPAR Index as a competitive

¹ There are only 2 managerial responses between June 28 to June 30, 2009. Using only 2 responses to computing the cumulative response percentage will be misleading so they were ignored in the computation.

1 performance measure allows use to control for all exogenous influences on hotel 2 performance (e.g., economic performance of the overall market, travel market cycle in 3 each segment, seasonality). However, there is a time lag from the day when customers 4 start searching for the hotel information and read the reviews to the actual staying date 5 (when the hotel receives financial benefits). This lead time can be divided into two 6 phases (1) from search to booking and (2) from booking to hotel stay. Based on the 7 statistics reported by HeBS digital, on average a traveler takes 24 days from search to 8 booking (Starkov 2014). We obtained transactional data from July 1, 2012 to August 13, 9 2015 from one of the 39 hotels under study. The data contains 182,322 reservation 10 records, including reservation dates and arrival dates. On average, customers made a 11 reservation 20.53 days before their arrival. Therefore, we assume that the time lag 12 between a customer reading the hotel reviews and the arrival days is 44.53 days. To 13 confirm the casual relationship, we lag RevPAR Index by 2 months. 14 We merge the monthly hotel competitive performance data with the monthly aggregated 15 cumulative review score and cumulative percentage of managerial response. This results 16 in a panel data of 2,076 hotel-month paired observations. Out of the 39 hotels, 35 hotels 17 have 55 monthly performance and aggregated review data. The other 4 hotels were 18 established after July 2012; thus, they have less than 55 monthly observations (25, 38, 42 19 and 46 months to be exact). The descriptive Statistics of the variables are presented in 20 Table 1.

21

Variables	Min.	Median	Mean	Max.	S.D.
RevPAR Index	8.69	53.05	61.42	243.80	33.99
Cumulative Average Review Score (Cum_AvgR)	2.92	4.03	3.99	5	0.37
Cumulative Response Percentage (Cum_RespP)	0	0.16	0.36	1	0.38
Total Number of Reviews (TotR)	0	6	9.92	143	13.31

Table 1. Descriptive Statistics of the Variables

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We measure response strategy on a monthly basis to capture strategy changes by the firms. We categorize the different strategies based on the pattern of responses exhibited on the online review platforms. A firm that responds to no online reviews falls into the no

- 1 response strategy (NSR). A firm that selectively responds only positive reviews with a
- 2 rating of 4 and 5, and/or negative reviews with a rating of 1 and 2, falls into the strategic
- 3 customer orientation strategy (CSO). A firm that responds to all reviews is assigned to
- 4 the full response strategy (FRS). The remaining firms, which engage in response activity
- 5 that does not follow any of the above systematic patterns, represent the no strategy (NS)
- 6 group.

8 3.2. Controls

- 9 We include average review score (Avg Review), guest to staff ratio (GuestToStaff),
- average response window (Avg Window), TripAdvisor star rating (Tripadvisor), and
- affiliation (Affiliation) as control variables. Avg Review is the monthly average of the
- 12 review score received during each month. It provides a measure of product quality and it
- is an important control variable to capture the effect of hotel quality on its competitive
- performance. GuestToStaff is the number of room occupied during the month divided by
- 15 the total number of staff reporting to work during the month. It is a further measure of
- product quality. While Avg Review captures hotel's service quality as perceived by
- travelers, GuestToStaff is an internal measure of quality, a proxy for the service level
- offered by the hotel. Avg Window is the number of days between the review date and the
- managerial response date. It is a control variable designed to measure the speed with
- which hotels respond in order to isolate the effect of managerial response beyond the
- 21 quickness of such action. Finally, TripAdvisor star rating and hotel affiliation
- 22 (independent, local chain and international chain) are included as controls to capture the
- 23 hotel's service levels.

24

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4. Data Analysis and Results

26 4.1. Analytical Procedure

- 27 Due to the panel nature of the data (a panel of hotels by months), we perform Breusch-
- 28 Godfrey/Wooldridge test for serial correlation in fixed effect panel model (Equation 1)

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and the result small p-value (chi square = 257.11, df = 5, p-value < 0.000). Therefore, we
 1
 2
       choose to fit a linear mixed-effects model allowing for nested random effects (Equation 2)
 3
       to test hypotheses H1a, H1b, H2 and H3a.
 4
       RevPARIndex<sub>ij</sub> = \alpha_i + \beta_1 \times (Cum \ AvgR_{ij}) (Equation 1: n-entity Fixed Effects Model)
 5
                                   + \beta_2 \times (TotR_{ij})
 6
                                   + \beta_3 \times (Cum\_RespP_{ij})
 7
                                   + \beta_4 \times (Avg\_Review_{ij})
 8
                                   + \beta_5 \times (GuestToStaff_{ij})
 9
                                   + \beta_6 \times (Avg Window_{ii})
10
                                   + \beta_7 \times (Tripadvisor_{ii})
11
                                   + \beta_8 \times (Affliation_{ii})
12
                                   + \beta_9 \times (Cum\_AvgR_{ij}) \times (Cum\_RespP_{ij}) + \epsilon_{ij}
13
```

 $\alpha_i = \beta_1 + \beta_{10} \times (Hotel_i)$ where $\alpha_1, \dots \alpha_i$ are hotel-specific intercepts to be estimated

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```
1
       RevPARIndex_{ij} =
                               \beta_0 + \beta_1 \times (Cum\_AvgR_{ij})
                                                                       (Equation 2: Mixed Effects Model)
                                + \beta_2 \times (TotR_{ii})
 2
                                + \beta_3 \times (Cum\_RespP_{ij})
 3
                                + \beta_4 \times (Avg\_Review_{ij})
 4
                                + \beta_5 \times (GuestToStaff_{ii})
 5
                                + \beta_6 \times (Avg\_Window_{ij})
 6
 7
                                + \beta_7 \times (Tripadvisor_{ij})
                                + \beta_8 \times (Affliation_{ii})
 8
 9
                                + \beta_9 \times (Cum\_AvgR_{ij}) \times (Cum\_RespP_{ij}) + \epsilon_{ij}
10
                                + random=\simI|Hotel + \epsilon_{ii}
11
       RevPARIndex<sub>ij</sub> = 2 month lag of RevPAR Index of Hotel i (i = 1,...,39) during the j-th
12
13
       month j = 1, ..., n_i
14
       n<sub>i</sub> denotes the number of months for the i-th hotel
15
16
       To test hypotheses 3b-3d, we created a dummy variable called Strategy_d1, where -1
17
       indicates the hotels with no strategy and 1 indicates the others (FRS, SCO and NRS);
       another dummy variable called Strategy_d2, where -1 indicates the hotels with a no
18
19
       response strategy and 1 indicates the ones with a specific patterns of response (FRS and
20
       SCO); and finally the last dummy variable called Strategy_d3, where -1 indicates the
21
       hotels with a strategic customer orientation strategy and 1 indicates the ones with a
22
       reassurance strategy. We then conduct a series of analysis of covariance (ANCOVA)
23
       (Equation 3, 4 and 5) to test hypotheses 3b-3d.
24
25
```

```
RevPARIndex<sub>ij</sub> = \mu + Strategy\_dI_i
 1
                                                                                         (Equation 3: Hypothesis 3b)
                                    + \beta_1 \times (Avg Review_{ij})
 2
                                    + \beta_2 \times (Cum AvgR_{ii})
 3
                                    + \beta_3 \times (Avg\_Window_{ij})
 4
                                    + \beta_4 \times (TotR_{ii})
 5
                                    + \beta_5 \times (GuestToStaff_{ij})
 6
                                     + \beta_6 \times (Tripadvisor_{ij})
 7
                                     + \beta_7 \times (Affliation_{ii})
 8
 9
                                     + \varepsilon_{ij}
10
       where μ is the grand mean of RevPAR Index, Avg_Review<sub>ij</sub> is the average review score
       for observation j of strategy level i (i = 1, 2; j = 1, 2, ..., n_i and n is the number of
11
12
       observations in i-th strategy). The other covariates are represented in the same manner.
13
       RevPARIndex_{ij} = \mu + Strategy_d2_i
14
                                                                                         (Equation 4: Hypothesis 3c)
                                    + \beta_1 \times (Avg Review_{ii})
15
                                    + \beta_2 \times (Cum AvgR_{ii})
16
                                    + \beta_3 \times (Avg Window_{ij})
17
                                    + \beta_4 \times (TotR_{ii})
18
                                     + \beta_5 \times (GuestToStaff_{ii})
19
                                     + \beta_6 \times (Tripadvisor_{ii})
20
21
                                     + \beta_7 \times (Affliation_{ii})
22
                                     +\epsilon_{ij}
```

```
1
 2
      RevPARIndex<sub>ij</sub> = \mu + Strategy_d3_i
                                                                          (Equation 5: Hypothesis 3d)
                              + \beta_1 \times (Avg Review_{ij})
 3
                              + \beta_2 \times (Cum\_AvgR_{ij})
 4
                              + \beta_3 \times (Avg Window_{ii})
 5
 6
                              + \beta_4 \times (TotR_{ii})
 7
                              + \beta_5 \times (GuestToStaff_{ij})
                              + \beta_6 \times (Tripadvisor_{ij})
 8
 9
                              + \beta_7 \times (Affliation_{ii})
                              + \varepsilon_{ij}
10
11
12
      4.2. Findings
13
      After controlling for hotel specific effects, product quality and managerial response
14
      timing, we find that cumulative average review score (Cum AvgR) and total number of
15
      review of the month (TotR) have a significant impact on RevPAR Index. Therefore,
16
      hypothesis 1a and 1b are supported. Hypothesis 2 about cumulative response percentage
17
      is also supported with a significant positive impact on RevPAR Index with 2-month lag.
18
      Finally, the coefficient of the interaction of cumulative response percentage and
19
      cumulative average review score is negative and significant (H3a). This result indicates
20
      that, as the Cum AvgR decreases, the positive relationship between Cum RespP and
21
      RevPAR Index strengthens. In other words, the extent to which a hotel responds to online
22
      reviews has a stronger positive effect on competitive performance when reviews are
23
      negative rather than positive. The results of the fixed effects models are summarized in
24
      Table 2. Table 3 reports the correlation matrix of the dependent and control variables.
25
26
```

Predictor	Coef. β	SE(β)	DF	t-value	p-value
Intercept	-209	80	808	-2.6	0.0089
Cumulative Average Review Score (Cum_AvgR)	30	12	808	2.5	0.011
Total Number of Review (TotR)	0.089	0.043	808	2.1	0.038
Cumulative Response Percentage (Cum_RespP)	129	51	808	2.5	0.011
Monthly Average Review Score (Avg_Review)	-2.4	1.6	808	-1.5	0.13
Guest to Staff Ratio (GTS)	0.039	0.11	808	0.37	0.71
Average Response Window (Avg_Window)	0.024	0.023	808	1	0.3
Tripadvisor	37	18	23	2.1	0.048
Affiliation (International Chain)	37	13	23	2.7	0.013
Affiliation (Local Chain)	3.5	11	23	0.31	0.76
Cum_RespP × Cum_AvgR	-32	12	808	-2.6	0.01

Table 2. Summary Result of the Fixed Effects

	Intercept	1	2	3	4	5	6	7	8	9
1.Cum_AvgR	-0.368									
2.TotR	0.002	-0.240								
3.Cum_RespP	-0.385	0.745	0.090							
4.Avg_Review	0.023	-0.167	-0.048	-0.032						
5.GTS	-0.120	0.045	0.304	0.052	-0.013					
6.Avg_Window	-0.001	-0.030	0.003	-0.025	-0.086	-0.006				
7.Tripadvisor	-0.809	-0.237	0.143	-0.071	-0.003	0.064	0.022			
8.Affiliation_IC	0.022	0.019	0.026	0.041	0.002	0.035	-0.013	-0.077		
9.Affiliation_LC	-0.183	0.043	-0.003	0.044	-0.008	-0.028	-0.020	0.121	0.266	
10.Cum_RespP × Cum_AvgR	0.388	-0.758	-0.095	-0.998	0.029	-0.049	0.033	0.076	-0.045	-0.046

Table 3. Correlation Matrix

4

7

1

2

5 The results of the three ANCOVA to test the difference among the quality of responses

6 (Table 4, 5 and 6), lend support to our claim that having a strategy is better than having

no strategy; having a response strategy is better than having a no response strategy, and

8 finally, having a strategic customer orientation strategy is better than engaging in a full

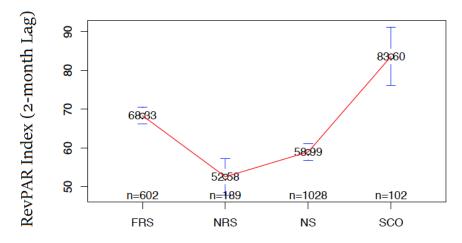
9 response strategy. Thus, we claim support for H3b, H3c and H3d. Figure 1 shows the

number of data points (i.e., hotel-months) associated with each strategy, the average

RevPAR Index and the 95% confidence interval of the average RevPAR Index (blue

lines).

13



Managieral Response Strategies

Figure 1. Average RevPAR Index by Strategies

Predictor	DF	Sum Sq	Mean Sq	F value	p-value
Strategy_d1	1	8319	8319	13.4586	< 0.001
Monthly Average Review Score (Avg_Review)	1	63756	63756	103.1462	< 0.000
Cumulative Average Review Score (Cum_AvgR)	1	143106	143106	231.5191	< 0.000
Average Response Window (Avg_Window)	1	4746	4746	7.6778	0.006
Total Number of Review (TotR)	1	515	515	0.8331	0.362
Guest to Staff Ratio (GTS)	1	22991	22991	37.1949	< 0.000
Tripadvisor	1	2542	2542	4.1119	0.043
Affiliation	2	135922	67961	109.9480	< 0.000
Residuals	882	514274	618		

Table 4. Analysis of Variance Table for Equation 3

Predictor	DF	Sum Sq	Mean Sq	F value	p-value
Strategy_d2	1	48096	48096	106.75	< 0.000
Monthly Average Review Score (Avg_Review)	1	97710	97710	216.88	< 0.000
Cumulative Average Review Score (Cum_AvgR)	1	160728	160728	356.75	< 0.000
Total Number of Review (TotR)	1	4845	4845	10.75	0.001
Guest to Staff Ratio (GTS)	1	3755	3755	8.33	0.004
Tripadvisor	1	365	365	0.81	0.369
Affiliation	2	158874	79437	176.32	< 0.000
Residuals	884	398271	451		

Table 5. Analysis of Variance Table for Equation 4

Predictor	DF	Sum Sq	Mean Sq	F value	p-value
Strategy_d3	1	12848	12848	25.64	< 0.000
Monthly Average Review Score (Avg_Review)	1	38794	38794	77.12	< 0.000
Cumulative Average Review Score (Cum_AvgR)	1	77376	77376	154.41	< 0.000
Total Number of Review (TotR)	1	770	770	1.54	0.22
Guest to Staff Ratio (GTS)	1	9305	9305	18.57	< 0.000
Average Response Window (Avg_Window)	1	5461	5461	10.90	0.001
Tripadvisor	1	10	10	0.02	0.89
Affiliation	2	91831	45916	91.63	< 0.000
Residuals	574	287630	501		

2 Table 6. Analysis of Variance Table for Equation 5

4 5. Discussion

1

- 5 The introduction and use of online review systems engenders new phenomena and
- 6 changes the customers' information searching activities in the hospitality industry.
- 7 Hospitality operators utilize the systems to establish a communication channel with their
- 8 guests, current and prospective, in order to broadcast their customer-oriented strategies.
- 9 A hotel needs to invest more resources in order to monitor the online reviews more
- frequently, respond to the reviews in a timely manner and provide meaningful
- 11 communication instead of a standardized messaging. Thus, we focus on the question of
- 12 how profit-maximizing operators should respond to online customer comments. We
- contend that firms must develop a response capability that enables them to leverage the
- 14 nature of online review systems as a broadcast communication channel. In other words,
- those organizations that are able to implement optimal managerial response strategies
- 16 (i.e., to effectively use the online review system) will, on average, experience superior
- 17 competitive performance.
- Our results confirm and extend prior literature on the effect of online reviews. We find
- 19 support for the hypotheses that cumulative online review scores (H1a) and total number
- of reviews (H1b) are positively related to competitive firm performance. These results are
- 21 not surprising and are in line with extant theory suggesting that higher review ratings act
- as a product quality signal for customers and the number of reviews reinforces the trust
- 23 those customers have in the implicit recommendations of the online review systems

- 1 (Duan et al. 2008). Our work extends prior literature by using a direct measure of
- 2 competitive performance, rather than sales or intention to purchase. However, we treat
- 3 H1a and H1b as confirmatory and our focus is on controlling for these known effects
- 4 when focusing the analysis on managerial responses.
- 5 There is still a paucity of research that rigorously and empirically evaluates response
- 6 management strategies in online review systems (Abramova et al. 2015; Liu et al. 2015).
- 7 This is surprising since online review systems are widely used by customers and have the
- 8 potential to strongly impact firm performance. Thus, the consequences of the quantity
- 9 and quality of their use by organizations should be a foremost concern for tourism
- 10 management scholars.
- With respect to the quantity of system use in terms of managerial response (H2), we
- 12 report a strong positive effect of managerial response. In other words, there is a direct
- 13 correlation between the use of the online review systems to respond to customer
- comments and the competitive performance of the firm. It is important to note that this
- 15 effect is evident even after we control for measures of hotel service quality, measured as
- star ratings, guest-to-staff ratios, TripAdvisor ratings and chain affiliation. Thus, this
- 17 result is not simply a proxy of service quality, but rather an incremental effect of
- 18 responding to online reviews. The positive relationship between the quantity of
- managerial responses and competitive performance complements and extends finding
- 20 from previous research. Specifically, unlike previous empirical work on quantity of
- usage (Devaraj and Kholi 2003), our study focuses on an outward facing system used by
- 22 customers, rather than an internal system. We demonstrate the importance of system use
- 23 when the business process impacted is customer facing. We therefore lend support to the
- 24 notion that the system usage by the management impacts competitive performance not
- 25 only through improved efficiency in communication process, but also through the
- signaling strategies to broadcast the hotels' service commitment.
- 27 Our contribution extends beyond previous literature as we focus on quality of systems
- use, a construct that has received surprisingly little attention in the literature (Burton-
- 29 Jones and Grange 2012). We corroborate the notion that 'not all system use is created
- 30 equal' by showing that managerial responses to online reviews have disproportionate

- 1 effects depending on the rating of the review they address. In other words, across the
- 2 continuum of review ratings, investing resources in responding to reviews produces a
- 3 stronger impact on competitive performance as the rating of reviews tends toward the
- 4 negative end of the continuum.
- 5 The corollary to the above finding is the seemingly obvious realization that under
- 6 resource constraints a firm should ensure quality as well as quantity of the online review
- 7 system usage. Online review systems are an example of sociotechnical artefacts that the
- 8 firm is compelled to use by market forces. That is, due to the changing customer
- 9 information searching behavior, the hotel must devise an online review response strategy
- 10 to stay competitive in the market. Interestingly, these activities are to be performed using
- external systems that the firm did not build or purchase. In other words, hotel managers
- are forced into participation in these channels using systems they did not commission or
- approve (e.g., TripAdvisor). The functionalities of these applications are limited (e.g.,
- inability to delete reviews even when they are deemed inaccurate or false). To be sure,
- some operators choose not to develop such competencies and to ignore the systems.
- However, as our results suggest, this is itself a strategy, and one that leads to negative
- 17 results on average. From an academic standpoint, online reviews systems are an
- intriguing early example of customer service systems beyond the control of the
- organizations that the firm must adapt to in order to stay competitive. This is an area ripe
- 20 for future research. For example, organizations building new information systems
- 21 typically can act on both the system variables (e.g., IT functionalities) as well as
- organizational variables (e.g., employees' skills, reward systems). With this new class of
- 23 external systems, the first set is not available for information systems designers. For
- 24 example, when it comes to responding to TripAdvisor reviews the system does not allow
- 25 the ability to offer more than one response to each review. Thus, a hotel that wish to
- provide a response from the GM and the head housekeeper could not do so. Moreover,
- 27 there is no way for the staff to numerically rate the guest review, but only text is enabled
- as a response vehicle. How should hotel approach the development of digital
- 29 competences for systems they not control or willingly subscribe to? A firm that chooses
- 30 to engage with the community of users on an online review platform (i.e., does not adopt
- 31 the no response strategy) must adapt and use the systems to its advantage. We argue that

- a hotel must design a sociotechnical system usage strategy a strategy that marshals an
- 2 understanding of the optimal approach to deploying the sociotechnical artefact (e.g., the
- 3 online review system) given the firm's use objectives (e.g., maximization of revenue per
- 4 available room). We are not aware of any previous research that investigates this question
- 5 directly.
- 6 Our findings show that not having a response strategy (i.e., responding haphazardly to
- 7 customers' comments) is ineffectual even when the hotel invested some resources in
- 8 responding. This result may be a function of our residual approach to classification in the
- 9 no strategy category, which may have failed to identify a deliberate strategy that does not
- 10 fit in any of the full response, no response and strategic customer orientation categories.
- Another possible explanation, warranting further research, is that the management sends
- out a confusing signal without a clearly defined pattern of managerial response. As a
- result, the customers could not form an evaluative conclusion of the hotel's service and
- product quality, and the resources invested in monitoring and responding to online
- 15 reviews become a waste.
- 16 Similarly, having a strategy with some level of managerial response yields better
- performance than having a no response strategy assuming the hotels are aware of the
- response function and choose not to respond to any of the customers' comments. It
- 19 follows that the firm has no choice but to partake in the online review community. As a
- 20 consequence, it is imperative that the organization uses the systems effectively within the
- 21 constraints of the functionalities the system exposes and within the scope of accepted
- 22 usage practices established by the review system owner and the community of users. This
- 23 is a very different environment as compared to traditional organizational information
- 24 systems deployment comprising internal management of proprietary or licensed IT that is
- 25 fully within the control of the firm. We believe that this is an exciting area for future
- 26 research. Particularly in light of the increasing emergence of such external systems in
- areas spanning from customer interactions (e.g., social media) to platform participation
- 28 (e.g., app ecosystems) and cooperation with supply chain partners. Our work on
- 29 managerial response strategies in online review systems informs the larger theoretical
- 30 questions of how the firms improve their system use in the new context.

- Our results for quality of use show that any patterned response strategy is better than not
- 2 responding at all. The significant difference between no strategy and the two deliberate
- 3 approaches to managerial response we identify (i.e., full response and strategic customer
- 4 orientation) confirms the importance of quality of system usage. Finally, we evaluated the
- 5 comparative performance of firms adopting the two different approaches to managerial
- 6 response. In spite of a higher requirement of resource investment when using a full
- 7 response strategy, the firm's RevPAR Index is significantly lower as compared to hotels
- 8 with a strategic customer orientation strategy. To further understand the effect of positive
- 9 and negative online reviews we performed some follow-on analysis. We categorize the
- 10 hotels that adopt a strategic customer orientation approach into the following two types of
- 11 strategies²:
- Positive reinforcement strategy (PRS): the hotel responds only to positive comments
- in an effort to highlight the positive aspects of its product or service for perspective
- guests doing online research
- Reassurance strategy (RS): the hotel responds only to negative comments in order to
- signal to future online review readers its concern for customers' wellbeing and to
- 17 clarify any misunderstandings that lead to a negative customer comment.

- We created a dummy variable called *Strategy_d4*, where -1 indicates the hotels with a
- 20 positive reinforcement strategy and 1 indicates the hotels with a reassurance strategy and
- 21 conduct an ANCOVA (Equation 6) to evaluate the significant differences between the
- two strategies.

23

² There are only 5 hotel-month observations with managerial response to both positive and negatives reviews (i.e., responding to all of the extreme reviews). Therefore, we exclude them in the extra analysis.

1 RevPARIndex_{ij} =
$$\mu + Strategy_d4_i$$
 (Equation 6)
2 $+ \beta_1 \times (Avg_Review_{ij})$
3 $+ \beta_2 \times (Cum_AvgR_{ij})$
4 $+ \beta_3 \times (Avg_Window_{ij})$
5 $+ \beta_4 \times (TotR_{ij})$
6 $+ \beta_5 \times (GuestToStaff_{ij})$
7 $+ \beta_6 \times (Tripadvisor_{ij})$
8 $+ \beta_7 \times (Affliation_{ij})$
9 $+ \epsilon_{ij}$

The result of ANCOVA in Table 7 show that the reassurance strategy emerges as
distinctly superior to the positive reinforcement strategy in online review systems. Note
that, because of the J-shaped distribution that characterizes online reviews, the number of
negative reviews for a typical product or firm is low relative to the total. Therefore,
reassurance is not only the approach with the greatest positive impact, but it is also the

16 most efficient from a resource allocation standpoint.

Predictor	DF	Sum Sq	Mean Sq	F value	p-value
Strategy_d4	1	5308	5308.1	5.23	0.02
Monthly Average Review Score (Avg_Review)	1	4299	4298.7	4.24	0.04
Cumulative Average Review Score (Cum_AvgR)	1	22144	22144	21.82	< 0.001
Total Number of Review (TotR)	1	3071	3071.3	3.03	0.09
Guest to Staff Ratio (GTS)	1	2982	2982.4	2.94	0.09
Average Response Window (Avg_Window)	1	0	0	0.00	0.99
Tripadvisor	1	607	606.8	0.60	0.44
Affiliation	2	17109	8554.5	8.43	< 0.001
Residuals	77	78156	1015.0		

Table 7. Analysis of Variance Table

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1 We believe our work can be extended along two dimensions: analytical and theoretical. 2 From an analysis standpoint, we operationalize quality of system usage as response 3 strategy and we measure it by way of the pattern of managerial responses. This is just one 4 dimension of system usage quality in the context of online review systems. While some 5 hospitality literature investigates the text in the managerial responses in an experimental 6 setting (Lee and Song 2010, Treviño and Castaño 2013), it is likely an important factor 7 affecting firm competitive performance as well, and it is certainly a driver of resource 8 allocation. In other words, while it is true that negative reviews are generally few, they 9 are longer and more articulated (Piccoli and Ott 2014). In practice, firms utilize different 10 service recovery responses. Some firms apologize for the issues in the response publicly 11 but prefer to follow up the service recovery with the customers via a private channel (e.g., 12 phone call, or private message in the review system). Others not only apologize for the 13 issues but also broadcast to all users the corrective actions they have taken. Moreover, 14 some managerial response strategies carefully address the issues raised in the online 15

review, while others provide standard responses drawn from a fixed set of templates. One

between the customer review and the managerial response (Piccoli 2016). Such measure

would improve the precision of our quality of use measure by augmenting the pattern of

response with a measure of the information quality of the individual responses (Kettinger

et al. 2013). Another approach is to use algorithms to group responses based on their

content (e.g., a trained classifier) instead of rating of the review they reply to.

possible approach to the investigation of the response content is to use text-mining

techniques (e.g., topic modelling) to compute a measure of breadth and congruence

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6. **Limitations and Conclusions**

25 As with any study using an archival research methodology, we acknowledge some 26 limitations. While we observe the correlation between quantity and quality of online 27 review system usage and hotel performance, we cannot establish a conclusive causal 28 relationship. We seek to limit the impact of this limitation by controlling for product 29 quality and tease out the effect of managerial response. In addition, due to the exploratory 30 nature of the study, we categorize the quality of system usage (in terms of managerial

- 1 response) into four different strategies based on the empirical data and previous literature.
- While our categories are sensible with respect to practice, there is a need for a theoretical
- 3 framework for guiding future research. Despite the above limitations, we believe our
- 4 work uncovers an interesting pattern of results that points to the importance of research
- 5 on quality of online review system use at the property level. Moreover, as the first
- 6 empirical work focused on the competitive effect of managerial response strategies to
- 7 online reviews, we hope that our effort spurs future research in this important area. As
- 8 customer service interactions are increasingly mediated by digital technology, the ability
- 9 to foster high quality system usage by employees will become a critical competitive lever
- 10 for hospitality operators.

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