## City Research Online

## City, University of London Institutional Repository

Citation: Park, S., Yin, Y. \& Son, B.G. (2018). Understanding of online hotel booking process: A multiple method approach. Journal of Vacation Marketing, doi: 10.1177/1356766718778879

This is the accepted version of the paper.
This version of the publication may differ from the final published version.

Permanent repository link: http://openaccess.city.ac.uk/20143/
Link to published version: http://dx.doi.org/10.1177/1356766718778879

Copyright and reuse: City Research Online aims to make research outputs of City, University of London available to a wider audience. Copyright and Moral Rights remain with the author(s) and/or copyright holders. URLs from City Research Online may be freely distributed and linked to.

[^0]
# Understanding Online Hotel Booking Process: 

## A Multiple Method Approach


#### Abstract

With the development of information technology, online travel agency has become an important information and communication source in the hospitality industry. The previous studies assessing the online hotel decision making behaviors, however, mainly focused on behavioral intentions as well as identifying factors that directly influence the transactional behaviors, which rely on a static approach rather than employing the holistic viewpoints. Thus, this research adopted the choice-set model as a theoretical lens to explore online hotel booking behaviors by using multiple methods (i.e., observation and survey methods). The findings of this research shed light on the dynamic patterns of online hotel decision making process and identify important factors (i.e., internal and external information sources) across sequential stages of the choice-set model. Therefore, this research provides useful implications to online hospitality marketers.


Keywords: Online travel agency, information search behaviour, online hotel decision making process, choice-set model, multi-methods

## 1 Introduction

Understanding consumers' decision making behaviours for travel products has become a critical issue for not only academics but also for practitioners (Yavas and Babakus, 2003). The constant development of information technology, in particular, has evolved the way travel services are purchased (Llach et al., 2013). For example, the advent of an online travel agency (OTA) has contributed substantially to reducing information asymmetry between consumers and service providers by offering not only useful and up-to-date information but also price transparency to travellers (Toh et al., 2011). Indeed, OTA sales in the Asia Pacific region has been largely grown by $43 \%$ in 2015 to reach $\$ 79$ billion. The sales in North America and Western Europe recorded $11 \%$ and $9 \%$ growth, respectively in the focal years (Skift, 2016)

In this vein, a number of researchers in the field of hospitality have examined the online hotel booking behaviours in three different aspects: 1) channel characteristics (Amaro and Duarte, 2013), 2) online information characteristics (i.e., contents and types of information offered to consumers) (Steinbauer and Werthner, 2007) and 3) consumer characteristics (i.e., demographics, brand knowledge, familiarity, and loyalty) (Law, 2009). However, most of the previous studies mainly focused on behavioural intentions that rely on a static approach rather than employing the holistic viewpoints. That is, rather than analysing consumers' perceptions mostly using the survey method based upon the recall of their past service experiences, it is essential to understand the entire online booking process by analysing actual behavioural data.

In order to address this gap, this study adopted a choice-set model as a theoretical lens to investigate online purchasing behaviour that is an important task in the travel planning (Park et al., 2011). The choice-set model explains the sequential steps of the decision-making process along with rational (or utilitarian) decision makers (Mansfeld, 1992). That is,
consumers go through the consecutive steps comprising multiple decision sets (i.e., awareness set, consideration set, and action set) to make a final decision, being influenced by the internal, such as personal experiences and knowledge, and external factors, including information obtained from external sources during the process to accomplish the task (Sirakaya and Woodside, 2005).

The choice-set model has been mostly applied to understand the traveller's destination choices, based on a statement: "It is now a truism of marketing that brand awareness is a necessary precondition for choice" (Nedungadi, 1990, p. 264). Nevertheless, the authors of this research argue that it may not always be applicable in the online hotel decision making process along with the advancement of OTAs. While consumers have limited knowledge about hotels in specific destinations, they would be able to easily search for relevant information about available hotels and seek out other alternatives using online travel sources (e.g., search engines and intelligent agents) (Peterson and Merino, 2003). As a result, the online hotel decision-making behaviour is such a dynamic process that encompasses various strategies (Decrop and Snelders, 2005). However, to date, there is a limited research analysing the actual consumer choices, and they have restrictions to accomplish a comprehensive theoretical approach to explaining the online hotel booking process (Chiang and Jang, 2007). In this similar vein, Lockyer (2005) stated that the traditional choice-set model mainly focused on proposing typology rather than assessing the process, and thus, the acceptance and rejection process is not described exhaustively. Therefore, the focus of this research it to shed some light on how consumers decide online travel purchasing behaviours, and identifies factors that affect each stage of the sequential process using multiple methods (observation and survey methods), allowing researchers to estimate perceptual and behavioural aspects, respectively.

## 2 Literature review

### 2.1 Choice-set model in hospitality and tourism research

Various theories and conceptual models have been proposed to explain travel decisionmaking behaviours: yet, there is no unifying theory to fully account for the process (Hung and Petrick, 2012; Sirakaya and Woodside, 2005). Among them, one particular theoretical framework, "the choice set model," has been frequently used to understand a destination choice (Decrop, 2000; Sirakaya and Woodside, 2004). Consumer purchasing behaviour of travel products is a complex process that requires extensive decision-making strategy due to high cost and involvement (Sirakaya and Woodside, 2005). In this circumstance, the choice set model that explains how individuals make purchase decisions when confronting a wide range of alternatives is a suitable approach to explaining high risk purchasing behaviours (Crompton and Ankomah, 1993; Jones and Chen, 2011; Teare, 1998).

The choice set model is derived from information processing theory, which suggests that travellers go through a sequence of stages when deciding a final choice to purchase (Hung and Petrick, 2012; Salisbury and Feinberg, 2012). In particular, a traveller follows three stages of consecutive and a funnel-like procedure comprising awareness set, consideration set, and a final choice (Crompton and Ankomah, 1993; Jansen and Schuster, 2011; Sirakaya and Woodside, 2005). The first stage is awareness set referring to all products that people have beliefs and experiences/knowledge about. The number of such products in awareness set (e.g., accommodations) would be vast: hence, the second stage (i.e., consideration set) becomes critical. The following stage is the consideration set, which includes the products that a traveller is considering for purchasing within some period of time (Crompton, 1992).

This stage consists of "initial consideration set" and "late consideration set," and that the latter contains smaller number of alternatives. Then, a traveller makes an active effort in the information search to make a final decision. Due to the hierarchical notion of choice set model, this theory has been applied to explain information search behaviours (Vermeulen and Seegers, 2009), travel planning (Mutinda and Mayaka, 2012), and destination image formation (Baloglu and McCleary, 1999).

Importantly, it can be argued that consumers do not always show homogenous sequential steps to reach their final decisions. Solomon et al., (2006) suggested under a certain condition, e.g., a low risk purchase, consumers are not constantly engaged in a high level of information search nor rigorous evaluation of alternatives, but use simple decision rules to make a decision. Also, when consumers possess low ability and motivation, they are likely to rely on heuristic cues (Yoon et al., 2009). Similarly, Payne et al., (1993) stated that under a certain circumstance a consumer is likely to conduct non-compensatory strategy which avoids trade-offs among values and typically reduces demands for informational processing. Moreover, when consumers are engaged in routine purchase (Snepenger and Snepenger, 1993) or have high brand loyalty (Petrick et al., 2007), they tend not to behave in the manner the choice set model suggested.

In this similar vein, the typical choice-set model focusing on typology rather than the process lacks understandings of the acceptance and rejection process in an inclusive way (Lockyer, 2005). To address this gap, we seek to investigate (1) the types/patterns of online travel decision process, and (2) influential factors on developing each set of the choice-set model by using multi-methods that allows researchers to obtain actual behavioural as well as cognitive understandings.

### 2.2 Online decision making process for hospitality products

A number of researchers in hospitality have endeavoured to identify factors affecting the online hotel decisions from three main perspectives, including (1) channel characteristics, (2) website features (i.e., types and contents of information on the websites), and (3) individual characteristics (see Amaro and Duarte, 2013; Dolnicar and Otter, 2003; Peng et al., 2013).

A number of theoretical lenses have been used to understand the usage experiences of online sources. Based upon Theory of Planned Behaviour (TPB), consumers' decision making is influenced by attitudes engendered from their beliefs to the online information sources (Shim et al., 2001), such as security and/or trust of the online service providers (e.g., OTAs, online destination marketers, and hoteliers) (Kim et al., 2005). Technology Adoption Model (TAM), which suggests two key elements such as ease of use and usefulness, is another well-recognised theory to explain the usage of new technology in the online travel booking process (Morosan and Jeong, 2008). In particular, usability of channels such as navigation, convenience, time saving, easy to price comparisons, and appearance is the crucial driver of online purchasing decisions (Morosan and Jeong, 2008).

Another stream of studies is related to website features especially related to the types and the contents of information on the websites (Peng et al., 2013). Consumers are more likely to purchase travel products in the websites that offer sufficient information, enabling them to evaluate the quality of the products (Dolnicar and Otter, 2003). Indeed, people generally accompany two different phases to fulfil when searching for information: utilitarian and hedonic considerations (Dhar and Wertenbroch, 2000). They play independent roles in evaluating products and forming attitudes toward products, and in turn allow consumers to distinguish between alternatives according to utilitarian and hedonic features (Mano and Oliver, 1993). In this vein, the information environment is organised by two formats of information presentation: verbal and pictorial information (Childers and Houston, 1984). Textual information basically helps to meet utilitarian information needs whereas pictorial
information allows for realizing hedonic needs (Lee and Tussyadiah, 2010). That is, verbal source enables consumers to have detailed information for the advantages and disadvantages of the products, and in turn, decide the final choice maximizing the utility. On the other hand, visual information facilitates capturing consumers' attentions and processing information (relatively in a quick way). Accordingly, those two formats of information influence online hotel choice in interactive ways (Pan et al., 2013).

Lastly, there have been a number of studies assessing the influences of individual characteristics on online purchasing behaviours for the hospitality products, such as demographics, product knowledge, online experiences, personality, and shopping orientations (Amaro and Duarte, 2013; Park et al., 2011). Among them, personal experiences (or familiarity) and knowledge reflecting the individual differences have been concerned as main determinants of the online decision-making process (Kim and Kim, 2004). Product familiarity induces the high level of confidence and guides the consumers' attention toward the specific brands. Knowledge on travel product influences the degree to which people are involved in information search process, and specific contents of information individuals look for online (Lehto et al., 2006; Lin and Chen, 2006; Park and Kim, 2010).

It is important to note that while a substantial amount of research has been analysed to understand the online travel decision-making process, those studies mainly emphasise the likelihood to purchase the products instead of investigating the actual behaviours. The general recognition of consumer studies pointed out the discrepancy between consumer intentions and actual choices (March and Woodside, 2005). More importantly, it is critical to assess heterogeneous roles of factors that have different influences on different stages of the sequential process until reaching a final choice (Um and Crompton, 1992).

## 3 Methodology

### 3.1 Data collection

This research employed multi-methods - observation and survey approaches. Observation method allows researchers to obtain actual online behavioural data, and the survey method enables us to gain cognitive responses during the online hotel decision making process (e.g., Hausman, 2000). Multi-method research refers to "a study in which the researcher collects, analyses and mixes multiple forms of either qualitative or quantitative data" (Creswell, 2011). The main benefits of the multi-method design are strengthening the findings through triangulation and complementing the weaknesses of the single research method.

The observation method has been used as a common method in behavioural psychology, which entails observation of a subject's online information searching behaviours (Zechmeister et al., 2009). An approach, observation without intervention, has been applied, which obtain how subjects naturally behave in a given setting. This method verifies external validity that allow researchers to observe the flow of behaviours in its own setting studies (Olshavsky and Granbois, 1979). Along with nature of choice-set model as a theoretical lens in this research, observation method is a suitable to investigate consumer behaviours in the entire stages of decision making process.

More specifically, the subjects were asked to book an accommodation in Paris using an online travel website, www.booking.com as one of main travel products (Morosan and Jeong, 2008). The reason why www.booking.com was selected in this study is that it is one of the largest global OTAs (Economist, 2014) offering over 1 million hotels and accommodations in 227 countries ranging from small independents to five-star luxury hotels globally (Booking.com, 2016). Also, from the user perspective, it is a user-friendly OTA website so that travellers can easily access and engage in searching for hotel information via a familiar
technology, and that these advantages lead the company to acquiring the largest market share in Europe (King, 2014).

Paris was selected as a destination in this research because the place has a wide range of properties, which meets the needs of different travellers. According to Paris Tourist Bureau, there are 1,564 approved hotels offering 81,431 rooms in Paris (Paris Tourist Office, 2012) as well as other types of accommodations, such as apartment rentals and bed and breakfast (Convention and Visitors Bureau, 2013). The variety of accommodation implies consumers need to consider huge amount information and alternatives which make it as an ideal test ground to address the purposes of this research.

The subjects were invited from two universities located in South East of England and London through campus-wide flyers, inviting students and staff. As a result, the total number of subjects who participated in the data collection was forty four. A researcher individually contacted each subject and conducted in the places of the respondents' preferences to ensure the setting is convenient for them and similar to their daily lives. Each participant was given a brief introduction about the research objectives with a guideline to complete the entire datacollection procedures so that all the data was collected under a consistent setting. As a first step, the subjects were asked to fill out the survey questions about demographic characteristics, Internet usage, and past travel experiences. Then, each respondent was asked to plan an imaginary week-long holiday during the winter to visit Paris. They were instructed to make a hotel decision for the trip via www.booking.com. All the hotels in their budget ranged from low end to luxury hotels and would be of low occupancy due to the advanced reservation. Meanwhile to maximise the observation accuracy, the screen capturing software (i.e., video-taping), CamStudio, was used to record the entire behavioural processes of the participants.

During the study, it was critical to discern 'consideration set.' As such, the respondents were instructed to form an initial consideration set (e.g., Crompton and Ankomah, 1993) by adding the hotels, which they were interested in and willing to search more information about, into 'the wish list' on booking.com. Once the respondents compared the hotels included in the 'wish list' and reduced the alternatives into smaller numbers, the remaining hotels were regarded as the 'late consideration set' (or evoked set) following the definition proposed by Crompton (1992). These activities helped researchers notice the consideration sets and investigate online information search behaviours across different stages of choice-set models (Pan and Fesenmaier, 2006). During the duration of the study, a researcher sat in certain distance without any intervention.

In fact, video recording of booking behaviours is sufficient to obtain behavioural data, but somewhat limited in measuring the relative influences of information acquired during the decision-making process. Next, the subjects were requested to fill out a survey to indicate their online experiences right after finishing the given task study. Specifically, the respondents were asked using a five-point Likert scale to indicate the perceived influences of past experience visiting Paris, hotel brand familiarity and loyalty (Gursoy and McCleary, 2004), and all types of the information exposed on booking.com, such as (1) the types of information: hotel description, hotel images, consumer reviews, consumer and hotel ratings, and (2) the contents of information: facility, price, and location of the hotels (Park et al., 2013; Park and Kim, 2010) (see Table 1).
[Please insert Table 1 here]

### 3.2 Data analysis

A series of data analysis were conducted to assess two forms of data collected from the observation and the survey methods. To analyse data from the observation study, a general
decision-making protocol was developed for every subject based upon the video data files, including time spent, behaviours, and description of the behaviours (Hodkinson et al., 2000) (see Table 2).
[Please insert Table 2 here]

The protocol approach includes various advantages allowing researchers to gain details of the rules in consumer behaviour. That is, the protocol method is beneficial in developing a model of processes gone through by consumers in making a choice (Bettman, 1977) so as to express decision nets that specify the particular rules to be applied in judging alternatives.

The online decision making graph of each subject was, then, generated from the protocols. The decision-making graph facilitated the researchers to comprehend the structures of online booking behaviours by the types and the orders of external information sources researched by each traveller across the phases of the hierarchical decision-making process. In particular, we focused on three key aspects of online behaviours by analysing the mouseclicks and cursor movements (Berger et al., 2012), and these are: (1) the types of filter function to reduce number of alternatives, (2) the types of sort functions to arrange the lists of the hotels, and (3) the types and contents of information consumers emphasised. The mousecursor movements infer the user's intent on the websites and can be used to evaluate interface design, since in over $75 \%$ of chances, a mouse saccade move to a meaningful region and the eye gaze is very close to the mouse cursor (Chen et al., 2001).

Two researchers performed separate coding of the same video clips independently, which was followed by cross-comparisons so as to ensure inter-coder reliability of the outcomes. Then, the researchers independently attempted to identify typologies of the online decisionmaking process whereby the subjects who showed similar patterns of choice-set behaviours
were classified, and the attributes taken into account in forming each stage of the process were illuminated. As a final step of the analysis, the researchers repeated the above in order to recognise the subjects' inclusive decision-making styles, and the types and contents of information the subjects considered. In addition to understanding the actual behaviours, data obtained from questionnaires were analysed to identify the extent to which internal and external information sources have influences on forming the sequential stages of online booking behaviours.

## 4 Results

### 4.1 Respondent profile

$56 \%$ of subjects were female, and the average age was 30.35 with 10.46 of standard deviation. The respondents in the current study were highly educated: $27.3 \%$ with undergraduate and $72.7 \%$ with postgraduate level degrees. Approximately half of the subjects have stayed in hotels located in Paris. In terms of online booking experience, the participants indicated moderate levels of online experiences.

### 4.2 Categorisation of online hotel decision-making patterns

The results of this study revealed three different patterns of the online hotel decisionmaking process, naming arbitrary decision makers (Group 1), standard decision makers (Group 2), and comprehensive decision makers (Group 3). More specifically, 8 respondents (18\%) were categorised as arbitrary decision makers who directly reached the final decision from the total available set (see Figure 1). About $66 \%$ of the respondents were classified as standard decision makers that went through the total and consideration set to reach the final hotel decision (see Figure 2). The last group comprised $16 \%$ of participants (7), who appeared to use a more sophisticated process in decision making (by using initial and later
consideration sets), were classified as comprehensive decision makers (see Figure 3). That is, usage of 'wish list' function reflecting the formation of consideration sets on the choice-set model was considered to discern the travellers between arbitrary and standard decision makers. Among those who used the 'wish list' function, the subjects repeatedly accessing 'wish list' for the multiple formation of consideration sets were regarded as comprehensive decision makers. To test the objectivity, reproducibility, and reliability of the quantification of online purchasing classifications, an inter-coder reliability was performed. The result was 0.82 using the online software ReCal, which is over cut-off points (Krippendorff, 1980).

Given the classification of online travel decision-making behaviours, individual factors such as demographic, prior knowledge, the Internet usage, and online booking experiences were compared to understand the different natures of those online travel groups classified (see Table II). The travellers in Group 1 (the arbitrary decision maker) likely to be male and younger with lower annual incomes than ones in Group 2 (the standard decision maker) and Group 3 (the comprehensive decision maker). The arbitrary decision makers were likely to possess higher levels of knowledge about the travel destination and online booking experiences than the standard decision makers and the comprehensive decision makers in the same lines with Park and Stoel (2005). In regard to the length of time spent in the online booking process, as expected, the comprehensive decision makers spent more time (17 minutes on average) than the standard decision makers (8 minutes 37 seconds on average) and the arbitrary decision makers (4 minutes and 54 seconds on average). These findings imply that the different patterns of online booking behaviours across the groups reflect the individual differences in demographics as well as the personal knowledge and online channel experiences that are consistent argument with previous tourism studies (e.g., Park et al., 2011) (see Table 3).

### 4.3 Understanding online hotel booking behaviours

## Arbitrary decision makers (Group 1)

The analyses of the navigation graphs of 8 participants suggested that all the travellers in this group used either a 'sort' or 'filter' function to reduce the number of hotel choices to consider. In terms of the sort function, the travellers sorted the hotels using mostly the 'recommendations,' which was given by the online travel agency ( $38 \%$ ). For the usage of the filter function, $75 \%$ of respondents used 'price,' followed by review scores (25\%), location, hotel type, and star rating (13\%) as a criterion. This suggests that online travellers, who belong to the cohort of arbitrary decision makers, were concerned largely about prices of travel products during their decision making. It was also in line with the findings from the analysis of mouse movements. When the participants searched for hotel information in details, the majority of them paid significant attention to price information (88.0\%). Also, consistent to the notion of a heuristic decision maker, they were more likely to focus on hotel images (i.e., heuristic cue) ( $88.0 \%$ ) than textual types of information (i.e., rational cue) (38.0\%) (see Figure 1).
[Please insert Figure 1 here]

The results of the survey analysis reveal the extent to which individual factors (i.e., past experience in staying in the hotel, brand familiarity, and loyalty) and information on the websites (i.e., the type and content of information) influence the online decision process. Personal characteristics such as past experiences, brand familiarity and loyalty did not seem to be important as much as information-related factors: for instance, consumer reviews,
review scores, and hotel images. Consistent with the findings of the observation method, the online travellers responded that information content about room rates was more influential than hotel location to make the final decision.

## Standard decision makers (Group 2)

The online booking process for standard decision makers consisted of two different stages: (1) from total set to consideration set (i.e., Stage 1a) and (2) from consideration set to final decision (Stage 2a) (see Figure 2). The results showed that all the 29 respondents used either sort or filter functions to initially dispose the hotels by their preferences. During the process of forming a consideration set, the majority of the standard decision makers (86\%) used the filter function by price, which was similar to the arbitrary decision makers. However, the travellers did not actively exploit sort functions: for example, only around $38 \%$ of people sorted the hotel by the consumer review scores. When it comes to investigating specific content and type of information concerned, the standard decision makers were more involved in information about price (69\%) and hotel images (79\%) than hotel location (28\%) and hotel descriptions (34\%) when forming the consideration set.

Given the establishment of a consideration set (i.e., hotels included in a 'wish list'), the information search process to make a final decision was analysed. Online travellers were likely to search for additional information by comparing specific attributes relevant to the hotels rather than using other sorting and filtering functions. Similar with the formation of a consideration set, the subjects paid considerable attention to hotel price (62\%) and visual types of information (62\%).
[Please insert Figure 2 here]

While the individual factors, such as past experience, brand familiarity, and loyalty, were not notably important when deciding hotels online (on average below 3.0), the elements related to information acquired from the online travel agency were essential in passing through stages of the choice-set model. In terms of the types of information, consumer reviews scores were perceived as the most important source, followed by hotel images and descriptive (textual) information about hotels in Stage 1a.

On the other hand, the information search behaviours in Stage 2a showed the different patterns with ones shown in Stage 1a. For example, while the consumer star ratings were perceived as a key factor in forming a consideration set (Stage 1a), the information became the second least important in the process of making a final decision. In the same vein, the consumer reviews placed one of the least important factors in developing a consideration set, whereas it was regarded as the most influential factor at the phase of making a final choice. With regard to information contents, the travellers indicated that hotel location was more important than room price in Stage 1a, but in Stage 2a, room price was more important than hotel location.

## Comprehensive decision makers (Group 3)

Interestingly, the comprehensive decision makers showed quite different information search behaviours with the standard decision makers in forming consideration sets (i.e., initial and late sets) (see Figure 3). Specifically, when developing the initial consideration sets, the travellers in the group of comprehensive decision makers actively used sorting tools using categories such as 'review scores' (86\%) and 'recommendations' by the online agency ( $14 \%$ ), while it was not common in other decision making types. Besides, over $85 \%$ of the travellers disposed the lists of hotels based upon facilities (mainly the existence of Wifi), which was not observed in other two groups. This finding implies that the comprehensive
decision makers were more likely to deliberate the types of services on offer, whereas other types of decision makers were largely concerned with room prices.

It is revealed that most comprehensive decision makers checked information about both price and location in forming initial (Stage 1b) and late consideration (Stage 2b) sets (see Figure 2). Interestingly, however, when it comes to a final choice, the travellers showed different decision-making behaviours. About $71 \%$ of them considered 'consumer reviews' to make a final hotel decision (Stage 3b) while it was the least concerned in Stage 1b and 2b.

## [Please insert Figure 3 here]

The survey results show that as Um and Crompton (1992) suggested, while individual factors were somewhat notable in organising the consideration set, these factors were not substantially important when deciding a final choice. All the comprehensive decision makers indicated 'review ratings' as the most important factor in Stage 1b and 2b, followed by 'hotel images' and 'descriptive information about hotels'. As expected, the different pattern of information search used to make a final choice was identified: for example, consumer reviews were recognised as the most influential source, which was the least important factor in the formation of a consideration set. In terms of information contents, the comprehensive decision makers perceived that hotel location is more important than room price in both constructing a consideration set and selecting the final choice.

## 5 Discussion and conclusion

OTAs play a critical role in distribution of travel products by building an effective link between service providers and consumers (Pan et al., 2011). It enables travellers to search information, share their experiences, and purchase travel products via the uniformed
platform. For travel service providers, OTAs facilitate for them the ability to reach potential customers around the globe at an unprecedented scale. As a result, OTA becomes one of the most dominant intermediaries in the tourism market. While past research has significantly enhanced an understanding of online hotel purchasing behaviours, most of these studies assessed behavioural intentions relying on a static approach (Chiang and Jang, 2006). In order to address this gap, this research observed actual decision-making behaviours of travellers in an entire process, allowing for elucidate their dynamics in online hotel booking behaviours in regard to choice-set model as an underlying theory. Also, the pre- and postsurvey methods allowed to understand cognitive behaviours by identifying the influential factors on each stage of the sequential decision process.

To our knowledge, it is the first empirical research that employed a behavioural theory as well as used multi-methods to shed light on aspects of behaviours and perceptions in online hotel booking process. Therefore, this study helps to advance the understanding on how consumers make hotel purchasing decisions online with providing several theoretical contributions.

First, this research identified three distinctive patterns of online hotel-decision process by looking into Internet information search behaviours, and those are: 1) arbitrary, 2) standard, and 3) comprehensive decision makers. Our findings also suggested that consumers from different groups exhibited different demographics, Internet experiences, and levels of prior knowledge of the destination. This results broadly place in line with the previous hospitality research (e.g., Amaro and Duarte, 2010; Park et al., 2011), suggesting that the way a traveller behaves online reflects the different natures of traveller characteristics.

Second, our results suggested that the factors affecting formation of each stage of the online decision process were heterogeneous. For example, using filter function of price, facility, and location was commonly observed among the travellers during the process of
forming consideration set(s). When it comes to final decision making, price- and locationrelated information were the most sought after for all groups of travellers. These findings are in line with the concept of the adaptive decision maker suggested by Payne et al., (1993), that is, people apply comprehensive decision-making strategy when the size of alternative set (referring to consideration set) is enough for them to estimate by the decision maker's information processing capacity (Einhorn and Hogarth, 1981). Interestingly, the information search and acquisition behaviours also varied across different stages of the choice-set model. For example, review score and hotel images were the most sought after type of information by all travellers during the process of consideration set(s) formation. However, for final decision making, the information need varied across the different types of travellers. These findings address the dynamics of online travel decision making behaviours.

Another important finding is that the internal information sources (e.g., past experience, knowledge, or brand loyalty) did not seem to be important as much as information-related (external) factors. Peterson and Merino (2003) suggested that as intelligent agents become more sophisticated and their use increases, the importance of brand-level information (or brand knowledge) is likely to decline.

With regard to practical implications, these findings can be important for OTAs in the following ways. As Chaing and Jang (2006) suggested, a deeper insight into travel product choice from online dynamics is greatly important and useful to service providers, particularly for OTAs. For example, OTAs could provide a tailor-made approach in the development of interface design for different types of travellers. For arbitrary decision-maker types (could be identified by demographics provided), streamlined online interfaces could be made to suit their fast-paced decision making nature, while more tools, such as a wish-list or comparison feature, could be provided or made to appear more prominent on online interfaces to comprehensive decision makers, to aid them to form their consideration sets more efficiently.

Also, our findings would enable OTAs to provide better and more targeted information to their customers. For example, OTAs could make review-related information more prominent in interfaces to comprehensive decision-maker types and in certain phases of the decision process, in order to aid their decision making. As a result, the typology this study proposed could be used for online tourism managers when executing a customized marketing strategy by understanding the heterogeneous information needs.

This study makes an important contribution but does have some limitations that future study could be addressed in further studies. Using observation study explicating actual behaviours rather than intention is one of the unique merits of this study, however, it does pose some drawbacks. The issue is that the subjects of this research are either students or staffs working for higher education institutions. Future research extending the scope as well as the size of the sample is recommended, so as to enhance the generalizability of the findings.

## Reference

Amaro S and Duarte P (2013) Online travel purchasing: A literature review. Journal of Travel and Tourism Marketing 30(8): 755-785.
Baloglu S and McCleary KW (1999) A model of destination image formation. Annals of Tourism Research 26(4): 868-897.
Bettman J R (1977) Data Collection and Analysis Aroaches For Studying Consumer Information Processing in NA - Advances in Consumer Research ume 04 eds William D Perreault Jr Atlanta GA : Association for Consumer Research 342-348.
Berger S Wagner U and Schwand C (2012) Assessing advertising effectiveness: The potential of goal-directed behaviour. Psychology and Marketing 29(6): 411-421.
Booking.com (2016) Media Release One Million Properties https://newsbookingcom/one-million-properties/ - 05August2016
Chen M-C Anderson JR and Sohn M-H (2001) What can a mouse cursor tell us more? Correlation of eye/mouse movements on web browsing In Proceedings of the Conference on Human Factors in Computing Systems
Chiang CF and Jang SS (2007) The effects of perceived price and brand image on value and purchase intention: Leisure travelers' attitudes toward online hotel booking. Journal of Hospitality and Leisure Marketing 15(3): 49-69.
Childers TL and Houston M J (1984) Conditions for a picture-superiority effect on consumer memory. Journal of Consumer Research 11(2): 643-654.
Convention and Visitors Bureau (2013) ParisInfo http://enparisinfocom/ - 14 July 2013
Creswell, JW. (2011) Controversies in mixed methods research. The Sage handbook of qualitative research 4: 269-284.
Crompton J (1992) Structure of vacation destination choice sets. Annals of Tourism Research 19(3): 420-434.
Crompton JL and Ankomah PK (1993) Choice set propositions in destination decisions. Annals of Tourism Research 20(3): 461-476.
Decrop A and Snelders D (2005) A grounded typology of vacation decision-making. Tourism Management 26(2): 121-132.
Dhar R and Wertenbroch K (2000) Consumer choice between hedonic and utilitarian goods. Journal of Marketing Research 37(1): 60-71.
Dolnicar S and Otter T (2003) Which Hotel Attributes Matter? A Review of Previous and a Framework for Future Research in Griffin T and Harris R (eds) Proceedings of the 9th APTA University of Technology Sydney 176-188.
Einhorn HJ and Hogarth RM (1981) Behavioral decision theory: Processes of judgment and Choice. Journal of Accounting Research 19(1): 1-31.
Gursoy D and McCleary KW (2004) An integrative model of tourists' information search behaviour. Annals of Tourism Research 31(2): 353-373.
Hausman A (2000) A multi-method investigation of consumer motivations in impulse buying behaviour. Journal of Consumer Marketing 17(5): 403-419.
Hung K and Petrick JF (2012) Testing the effects of congruity travel constraints and self-efficacy on travel intentions: An alternative decision-making model. Tourism Management 33(4): 855-867.
Hodkinson C Kiel G and McColl-Kennedy J (2000) Consumer Web Search Behaviour: Diagrammatic Illustration of Wayfinding on the Web. International Journal of Human Computer Studies 52(5): 805-830.
Jansen BJ and Schuster S (2011) Bidding on the buying funnel for sponsored search and keyword advertising. Journal of Electronic Commerce Research 12(1): 1-18.
Jones P and Chen MM (2011) Factors determining hotel selection: Online behaviour by
leisure travellers. Tourism and Hospitality Research 11(1): 83-95.
Kim LH Kim DJ and Leong JK (2005) The effect of perceived risk on purchase intention in purchasing airline tickets online. Journal of Hospitality and Leisure Marketing 13(2): 33-53.
Kim WG and Kim DJ (2004) Factors affecting online hotel reservation intention between online and non-online customers. International Journal of Hospitality Management 23(4): 381-395.
King D (2014) PhoCusWright: Online travel spending on the rise in Europe available at: TravelWeekly http://wwwtravelweeklycom/Europe-Travel/Online-travel-spending_ on-the-rise-in-Europe/ (10 December 2016)
Krippendorff K (1980) Content Analysis: An introduction to its Methodology Sage Publications Beverly Hill.
Law R (2009) Disintermediation of hotel reservations: The perception of different groups of online buyers in Hong Kong. International Journal of Hospitality Management 21(6-7): 766-772.
Lee G and Tussyadiah I (2010) Textual and visual information in eWOM: A gap between preferences in information search and diffusion. Journal of Information of Technology and Tourism 12(4): 351-361.
Lehto XY Kim D-Y and Morrison AM (2006) The effect of prior destination experience on online information search behaviour. Tourism and Hospitality Research 6(2): 160178.

Lin LY and Chen CS (2006) The influence of the country-of-origin image product knowledge and product involvement on consumer purchase decisions: an empirical study of insurance and catering services in Taiwan. Journal of Consumer Marketing 23(5): 248-265.
Llach J Marimon F del Mar Alonso-Almeida M and Bernardo M (2013) Determinants of online booking loyalties for the purchasing of airline tickets. Tourism Management 35: 23-31.
Lockyer T (2005) Understanding the dynamics of the hotel accommodation purchase Decision. International Journal of contemporary hospitality management 17(6): 481492.

Mano H and Oliver RL (1993) Assessing the Dimensionality and Structure of the consumption Experience: Evaluation Feeling and Satisfaction. Journal of Consumer Research 20(3): 451-466.
Mansfeld Y (1992) From motivation to actual travel. Annals of Tourism Research 19(3): 399-419.
March R and Woodside AG (2005) Testing theory of planned versus realized tourism behaviour. Annals of Tourism Research 32(4): 905-924.
Morosan C and Jeong M (2008) Users' perceptions of two types of hotel reservation web sites. International Journal of Hospitality Management 27(2): 284-292.
Mutinda R and Mayaka M (2012) Alication of destination choice model: Factors influencing domestic tourists destination choice among residents of Nairobi Kenya. Tourism Management 33(6): 1593-1597.
Nedungadi P (1990) Recall and Consumer Consideration Sets: Influencing Choice without Altering Brand Evaluations. Journal of Consumer Research 17(3): 263-276.
Olshavsky RW and Granbois DH (1979) Consumer decision making-fact or fiction? Journal of Consumer Research 6(2): 93-100.
Pan B and Fesenmaier DR (2006) Online information search: Vacation planning process. Annals of Tourism Research 33(3): 809-832.

Pan B Zhang L and Law R (2013) The complex matter of online hotel choice. Cornell Hospitality Quarterly 54(1): 74-83.
Pan B Zhang L and Smith K (2011) A mixed method study of user behavior and usability on an online travel agency. Information Technology and Tourism 13(4): 353-364.
Park S Wang D and Fesenmaier D (2011) Assessing structure in American online purchase of travel products. Anatolia 22(3): 401-417.
Payne JW Bettman JR and Johnson EJ (1993) The Adaptive Decision Maker Cambridge: Cambridge University Press
Paris Tourist Office (2012) Tourism in Paris-Key figures available at: http://pressparisinfocom/key-figures/key-figures (accessed 11 July 2016)
Park S and Kim D-Y (2010) Comparison of different approaches to information search behavior of spring break travelers in the US: experience knowledge involvement and specialization concept. International Journal of Tourism Research 12(1): 49-64.
Park S Nicolau JL and Fesenmaier DR (2013) Assessing advertising in a hierarchical decision model. Annals of Tourism Research 40: 260-282.
Peng H Xu X and Chen W (2013) Tourist behaviors in online booking: A new research Agenda. Communications in Information Science and Management Engineering 3(6): 280-285.
Peterson RA and Merino MC (2003) Consumer information search behaviour and the Internet. Psychology and Marketing 20(2): 99-121.
Petrick JF Li X and Park S-Y (2007) Cruise passengers' decision-making processes. Journal of Travel and Tourism Marketing 23(1): 1-14.
Salisbury LC and Feinberg FM (2012) All things considered? The role of choice set formation in diversification. Journal of Marketing Research 49(3): 320-335.
Shim S Eastlick MA Lotz SL and Warrington P (2001) An online prepurchase intentions model: The role of intention to search. Journal of Retailing 77(3): 397-416.
Sirakaya E and Woodside AG (2005) Building and testing theories of decision making by travellers. Tourism management 26(6): 815-832.
Skift (2016) Another strong performance for online travel agencies in 2015 available at: https://skiftcom/2016/07/07/the-state-of-online-travel-agencies-strong-growth-but-big-challenges-ahead/ (accessed 02 March 2017)
Snepenger D and Snepenger M (1993) Information Search by Pleasure Travelers In Encyclopaedia of Hospitality and Tourism M Kahn M Olsen and T Var eds 830-835 New York NY: Van strand Reinhold
Solomon M Bamossy G Askegaard S Hogg MK (2006) Consumer behaviour a European perspective 3rd edn Prentice Hall Harlow
Steinbauer A and Werthner H (2007) Consumer behaviour in e-Tourism. Information and Communication Technologies in Tourism 2: 65-76.
Teare RE (1998) Interpreting and responding to customer needs. Journal of Workplace Learning 10(2): 76-94.
Toh RS DeKay CF and Raven P (2011) Travel Planning: Searching for and Booking Hotels on the Internet. Cornell Hospitality Quarterly 52(4): 388-398.
Um S and Crompton JL (1992) The roles of perceived inhibitors and facilitators in pleasure travel destination decisions. Journal of Travel Research 30(3): 18-25.
Vermeulen IE and Seegers D (2009) Tried and tested: the impact of online hotel reviews on consumer consideration. Tourism Management 30(1): 123-127.
Yavas U and Babakus E (2003) What do guests look for in a Hotel? A multi-attribute Aroach. Services Marketing Quarterly 25(2): 1-9.
Yoon C Cole CA and Lee MP (2009) Consumer decision making and aging: Current
knowledge and future directions. Journal of Consumer Psychology 19(1): 2-16.
Zechmeister JJ Shaughnessy EB and Zechmeister JS (2009) Research methods in psychology 8th ed Boston [etc]: McGraw-Hill


Figure 1. Online decision-making process of Arbitrary Decision Makers (Group 1)

Stage 1a


Stage 2a

| Checked | Information contents: Price (62\%), Location (48\%) <br>  <br>  Informationtypes: Hotel images (62\%), Review score (48\%), |
| :--- | :--- | Customer review (34\%), Hotel description ( $10 \%$ )

Figure 2. Online decision-making process of Standard Decision Makers (Group 2)


Information contents: Price (86\%), Location (71\%)
Information types: Review score (71\%), Hotel images (57\%),
Customer review (14\%)

Figure 3. Online decision-making process of Comprehensive Decision Makers (Group 3)

Table 1. Survey research variables

| Internal information sources | External information sources |  |
| :--- | :--- | :--- |
|  | Types of information | Contents of information |
| Past experience in the hotel | Descriptive hotel information | Room rates |
| Brand familiarity | Hotel images | Location |
| Loyalty to the hotel | Consumer reviews | Facility |
|  | Consumer star ratings |  |
|  | Hotel star rating |  |

Table 2. An example of protocol analysis

| Time spend | Time | Behaviour | Details | Activities |
| :---: | :---: | :---: | :---: | :---: |
| 00:20 | 2:52 | Type in | Enter destination, check-in, and check-out data and check availability of one room for two adults | Start hotel information search on Paris |
| 00:15 | 2:52 | Filter hotels | Use star rating to filter hotels | Use 4 star hotels to reduce alternatives |
| 00:20 | 2:52 | Sort hotels | Use review score to rank hotels | Use review score to rank the alternatives |
| 00:59 | 2:53 | Click link | Click 6 hotels link | Click hotels link |
| 00:55 | 2:54 | Check details | Check the first hotel's pictures, price and location, then remove it because it inconvenient location | Check hotel details |
| 01:25 | 2:55 | Check details | Check the second hotel's pictures, price and location, then add it to wish list | Check hotel details |
| 00:20 | 2:59 | Click link | Click wish list and check the 3 hotels | Click wish list |
| 00:30 | 2:59 | Compare alternatives | Compare 3 hotels price and pictures | Compare 3 hotels |
| 00:40 | 03:00 | Final decision | Choose the hotel with relatively high price but love it's decoration | Make final decision |

Table 3. Profiles of the respondents

|  | Arbitrary decision maker ( $\mathrm{n}=8,18 \%$ ) | Standard decision maker ( $\mathrm{n}=29,66 \%$ ) | Comprehensive decision maker ( $\mathrm{n}=7 ; 16 \%$ ) | Total |
| :---: | :---: | :---: | :---: | :---: |
| Demographics |  |  |  |  |
| Gender |  |  |  |  |
| Female | 25.0\% | 65.5\% | 57.1\% | 56.8\% |
| Male | 75.0\% | 34.5\% | 42.9\% | 43.2\% |
| Income |  |  |  |  |
| Less than $£ 10,000$ | 75.0\% | 62.1\% | 42.9\% | 61.4\% |
| £10,001-£20,000 | 12.5\% | 20.7\% |  | 15.9\% |
| £20,001-£40,000 | 0.0\% | 10.3\% | 28.6\% | 11.4\% |
| Over $£ 40,000$ | 12.5\% | 6.9\% | 28.6\% | 11.4\% |
|  | Mean (SD) |  |  |  |
| Age | 25.25 (1.04) | 29.39 (9.75) | 40.00 (13.77) | 30.35 |
|  |  |  |  | (10.46) |
| Destination | 3.50 (0.76) | 2.83 (0.71) | 1.57 (0.54) | 2.75 (0.89) |
| knowledge |  |  |  |  |
| Online booking experiences | 3.88 (0.99) | 2.79 (1.57) | 2.29 (1.89) | 2.91 (1.58) |


[^0]:    City Research Online:
    http://openaccess.city.ac.uk/
    publications@city.ac.uk

