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APPLICATION OF DELPHI METHOD IN CONSTRUCTION ENGINEERING AND MANAGEMENT RESEARCH: A QUANTITATIVE PERSPECTIVE

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Abstract. The Delphi method has been used as a main research method by a growing number of researchers in the Construction Engineering and Management (CEM) field in the past two decades. Although a number of studies are available on the use of Delphi, few researchers fully examine the potential of the Delphi method in the combined use of statistical techniques, which is an inevitable trend for future Delphi research. This paper aims to review the combined use of Delphi and other quantitative methods in the CEM field based on a structured literature review of 88 relevant papers. All of the 88 papers are systematically identified from ten well-known peer-reviewed CEM journals published in the period of 1990-2012. Topic coverage, application requirements, and statistical techniques in the 88 Delphi papers are reviewed. The mix use of the Delphi method with three advanced modelling methods, such as Fuzzy Sets, Analytical Hierarchy Process, and Analytical Network Process is also examined. These review results provide practical references for researchers having interests in applying Delphi method in CEM research.

Keywords: Delphi method; Construction engineering and management research; Quantitative perspective; Review

Introduction

The Delphi method is a structured communication and consensus building approach amongst a group of experts on a complex problem (Chan et al. 2001). This method refers to an iterative process where consensus is often reached through rounds of feedbacks of experts' opinion and judgment on a particular subject (Hallowell and Gambatese 2010b). Although sometimes the reliability of the findings derived from a Delphi study may raise some controversy because of the inappropriate design and execution of the Delphi study, such as shortcomings of the survey instrument, poor choice of experts, weak bias control, unreliable analyses, and limited feedback during the study (Gupta and Clarke 1996; Keeney et al. 2001), the Delphi method remains a particularly useful alternative for the situation when objective data are unattainable, there is a lack of empirical evidence, or experimental research is unrealistic or unethical (Hallowell and Gambatese 2010b).

As an established profession in the construction industry, CEM is a practice-driven field in nature. Many research questions in this field need to address the impacts of individuals, organizations and the society on construction management activities, particularly those on planning, forecasting and decision making activities (Fellows and Liu 2009). The key to resolve these problems should draw upon the collective knowledge and experience of selected experts in a given area. By contrast to other methods such as interviews, Delphi provides a more reliable and efficient alternative for solving these problems with high uncertainty (Chan et al. 2001). Therefore, a growing number of researchers have adopted Delphi method in CEM research since the early 1990s (Hallowell and Gambatese 2010b).

Although many researchers regard Delphi as a qualitative method (Hasson et al. 2000), a trend that conduct Delphi in a more quantitative manner by combining quantitative methods has been emerged in the past two decades. In a recent review paper by Hallowell and Gambatese (2010b), they also affirmed this trend. However, limited systematic summary is available on these quantitative Delphi studies. Compared with

traditional Delphi studies, quantitative Delphi studies require careful research design and consequently a number of statistical data analysis approaches. Therefore, this study aims to begin to fill this gap by conducting a systematic review of relevant Delphi papers in CEM research. Specific objectives of this study are to: (1) categorize the research topics in which Delphi has been applied, (2) summarize the key requirements of Delphi method, (3) investigate the statistical analysis techniques used for Delphi data, and (4) examine the combined use of Delphi and advanced modeling techniques.

1. Overview of the Delphi Method

The Delphi concept originated from the American defence industry. The classical Delphi procedures usually comprise at least three rounds of survey (Keeney et al. 2011). Round 1 is to solicit opinions on a certain issue in an open-ended way from the expert panel. Round 2 is to ask panelists to rate the statements in a questionnaire according to their opinions on the subject. Round 3 is to ask panelists to reassess the ratings in the light of the consolidated results from Round 2. Rounds of the survey may continue until a consensus among panelists can fulfil the requirement on some or all of the items. Sometimes Round 1 survey can be skipped when the Round 2 survey questionnaire can be developed through literature review and interviews (Ke et al. 2011; Hon et al. 2012).

2. Research Methodology

This study conducted a comprehensive review of papers that employed Delphi as the primary or secondary research method and were published in the first-tier CEM journals between 1990 and 2012. The review scope included relevant papers published in the ten selected journals: (1) *Construction Management and Economics (CME)*, (2) *Journal of Construction Engineering and Management (JConstr.EM)*, (3) *Engineering, Construction and Architectural Management (ECAM)*, (4) *Journal of Management in Engineering (JME)*, (5) *International Journal of Project Management (IJPM)*, (6) *Automation in Construction (AC)*, (7) *Building Research and Information (BRI)*, (8) *Building and Environment*

(BE), (9) *Journal of Civil Engineering and Management (JCiv.EM)*, and (10) *Journal of Facilities Management (JFM)*. The first seven journals are among the top journals in the ranking of Chau (1997). The remaining three journals are also widely regarded as the most important sources to obtain high-quality CEM papers (Chan et al. 2009). The common keyword “Delphi” was searched in the ten journals through search engines of Taylor and Francis, ASCE Library, Emerald, and Web of Science (WoS). The total number of relevant papers identified by the initial search was 282. However, not all the initial identified papers used Delphi method as its primary or secondary research method. Some just happened to have the word “Delphi” in their contexts and references. Thus, the initial collection was trimmed via a further visual examination. Only those studies that have clearly specified necessary details of undertaking the Delphi study and satisfied the Delphi requirements are regarded as valid. After the visual examination, 88 papers were finally identified as valid, including CME (16), JConstr.EM (30), ECAM (9), JME (6), IJPM (16), AC (3), BRI (2), BE (4), JCiv.EM (2), and JFM (2). Figure 1 shows the distribution of the identified Delphi papers in the study period, which has indicated the increasing application trend of the Delphi method in the past two decades. The literature search work was conducted between March and April in 2013.

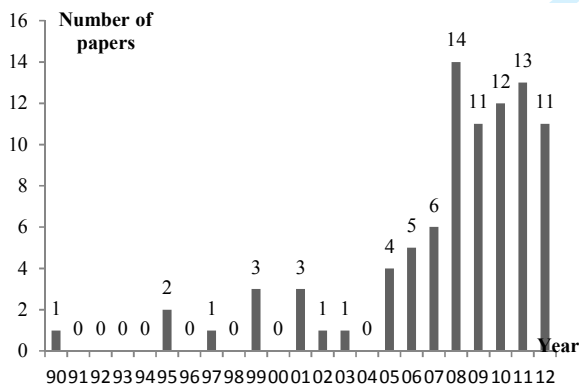


Fig. 1. Identified Delphi papers published between 1990 and 2012

3. Topic Coverage of the Delphi Papers

Considering the good reputation and widespread acceptance of the *Journal of Construction Engineering and Management (JConstr.EM)* (Chau 1997), its categorization framework of topic coverage was adopted to categorize the topics of the identified Delphi papers (ASCE 2013). Despite the simplicity of this categorization framework, the framework remains familiar and easily understandable to CEM researchers. Within the 88 identified papers, in addition to the three review papers of Chan et al. (2009), Hollowell and Gambatese (2010b), and Lucko and Rojas (2010), research topics of the remaining 85 Delphi papers could be grouped under seven categories as shown in Figure 2.

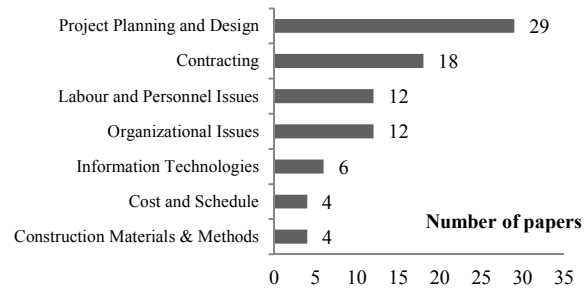


Fig. 2. Distribution of research interests in the identified Delphi papers

Project planning and design ranked first with 29 papers involved. Majority of these papers employed Delphi as a forecasting instrument to identify and evaluate certain risks for managing a specific type of projects, such as financial risks (Thomas et al. 2006; Lyer and Sagheer 2010; Xu et al., 2010a; 2010b; Ke et al. 2010; 2011), technical risks (Seo and Choi 2008), execution risks (Aritua et al. 2011; Del Caño and de la Cruz 2002; De la Cruz et al. 2006), as well as contractual and cost risks (Tummala and Burchett 1999; Adams 2006; 2008). Aside from these studies on risk management, the Delphi method could be also used to investigate factors regarding engineering design and pre-project planning. For instance, Pan (2008) applied the Delphi method to explore the factors affecting the decision making on the selection of bridge construction methods. Wu et al. (2007) used this method to identify the evaluation criteria for selecting on the optimal project location.

The contracting issue received the second ranking with 18 papers involved. Some researchers identified the selection criteria for project procurement methods by using the Delphi method (Chan et al. 2001; Lee and Kim 2001). Delphi was also commonly employed to resolve procurement-related evaluations in different types of projects, such as Design-Build projects and Public-Private Partnership projects (Brown et al. 2001; Yeung et al. 2007; 2008; 2009a; 2009b; 2012; Kumaraswamy and Anvuur 2008; Xia et al. 2009; 2011; Xia and Chan 2010; 2012b).

Labour and personnel issues ranked third with 12 papers involved. Most of these studies focused on safety management. Many researchers utilized Delphi to evaluate the effectiveness of safety programs or systems (Hallowell and Gambatese 2009a; 2010a; Rajendran and Gambatese 2009; Hallowell and Calhoun 2011; Hallowell et al. 2011; Hon et al. 2012; Shapira and Lyachin 2009). Delphi was also used to identify and evaluate personal issues, such as irregular behaviour (Tabish and Jha 2011), professional attributes (Hackett and Hicks 2007), and engineer competences (Yik et al. 2012).

Organizational issues also received the third ranking with 12 papers involved. These studies mainly used Delphi to develop certain solutions for construction organizations, such as internationalization, corporate financing, corporate competences, and business (Gunhan and Arditi 2005a; 2005b; Chen and Hsu 2008; Hsu et al. 2008; Dikmen et al. 2010; Lu 2010). Additionally, Delphi was used to explore a reasonable organization design and

the influence of organization culture (Gajendran and Brewer 2007; Elbarkouky and Fayek 2011; Lin 2011).

The number of papers on information technologies ranked fifth. Six papers were devoted to this area. These studies mainly employed Delphi to evaluate the effectiveness and outcomes of innovative technologies and systems (Karlsson et al. 2008; Cooke et al. 2008; Dawood and Sikka 2009; Dawood 2010; Lin et al. 2011).

Four papers on cost and schedule were identified (Chau 1995; Shaheen et al. 2007; Pivo 2008; Chan 2012). These studies mainly used Delphi as forecasting and evaluation tools.

Construction Materials and Methods also have four papers involved. Among these studies, Delphi was mainly used to evaluate the effectiveness of various construction methods and technologies (Arditi and Gunaydin 1999; Sarkar and Dutta 2010; Hallowell and Gambatese 2009b; Yasamis-Speroni et al. 2012).

4. Key Requirements for the Delphi Method

4.1. Selection of Delphi Panelists

The success of Delphi studies mainly depends on the careful and objective selection of expert panelists (Chan et al. 2001). Those experts involved in a Delphi study refers to professionals or researchers having special knowledge/experience, which are evident by several specific requirements such as working appointments, professional qualifications, working experience, and relevant publications (Hallowell 2008). The majority of the identified Delphi papers (64 out of 88) indicated the requirements for the selection of experts. Two sets of the qualification of expert panelists were adopted: (1) specific requirements, and (2) a flexible point system. Some researchers adopted clear criteria to qualify experts. For example, Chan et al. (2001) and Manoliadis et al. (2006) adopted the working experience and the involvement in a certain kind of projects as key criteria to qualify experts. Meanwhile, Hallowell and Gambatese (2010b) and Hallowell et al. (2011) recommended that an identified expert scores a minimum of 12 total points in an expert evaluation system to qualify for participation in a study.

4.2. Number of Expert Panelists

Extant CEM literature is inconclusive on the optimal size of a Delphi panel. Some researchers believe that the bigger panel size can yield more reliable results (Murphy et al. 1998). Others have argued that there is no significant correlation between the size of a Delphi panel and accuracy and effectiveness of the Delphi method (Boje and Murnighan 1982). However, the variation in numbers of Delphi panelists results from several factors, including: the scope or nature of the problem under investigation, number of available experts, and available resources in terms of time and money (Hallowell and Calhoun 2011; Manoliadis et al. 2006; Chan et al. 2001; Hansson et al. 2000). In all 88 identified papers, 67 papers specified the sizes of the expert panel employed. The size of the expert panel involved in these studies

ranged from 3 to 93. Table 1 has indicated that majority of researchers are inclined to employ a panel size between 8 and 20 in their CEM researches.

Table 1. Panel sizes in identified Delphi papers

| Panel size | 3-7 | 8-20 | 21-30 | 31-40 | 41-50 | 51 or above | Total |
|------------|-----|------|-------|-------|-------|-------------|-------|
| Frequency | 7 | 41 | 9 | 5 | 4 | 1 | 67 |

4.3. Number of Rounds

The number of rounds is an essential aspect in design a Delphi study, which aims at reaching consensus among panelists through controlled and anonymous feedback and iterative process (Hallowell and Gambatese 2010b). However, there is no specific guidance on the optimal number of rounds in Delphi studies in previous literature and therefore researchers tend to settle on different number of rounds given their desired level of consensus. Among the identified 88 papers, the number of rounds ranges from two to six. It is worth noting that the 40 of the identified 88 papers have reached desired consensus after two and three rounds. This is in line with the observation of Dalkey et al. (1970) that Delphi results are more accurate after two iterations. Nevertheless, in the case of more than three iterations involved, the researcher should consider issues of participant fatigue, attrition rates, time, and cost (Hansson et al. 2000). For example, in the three identified papers by Chan et al. (2001), Rajendran and Gambatese (2009), and Xia et al. (2011), the number of experts involved started dropping out of the studies after Round 2.

4.4. Anonymous Feedback Process

Linstone and Turoff (1975) stated that, in Delphi studies, providing anonymous feedback facilitates indirect communication among respondents to reach a high level of consensus. Hallowell and Gambatese (2010b) also emphasized that the process is not a Delphi without the iterative and feedback processes. Based on reviewing the 88 identified papers, the common simple statistical feedback between the rounds is mean or median (32 out of 88 papers).

5. Statistical Analysis Tests for the Delphi Data

A growing number of Delphi papers which used advanced statistical techniques in data analysis have been identified in the past two decades as shown in Figure 3. Statistical analysis techniques were adopted in data analysis of Delphi survey mainly for three different purposes: consensus measurement, inter-group comparison and correlation analysis. Table 2 summarizes statistical tests used for each purpose of the identified Delphi papers. Statistical Package for the Social Sciences (SPSS) software is the most frequently used software for conducting statistical analysis on Delphi data.

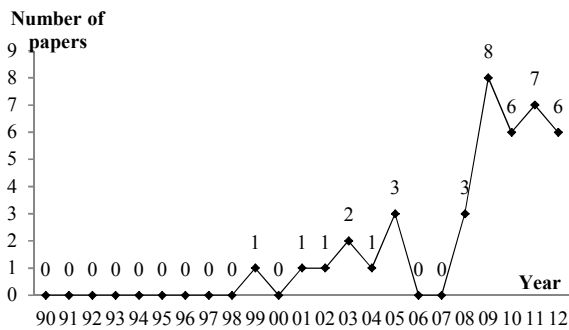


Fig. 3. Number of Delphi papers using statistical analysis techniques between 1990 and 2012

Table 2. Statistical analysis techniques used in identified Delphi studies

| Purpose | Techniques | Frequency |
|------------------------|--|-----------|
| Consensus measurement | Deviation | 16 |
| | Kendall's coefficient of concordance (W) | 15 |
| | Chi-square (χ^2) | 3 |
| Inter-group comparison | Spearman rank correlation test | 4 |
| | Wilcoxon signed rank test | 1 |
| | Kruskal-Wallis test | 1 |
| Correlation analysis | Pearson correlation matrix | 12 |

5.1. Attitude Scales

Nearly half of the identified Delphi papers (41 out of 88 papers) adopted a Likert scale to quantify the opinions of experts on a specific subject. As shown in Table 3, the attitude scales adopted in the identified Delphi papers were in the range between 3 and 12. The five-point Likert scale was used mostly with the frequency of 22. The increasing use of ten-point Likert scale was also observed. It should be noted that the attitude scale employed in Delphi questionnaires should be in a range of over five points to sustain measurement accuracy because most Delphi sample sizes are small (Hsu and Sandford 2007).

Table 3. Attitude scales in identified Delphi studies

| Attitude scale | 3 | 4 | 5 | 6 | 7 | 9 | 10 | 12 | Total |
|----------------|---|---|----|---|---|---|----|----|-------|
| Frequency | 4 | 2 | 22 | 1 | 2 | 2 | 7 | 1 | 41 |

Apart from the Likert scale, a centesimal system was also used in a few Delphi studies to collect panelists' opinions (Chan et al. 2001; del Caño and de la Cruz 2002; Adams 2008). For example, in Chan's et al. (2001) study that investigated criteria for the selection of procurement systems for construction projects, panelists were requested to provide ratings of the utility attribute of each selection criterion against each selected procurement system based on a centesimal system.

5.2. Consensus Measurement

The use of the Delphi method is to achieve consensus among the Delphi panelists (Chan et al. 2001). Thus

consensus measurement is a critical work in data analysis of Delphi survey. However, given the uniqueness of Delphi data across different CEM areas, determination of the level of consensus varies. Hence, it is impossible to suggest an optimal level of consensus for Delphi studies across different CEM areas. Based on the review work of the 88 Delphi papers, three techniques were identified as the major tools in measuring the consensus among the panel experts, namely, Deviation, Kendall's coefficient of concordance (W), and Chi-square (χ^2).

Table 2 shows that deviation received the most advocacies in measuring the consensus degree of different rounds of Delphi survey (16 papers). Absolute deviation and standard deviation of absolute deviation were the most popular indicators employed. A number of researchers favoured the use of absolute deviation to measure the absolute difference to the mean value of a data set and set an absolute variance of less than 5% or 10% as an threshold in their studies (Hallowell and Gambatese, 2009a; 2009b; 2010a; Hallowell et al., 2011; Hallowell and Calhoun, 2011). The use of standard deviation in consensus measurement was also widely adopted in CEM areas such as organization issues, contracting, project planning and design, as well as information technologies (Arditi et al. 1999; del Caño and de la Cruz 2002; Gunhan and Arditi 2005a; 2005b; Chinowsky et al. 2007; Dawood and Sikka 2009; Dawood 2010; Vidal et al. 2011; Yu and Kwon 2011; Yasamis-Speroni et al. 2012). However, there is no agreement on the minimum value of standard deviation, under which the consensus of the Delphi survey could be accepted. Some researchers accepted the ratio of 30% that standard deviation value against a mean value of a data set, although this ratio indicates that a certain difference existing among the data (Chinowsky et al. 2007; Vidal et al. 2011; Yasamis-Speroni et al. 2012).

Kendall's coefficient of concordance (W) is another technique commonly used to test the level of concordance (consensus) among the expert panelists (Xia et al. 2009; Hon et al. 2012; Hallowell et al. 2011). In this study, fifteen of the identified Delphi papers employed this technique. The W value indicates the degree of agreement between the panel members by taking into account the variations between the rankings of mean of different variables (Hon et al. 2012). A concordance coefficient of "1" means 100% consensus. It can be construed that the W value should be increased along with a successive Delphi survey rounds. Within the identified Delphi papers, the W value ranged from 0.234 to 0.600 (Hon et al. 2012; Pivo 2008).

Chi-square should be recommended to be adopted when the number of variables to be evaluated is larger than seven (Siegel and Castellan 1988). Views of the Delphi panelists reach a consensus when the computed Chi-square value is larger than the critical Chi-square value (Ke et al. 2010; 2011; Hon et al. 2012).

5.3. Inter-group Comparison

It is widely accepted that setting the boundary within the expert panel can improve the validity of the Delphi

studies. Thus, inter-group analysis should be conducted to test whether there is any substantially similar agreement among the respondents from different subgroups before combining the data from various subgroups (Hon et al. 2012). Since Likert data were usually treated as ordinal data in the identified Delphi papers, three non-parametric statistical techniques, namely, Spearman's rank correlation coefficient, Wilcoxon signed rank test, and Kruskal-Wallis test were found to be used for the inter-group comparison.

Four identified Delphi papers use Spearman's rank correlation coefficient to test the inter-group comparison (Arditi et al. 1999; Hackett and Hicks 2007; Ke et al. 2010; 2011). If the computed Spearman's rank correlation coefficient exceeds the critical value at a significance level (of say 0.05), it can be construed that there is consistence between the different respondent groups (Ke et al. 2011).

Two identified Delphi papers employed Wilcoxon Signed Rank test to examine the inter-group comparison (Hallowell and Calhoun 2011; Yasamis-Speroni et al. 2012). If the computed test statistics is less than the critical value at a significance level (of say 0.10), there is no significant difference among the views of experts those belong to different subgroups (Yasamis-Speroni et al. 2012).

In addition, Hon et al. (2012) conducted a Kruskal-Wallis test on experts' evaluation of difficulties of implementing safety practices in the repair and maintenance sector within three expert subgroups, namely, client subgroup, contractor subgroup, and occupational health and safety consultants/regulatory subgroup. Hon et al. (2012) mentioned that if the computed Kruskal-Wallis test value is less than the critical value at a significance level (of say 0.05), this indicates that consensus among different subgroups are achieved.

5.4. Correlation Analysis

In some cases, Delphi method is used to examine independent variables regarding a particular construct which are identified from literature reviews, interviews, or a combination of these two methods (Xia et al. 2009). Thus correlation analysis of variables in a Delphi survey should be performed. Pearson Correlation Matrix is a primary form of correlation analysis used in the identified Delphi studies (Yeung et al., 2007; 2008; Xia et al., 2009; Yeung et al., 2009a; 2009b; Xu et al., 2010a; 2010b; Xia and Chan, 2010; Xia et al., 2011; Yeung et al., 2012; Xia and Chan, 2012a; Xia and Chan 2012b).

As indicated earlier in Section 5.3, Likert data collected in the identified Delphi papers were usually treated as ordinal data. A controversy exists in the analysis of ordinal data that, Pearson Correlation Matrix, a parametric statistical technique can better handle interval data rather than ordinal data. However, much documentation has confirmed that parametric statistical technique could also be used for the ordinal data when the different response categories are equal (Kim 1975; Allan 1976; Weisberg et al. 1996; Norman 2010; Hwang

et al. 2013; 2014; Zhao et al. 2013). Thus, the use of Pearson Correlation Matrix to check the correlations of different variables in the identified Delphi papers is acceptable. Its high exposure rate in the identified Delphi papers also reveals a great application potential (Yeung et al., 2007; 2008; Xia et al., 2009; Yeung et al., 2009a; 2009b; Xu et al., 2010a; 2010b; Xia and Chan, 2010; Xia et al., 2011; Yeung et al., 2012; Xia and Chan, 2012a; Xia and Chan 2012b).

6. Combination of Delphi and Other Advanced Modeling Methods

To yield stronger and more reliable findings, some researchers have attempted to combine Delphi with other advanced modeling methods in their CEM studies. Based on the 88 identified Delphi papers, Fuzzy Sets, Analytical Hierarchy Process (AHP), and Analytical Network Process (ANP) were the most common modeling methods employed in previous Delphi studies. Figure 4 shows the development of the trend of combining Delphi with the three modelling methods in the past two decade.

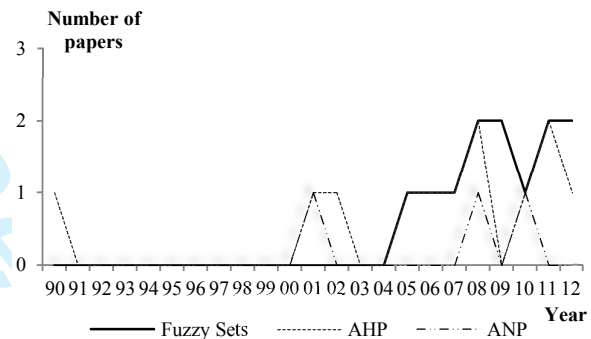


Fig. 4. Number of Delphi papers having combined Fuzzy Sets, AHP, and ANP

6.1. Combination with Fuzzy Sets

Many research questions associated with the construction industry are complex, uncertain, and sensitive to the environment (Chan et al. 2009). Under such circumstances, Fuzzy Theory is regarded as a proper option to deal these problems (Nasirzadeh et al. 2008; Manoliadis et al. 2009). Fuzzy Theory is a branch of modern mathematics that has been first formulated by Zadeh (1965), which includes two fundamental concepts, fuzzy sets and fuzzy logic. Compared with fuzzy logic, Fuzzy sets are the more popular methods employed in the CEM field (Chan et al. 2009). Among the 88 papers identified, twelve papers adopted Fuzzy Sets in Delphi studies. These papers could be categorized into two groups: Fuzzy Delphi and Fuzzy Set Analysis.

Fuzzy Delphi is a modified Delphi method in terms of Fuzzy Sets developed by Murray et al. (1985). Compared with classic Delphi, this method used a fuzzy-membership response system instead of the single-choice response system, which allows experts involved to express the vagueness in answering survey questions. Six papers identified in this study have utilized the Fuzzy

Delphi method (Dzeng and Wen 2005; Thomas et al. 2006; Shaheen et al. 2007; Nasirzadeh et al. 2008; Manoliadis et al. 2009; Lin et al. 2011). The other stretch of research attempts to combine Delphi and Fuzzy sets is to analyse Delphi data through Fuzzy set analysis. Under such circumstance, the Delphi method and Fuzzy set analysis are adopted sequentially in the research design. Six identified Delphi papers adopted this combined research approach (Pan 2008; Xu et al. 2010a; Elbarkouky et al. 2011; Khazaeni et al. 2011; Xia et al. 2011; Yeung et al. 2012).

Particularly, of the 12 papers combining Delphi and Fuzzy Sets, four papers were identified on project risk management (Thomas et al. 2006; Nasirzadeh et al. 2008; Xu et al. 2010a; Khazaeni et al. 2011), three papers on procurement (Dzeng and Wen 2005; Manoliadis et al. 2009; Xia et al. 2011). This indicates that a mixed use of Delphi and Fuzzy Sets are more appropriate for research topics related to the two areas.

6.2. Combination with AHP

The AHP method was first developed by Saaty (1980) and assisted in developing a useful multiple criteria decision making tool dealing with economic, technical, and social issues. One major advantage of AHP is that it can convert a particular subject that is intangible and difficult to quantify into quantified and tangible values by using a systematic approach (Hyun et al. 2008). To assist in the decision making on these complicated issues, the AHP considers the tradeoffs and evaluates the level of relative importance among various factors related to the issues using pairwise comparison (Khasnabis et al. 2002; Shapira and Goldenberg 2005). Some researchers affirmed this merit of AHP and used this technique to quantify Delphi survey results. In this study, twelve papers that used a combination of Delphi and AHP were identified (Shields et al. 1990; Brown et al. 2001; Khasnabis et al. 2002; Shapira and Goldenberg 2005; Bertolini et al. 2006; Wu et al. 2007; Hsu et al. 2008; Hyun et al. 2008; Lu 2010; Lin 2011; Vidal et al. 2011; Khazaeni et al. 2012). Topics of these identified papers refer to various CEM areas, such as organizational issues, contracting, project planning and design, labour and personnel issues, and information technologies (ASCE 2013). This suggests a wide application of the combined approach of Delphi and AHP method.

6.3. Combination with ANP

ANP is a useful method used to deal with a number multiple decision making problems in the construction domain (Chen et al. 2008). It is regarded as a generalized form of the AHP method (Saaty 1996). Since the AHP does not allow interdependencies between the components of a problem, the ANP can be used as an effective tool in those cases (Dikmen et al. 2010). Therefore, the advantage of ANP is that it provides more reliable decision-making support by quantitatively measuring all possible interrelations among indicators based on reuse of the experts' knowledge. In this study, three papers combining ANP with Delphi were identified

(Lee and Kim 2001; Chen et al. 2008; Dikmen et al. 2010).

Conclusions

This comprehensive literature review reveals that Delphi is a robust tool for identifying, evaluating, and forecasting purpose in areas of project planning and design, contracting, labour and personnel issues, and organizational issues in CEM research. Application of Delphi in the 88 identified papers shows that researchers are more inclined to adopt this method within an expert panel of 8-20 members specialized selected in two or three rounds of solicitation, by using mean or median as the most common feedback process. An evident increasing trend of using statistical techniques to analyse data collected in Delphi surveys has been detected. Various statistical analysis techniques utilized to measure the consensus, inter-group comparison, and correlation of the data provided by the Delphi panel are scrutinized in details. This review paper also reveals the combined use of the Delphi method with three advanced modeling techniques, namely, Fuzzy Sets, Analytical Hierarchy Process, and Analytical Network Process. By combining these advanced techniques, Delphi will have a greater application potential for addressing the ambiguous and imprecise events in CEM area.

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