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*Risks in BOOT water supply projects* 1

# A fuzzy-based evaluation of financial risks in build–own–operate–transfer water supply projects

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7 Abstract

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8 The Build-own-operate-transfer (BOOT) scheme is widely used for the provision of new bulk water 9 supply. However, this scheme is complex and carries significant financial risks, due to the 10 characteristics of the water sector and the involvement of public-private stakeholders with new and 11 extended responsibilities, large private capital, and long contract duration. Drawing on the Nungua 12 Seawater Desalination Plant (NSDP) in Ghana, this research seeks to identify and assess the critical 13 financial risks associated with BOOT water supply projects and evaluate the financial risk level of the NSDP project. The risks and their relative criticality on the NSDP project are investigated by using a 14 questionnaire survey method. The questionnaire was formulated with a set of 18 risks derived from 15 16 extant literature and project documentation. Perceived critical financial risks affecting the NSDP project 17 were assessed by a team of experts who had direct involvement in the project. A fuzzy synthetic evaluation suggests that the case project is financially risky and that all the risks are critical to the project. 18 19 Bankruptcy of consortium members, unfavourable economy of the host country, uncertainty in the tariff 20 adjustment of water products, rate of return (profitability) restrictions, and availability problem of 21 private capital are the five most highly-ranked risks. The fuzzy technique is used to represent and model 22 the experiential knowledge of survey participants and to address the fuzziness of their expert judgments. 23 The study's results facilitate prioritization of risks and a comprehensive risk management program 24 during the lifecycle of the case project and future projects. The fuzzy technique is suitable for early 25 phases of BOOT projects to prioritize the risks that require a detailed analysis and to predict the risk 26 level of a project. 27 Keywords: Build-own-operate-transfer (BOOT), fuzzy synthetic evaluation, water supply, financial

- 28 risk.
- 29

#### 30 Introduction and Research Background

31 Build–own–operate–transfer (BOOT) arrangements have been used internationally to develop

32 new infrastructure assets. The BOOT scheme is particularly suitable for the delivery of bulk

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water supply (Lianyu and Tiong, 2005). From 1990 to 2011, 58% (439 projects) of private 33 activities in developing countries involved water and wastewater treatment. Among which, 34 31% (136 projects) were drinking water supply (World Bank, 2012). The BOOT model has the 35 advantages of assigning the risk of delivering a new bulk water supply on budget and on time 36 to the private sector, improving the efficiency of project delivery, and mobilizing new sources 37 of funding for fast project development (World Bank, 2014). The model has become an 38 39 increasingly important route for bulk water supplies because such arrangement increases the capacity of water systems to provide potable water to a growing number of customers. 40

41

Under the BOOT scheme, the private developer performs new and extended responsibilities, 42 43 such as raising project funds, designing and constructing facilities required to deliver the bulk water supply, and operating and maintaining these facilities, with a return on capital secured 44 45 through a long-term off-take agreement (Wall, 2013; Lianyu and Tiong, 2005; Donaghue, 46 2002). Ownership and operating rights belong to the private entity until the expiration of the 47 concession period, after which these rights are transferred to the public party. In this research, BOOT includes all concession-type contracts in which finance is provided primarily by the 48 private sector to develop infrastructure assets. Variations generally adopt the primary functions 49 50 of the BOOT model and include build-operate-transfer (BOT), design-build-operate-transfer, 51 finance-build-own-operate-transfer, build-transfer-operate, build-lease-transfer, and 52 design-build-operate. Utility concessions are excluded from consideration in this paper. However, where necessary, 'public-private partnership (PPP)' is also used to denote general 53 54 forms of private sector participation, including BOOT/its variants and utility concessions/PPPs. 55

56 BOOT projects entail large private capital, a long concession period, and multiple stakeholders 57 which in turn, result in an array of major risks, including political and legal risks (Ng and Loosemore, 2007; Merna and Smith, 1996), social risks (Wibowo and Mohamed, 2010; Rebeiz, 58 2012), technical risks (Özdogan and Birgönül, 2000; Zeng et al., 2007), and financial risks 59 (Xenidis and Angelides, 2005; Lam and Chow, 1999). In this study, financial risks in BOOT 60 for water supply are identified and analyzed. Financial risks occur frequently and affect water 61 62 infrastructure projects significantly (Ameyaw and Chan, 2015a), given the difficulty in obtaining long-term financing in local currency for water projects (Matsukawa et al., 2003). 63 This creates a mismatch between currencies of financing and revenues. The mismatch, coupled 64 with depreciations of the local currency, has a damaging effect on the sustainability and 65 66 profitability of BOOT water supply projects (Vives et al., 2006; Lianyu and Tiong, 2005). Tackling this problem via pass-through provisions in the contracts has been ineffective because the population is often unable to pay for the associated rate hikes. Financial risks are also associated with higher inflation rates, higher capital costs and lower operating margins or forecasted revenues, and therefore are widely linked to rising project failures (Lee and Schaufelberger, 2014; Vives et al., 2006).

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73 Although there is a myriad of literature on the general risks in BOOT projects across infrastructure sectors (e.g., Ameyaw and Chan, 2015a; Lee and Schaufelberger, 2014; Rebeiz, 74 75 2012; Wibowo and Mohamed, 2010; Ng and Loosemore, 2007; Zeng et al., 2007), there are limited studies on, and hence a less understanding of, financial risks affecting water projects, 76 77 especially, in developing countries (Organisation for Economic Co-operation and Development, OECD, 2009). Developing countries are associated with higher risks resulting from 78 79 unfavorable local conditions, such as macroeconomic factors, tariff sustainability, user 80 willingness to pay, legal frameworks, political factors, institutional capacity and fiscal space 81 (Vives et al., 2006; Matsukawa et al., 2003). These issues influence conditions of investment 82 and private sector's investment decision-making. A review of the literature revealed three prominent studies focused upon financial risks in BOOT projects (Xenidis and Angelides, 2005; 83 84 Wang et al., 2000; Lam and Chow, 1999), but these did not consider financial risks in water BOOTs. This explains a paucity of understanding regards the risks affecting water projects 85 86 (OECD, 2009) and also sheds some light on why project structures often fail to match prevailing risks (Vives et al., 2006). Moreover, Cheung and Chan (2011) showed that important 87 88 risks faced by privatised water projects differ from those encountered in transportation and 89 power projects. This suggests a need for a water sector-specific investigation of risks.

90

BOOT water supply projects partly face financial risks to design and construct due to the
sector's challenging characteristics which differentiate it from other infrastructure sectors.
These characteristics result from the following (Ameyaw and Chan, 2015b; see Ameyaw and
Chan (2013) for discussion):

95

Water infrastructure projects are associated with huge initial capital, lengthy payback
 periods and lower rates of return;

• Water assets are highly specific and immobile (with approximately 80% fixed underground);

99 • Critical political and social implications of water services include underpricing and public
100 resistance to private participation; and

101 102

103 These attributes could explain the difficulties encountered in water-based PPP projects. Failure to carefully identify, prioritize, and mitigate them often result in problems in project 104 105 development and operation/maintenance (Cuttaree, 2008; Vinning et al., 2005). Several cases 106 of distressed/disputed, terminated, or initially unsuccessful BOOT water supply projects have 107 been reported, including the Beijing No. 10 Water Scheme, the Chengdu No. 6 Water Plant B, 108 and the 9th Shen Yang Water Plant in China; the Thu Duc Water Plant in Vietnam; the Bogota 109 Treatment Plant in Columbia; the Tampa Bay Desalination Plant in Florida, USA; and the Sonia 110 Vihar Water Plant in India (Zhang and Biswas, 2013; Barnett, 2007; Hall and Lobina, 2006; Vinning et al., 2005). The lack of understanding and adequate assessment and management of 111 112 inherent risks are notable root causes of failure on BOOT projects (Lee and Schaufelberger, 2014; Li and Zou, 2011; Cuttaree, 2008). For example, Aguas del Tunari withdrew from the 113 114 US\$2.5 billion, 40-year water utility concession in Cochabamba, Bolivia following violent protests partly brought about by failure to assess the public's willingness to pay higher tariffs 115 116 (Cuttaree, 2008).

Water utilities tend to be natural monopolies with a limited possibility for competition.

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In order to investigate the important financial risks associated with BOOT water projects, a
questionnaire survey was conducted on the Nungua Seawater Desalination Plant (NSDP)
project, Ghana. The objectives were to:

- Identify and assess critical financial risks associated with BOOT water supply projects.
   Perceptual rankings are gathered from a targeted team of expert participants working on
   the NSDP project.
- Conduct an evaluation of the financial risk level of the NSDP project. By using the fuzzy
   synthetic evaluation (FSE) method, an aggregated index (score) is generated representing
   the perceived financial risk level of the BOOT project.

Perceptual data were collected about the NSDP project through a questionnaire survey. The FSE technique was used to represent and model the experiential knowledge of key project participants and address the fuzziness of their expert judgments. The project's description and the FSE were introduced in the research methods section. Awareness and understanding of the critical financial risks on the NSDP would enable management to take appropriate risk mitigation strategies to reduce project risk level and ensure a successful project delivery.

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#### 135 Financial Risk

136 The term 'financial risk' has variations, as different authors include various factors in their risk 137 lists. Lam and Chow (1999) included counter party, defective products, force majeure, slow progress of works and sovereign risks, while Xenidis and Angelides (2005) included risks such 138 139 as bankruptcy, prolonged negotiation, lack of guarantees, and rate of return restriction. For this research, the definition of financial risk in BOOT projects proposed by Xenidis and Angelides 140 141 (2005) was adopted, namely events that "negatively impact on the cash flows of the financial 142 plan in a way that endangers [a] project's viability or limits its profitability" (p. 433). This 143 research considers only risks that are of economic nature.

144

#### 145 **Research Methods**

To achieve the research objectives, four iterative stages were undertaken: (1) a background review of the FSE tool for analysis; (2) a review of literature and project documentation to identify the relevant financial risks associated with BOOT water supply projects; (3) a questionnaire survey with a team of participants to assess the risks shortlisted in step two. The participants included developers/promoters, consultants and government representatives; and (4) an analysis of survey data using the FSE technique, which generated a numerical aggregated score to represent the perceived risk level of NSDP.

153

#### 154 Mathematical tool for analysis: Fuzzy set, and FSE

Selecting a mathematical tool for assessing risks is influenced by the nature of the problem and the purpose of analysis. During the early stages of BOOT projects, risks should be identified to aid risk planning and management (Boussabaine, 2014). However, given limited project data and information during this stage, the risk identification process draws upon qualitative risk analysis, which involves prioritizing risks for further analysis or action by assessing their potential impact on the project (Project Management Body of Knowledge®, 2008). This condition is considered a qualitative multicriteria analysis problem.

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Fuzzy set theory is suitable for qualitative multicriteria analysis because of its capability to resolve or analyze inaccurate and complex decision problems that result from partial and imprecise information that characterize real projects (Boussabaine, 2014; Li and Zou, 2011; Tah and Carr, 2000; Boussabaine and Elhag, 1999). The fuzzy set approach has a rigorous quantitative mathematical theory (Chen and Hang, 1992) that enables systematic processing of qualitative and imprecise information (Khatri et al., 2011). A risk in a fuzzy environment has sets of values that are described by linguistic terms. These qualitative linguistic terms can be expressed numerically by fuzzy sets. Each set is characterized by a membership function ranging between [0, 1], where 0 represents a non-member, and 1 denotes a full member. FSE is one application of the fuzzy multicriteria decision-making techniques considered suitable for this research (Hsiao, 1998).

174

A major advantage of FSE is that the analysis does not require a statistically significant sample size (Li et al., 2000; Ameyaw and Chan, 2015b). The input data in FSE analysis are based on experts' perceived value judgements. FSE synthesizes various individual elements of an evaluation into an aggregated index (Khatri et al., 2011). The simplicity of the FSE is that experts' judgements are required for only the sub-criteria (lower-level attributes), whose membership functions are used to derive the membership functions of the upper-criteria (higher-level attributes). This alleviates the need for a complicated questionnaire design.

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Further, given its theoretical basis in fuzzy set theory (Zadeh, 1965), the FSE approach to risk 183 184 assessment extends to subjective and uncertain phenomena (Boussabaine and Elhag, 1999); 185 Fuzzy set theory was originally developed to handle these concepts with ease (Jato-Espino et 186 al., 2014). Subjectivity stems from unavailable and incomplete information surrounding risks 187 and the project itself, and the partial ignorance of decision makers (Sadiq and Rodriquez, 2004). 188 The decision maker is unable to provide a precise numerical definition regards the degree of exposure of the project to risks. Hence, the individual and collective impact levels of evaluated 189 190 risks on the project remain uncertain. The extent of subjectivity and uncertainty in risk criticality assessment are modeled by linguistic values of a fuzzy nature, such as not critical, 191 192 very low criticality, moderate criticality, and high criticality (see Table 5). Linguistic values 193 provide a means to model "human intolerance for imprecision by encoding decision-relevant 194 information into labels of fuzzy set" (Boussabaine and Elhag, 1999). The estimate of these linguistic values is frequently based on the experience and know-how of the decision maker 195 196 from similar past projects and his/her knowledge on the present project. These linguistic values are defined to suit the project context. In this study, a common language to describe risk 197 criticality is proposed (Table 4) to ensure consistent evaluation and quantification of the risk 198 199 index (Tah and Carr, 2000). The linguistic values are defined in a manner that enables an 200 aggregation of all risk impacts to generate an overall measure of the project's (financial) risk 201 level. These linguistic values are used to derive the membership function (or single-factor 202 evaluation vector) of each risk factor and the project risk level based on the collective 203 judgments of the expert participants.

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#### [Insert Table 2]

Some applications of the FSE technique in different fields are summarized in Table 2. The table 207 208 shows the extensive application and versatility of the method for modeling and decisionmaking processes in practical and complex multicriteria problems, including damage stage 209 210 assessment of concrete structures (Liang et al., 2001), risk-based decision making (Sadiq et al., 211 2004), supplier selection decision-making (Pang and Bai, 2013) and urban infrastructure 212 performance analysis (Khatri et al., 2011). Its applications establish the capability of the FSE to address qualitative multicriteria decision problems to arrive at useful decisions by modeling 213 214 subjectivity and uncertainty in human experience and behavior (Boussabaine, 2014). In this regard, the authors aim to analyze financial risks in a BOOT water supply project and to predict 215 216 the risk index of the project based on the experiential judgments of key project stakeholders. 217 The risk index will depict the financial riskiness (risk level) of the project (i.e., 'not risky', 218 'moderately risky' or 'risky').

219

## 220 Review of literature and project documentation

221 Previous studies that had a focus on identification of financial risks include the influential 222 works of Lam and Chow (1999), Wang et al. (2000), and Xenidis and Angelides (2005). Lam 223 and Chow (1999) surveyed financial risk variables at five phases of the BOT model in Hong 224 Kong, namely: pre-investment, implementation, construction, operation and transfer. They 225 elicited the general opinions of respondents regarding the significance of the risks, reporting 226 that fluctuation in interest rate was the most significant variable at the pre-investment phase, 227 whereas design deficiency and time overrun were highly significant at the implementation 228 stage. Although the study of Lam and Chow enhances our understanding of financial risks in 229 BOOT projects, it is time-bounded and hence the significance of the reported risks may have declined or gained prominence over time. Given the study's focus on BOOTs in general, the 230 231 important risks may not reflect those faced by water projects. Wang et al. (2000) surveyed practitioners' perception on the criticality of foreign exchange and revenue risks in BOT power 232 233 projects. The authors reported that the important risks, in order of criticality, are tariff 234 adjustment, dispatch constraint, foreign exchange, and financial closing risk. Drawing on the 235 literature, Xenidis and Angelides (2005) provided a review and discussion regards a checklist 236 of financial risks in general BOT infrastructure projects. However, the adopted research method 237 was not designed for evaluating and prioritizing the risks. An alternative approach will be to 238 subject the identified risks to a larger rating panel or test the risks on an actual project.

The review also included previous studies that reported on general risks in water-based BOOTs 240 241 and utility PPPs (e.g., Sentürk et al., 2004; Zeng et al., 2007; Wibowo and Mohamed, 2010; 242 Choi et al., 2010; Vives et al., 2006). Şentürk et al. (2004) examined a list of major risks associated with implementation of the Izmit Domestic and Industrial Water Supply BOT 243 project in Turkey. Water sale price, land acquisition, return on equity, and determination of 244 245 optimum operation period were some of the key risk issues reported. Zeng et al. (2007) carried out risk assessment/prioritization in BOT water supply projects in China based on eight risk 246 247 categories, namely: political, bid and negotiation, economic, construction, operating, policy and legal, credit and force majeure. Regarding commercial risks, interest rate fluctuation, price 248 249 variation of water resources, and foreign exchange rate volatility were found be critical. 250 Research studies pertaining to risks associated with general BOOT projects in other 251 infrastructure sectors (power/energy and transport) have also been reported (Yang et al., 2010; 252 Lee and Schaufelberger, 2014; Rebeiz, 2012). In Ghana, literature relating to risk identification 253 and allocation in utility water PPPs was reviewed (Ameyaw and Chan, 2013, 2015a, b). 254 Ameyaw and Chan (2015a) presented a risk prioritization framework for water PPPs by using the Delphi method. Foreign exchange rate, corruption risk, water theft, non-payment of bills, 255 256 and political interference were reported as the five most significant risks while expropriation, 257 climate change, raw water scarcity, political violence and demand risks were found to be least 258 critical.

259

260 The NSDP project was analyzed to ascertain possible financial risks that may face it. The 261 analysis was conducted through primary documentary review of contract documentation 262 (concession agreement) and secondary documentary analysis of industry and professional reports, and newspaper articles. Merna and Smith (1996) noted that a concession agreement 263 affords a useful source of information because it provides the basis of a long-term contract 264 between private and public parties. It also identifies the risks and responsibilities linked to the 265 financing, construction, operation/maintenance and revenue packages of a BOOT project. 266 267 Table 2 reports upon the risks identified from the related literature.

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- 269 270

#### [Insert Table 2]

A preliminary list of 25 financial risks related to BOOT water supply projects in general and unique to Ghanaian environment was prepared following the literature review and documentary analysis (Table 3). Prior to preparing a questionnaire, the shortlisted risks were presented to a

consultant (at Ghana's PPP Advisory Unit) for review and validation. The consultant was asked 274 to indicate the important financial risk factors that apply to the NSDP project. The consultant 275 276 was invited because of his direct involvement in the preparation of the concession agreement 277 and risk-related negotiations, and has hands-on experience and specific knowledge on the NSDP. He also has 30 years of experience of Ghana's water industry and was available and 278 279 willing to review the risks. Although the authors initially sought inputs from three practitioners, 280 the other two indicated their unavailability. However, a review from the above-mentioned 281 consultant is deemed sufficient given his participation, experience and knowledge on the project. Of the 25 risk factors short listed, 18 were verified and confirmed as 'significant' to 282 283 the NSDP. Seven risks (unpaid bills by customers, supporting utilities risk, design deficiency, 284 land unavailability, water theft by consumers, high bidding costs, and technology risk) were 285 removed from the checklist, because they were not significant for the NSDP. Table 2 presents and compares the risks in the NSDP with those reported in the literature. It suggests that the 286 287 shortlisted risks facing the project compares well with previously reported risks. The 18 risks 288 were formulated into a questionnaire for a survey.

289

#### 290 **Questionnaire survey**

#### 291 *Project background – Nungua Seawater Desalination Plant (NSDP)*

A questionnaire survey was conducted on the NSDP to measure how the project participants 292 293 perceive the relative significance of the identified risks associated BOOT water supply projects 294 in Table 2. This project is located in Ghana's capital city, Accra and is selected because it is the first large-scale water supply project tendered on a long-term BOOT contract in the country. 295 Therefore, the project provides a good example to further our understanding of risks. The 296 NSDP project is a 25-year water purchase agreement between Ghana Water Company Limited 297 (GWCL) and Befesa Desalination Development Ghana Limited (also known as Befesa–Ghana 298 which is a consortium between Abengoa Water and Daye Water Investment). The NSDP project 299 was finalized financially in November 2012 with a US\$88.7 million 12-year loan from the 300 Standard Bank of South Africa, while the remaining US\$38.1 million came from stakeholder 301 loan and equity. This arrangement resulted in a debt-to-equity ratio of 70:30 (Global Water 302 303 Intelligence: GWI, 2012). This US\$126.80 million project involves the design, construction, operation, and maintenance of a 60,000 m<sup>3</sup>/day desalination plant with a water rate of 304

305 US\$1.36/m<sup>3</sup>. The construction duration of the NSDP project is 24 months. GWCL is the off306 taker and is supported by a guarantee from the Ministry of Finance and Economic Planning
307 (GWI, 2012; GWCL and Befesa Ghana, unpublished Water Purchase Agreement on NSDP,
308 2012).

309

#### 310 Survey and participants for risk assessment

A risk assessment team of seven project participants having sufficient background knowledge 311 312 of the PPP projects environment in Ghana and especially specific knowledge of and information on the NSDP project was created to assess the identified risks. This approach is 313 314 acceptable and widely used in risk management research (e.g., Ng and Loosemore, 2007; Thomas et al., 2006). The PPP Advisory Unit (which manages and oversees public-private 315 partnerships and serves as a centre of expertise) was approached to nominate participants with 316 a direct involvement in the NSDP. Although the size of the risk assessment team is small, 317 318 reliable assessment results is anticipated because the sample included top-level management 319 officials with direct decision making roles in the project. The seven participants were involved 320 in the preparation of contract documentation, risk-related negotiations and management of the 321 NSDP.

322

Table 3 summarizes the participants' profiles; two from the client organization (GWCL), two 323 from the local partner of the project (Hydrocol Ltd.), two from the PPP Advisory Unit, and one 324 325 from the utilities regulator (Public Utilities Regulatory Commission (PURC). Although 326 participants A and E have seven and four years of industry experience, respectively, they were 327 deemed fit to participate in the survey because of their direct involvement in and subsequent 328 knowledge of the NSDP project. The authors were not able to secure lenders' participation, given their location outside Ghana and time limitations. There was however participation from 329 a local partner, Hydrocol Ltd. The participants were contacted ahead of time to explain to them 330 the requirements and the questionnaire instrument which was then sent at a later date. The 331

questionnaire was delivered in person, thereby allowing for clarification of any additionalissues participants might have. The questionnaire was then collected after two weeks.

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- 335 336

#### [Insert Table 4]

As part of the assessment exercise, a questionnaire instrument was prepared based on the 18 337 338 risk factors for the purpose of eliciting the participants' opinions on these risks. The 339 questionnaire was designed: (1) to gather perceptual rankings of the critical financial risks from persons with direct experience with the NSDP project; and (2) to measure NSDP's financial 340 341 risk level. Part I of the survey instrument extracted contextual information on the respondents 342 and their organizational affiliations, including their respective positions, years of water industry experience, and role in with the NSDP project. The rationale behind the risk assessment 343 exercise and the contributions of participation in the research was clearly elucidated upon to 344 all respondents (Dillman et al., 2008). Part II asked each project participant to independently 345 rate the "criticality" of the shortlisted risks based on their perception and direct experience with 346 347 / knowledge of the water project. Criticality is assumed as the joint effect of the likelihood of 348 occurrence and the impact of the corresponding risk (Thomas et al., 2003). Wang et al. (2000) 349 and Thomas et al. (2003) have used the criticality criterion for measuring BOOT project risks. A seven-point scale ranging from "Not critical" (NC) to "Extremely critical" (EC) was adopted 350 for assessing risk criticality (see Table 4). These descriptive linguistic variables provided the 351 participants with flexibility and the ability to measure the risks objectively and reliably (Shang 352 353 et al., 2005). They also helped to generate rankings of the risks and their membership function 354 sets (Chan, 2007) to measure criticality levels of the risks and overall risk index of the NSDP. 355 Based on the perceived criticality ratings of the risk assessment team, the mean criticality index, standard deviation and criticality levels of the risks were calculated. The mean criticality scores 356 were calculated using Equation (4) below. Standard deviation values were calculated using 357 SPSS statistical package 21.0 (Pallant 2005). Additionally, a fuzzy based analysis on the risk 358

359 factors was conducted to measure the risk level of the project.

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- 361
- 362

#### [Insert Table 5]

## 363 Evaluation of Survey Results Using FSE Analysis

364

Feedback from the risk criticality rating exercise was collated and analyzed. The FSE was 365 adopted to quantify the impacts of the risks and to predict the financial risk level (FRL) of the 366 367 case project. Figure 1 illustrates the operationalization of the fuzzy methodology adopted. The analysis provides a reliable and systematic method for evaluating and prioritizing the critical 368 369 risks associated with the project and consequently quantifying its risk index, in order to enable 370 a proactive project risk management. To assess the overall FRL of the NSDP project, both the 371 weighting and membership functions of each risk factor were derived. Both functions of the 372 risks were based on the ratings of the project participants according to the predefined descriptive linguistic variables. A fuzzy operator (discussed in step 4 below) was employed to 373 process the weighting and membership function sets. FRL of the NSDP project contained 18 374 375 risks; thus, the multilevel and multifactorial fuzzy models (Li et al., 2000; Hsiao, 1998) were used to calculate the membership functions of the risk factors, to form the single-factor 376 377 evaluation matrix  $(\mathbf{R})$  (or fuzzy relational matrix in Fig.1) and to compute the single-factor 378 evaluation vector (**D**). In this regard, the FRL was derived by defuzzifying **D** through a set of 379 indices, which defined the extent of the risk impact. The major steps in the fuzzy risk 380 assessment process are detailed as follows.

- 381
- 382

#### [Insert Fig. 1]

383

## 384 Step 1: Establish the set of basic risks and letter grades for evaluation

385 The basic risks that affect the project are as follows (refer to Table 5):  $\mathbf{r}_1$  = bankruptcy of 386 consortium member(s),  $\mathbf{r}_2$  = unfavorable economy of the host country,  $\mathbf{r}_3$  = tariff adjustment 387 uncertainty, and  $\mathbf{r}_{18}$  = unfavorable economy of the country of the main stakeholders. Therefore, 388  $\pi = {\mathbf{r}_1, \mathbf{r}_2, \mathbf{r}_3, ..., \mathbf{r}_{18}}$ . The set of qualitative classes (or linguistic variables) for the evaluation 389 is as follows:  $v_1$  = 'not critical' (NC),  $v_2$  = 'very low criticality' (VLC),  $v_3$  = 'low criticality' (LC),  $v_4$  = 'moderately critical' (MC),  $v_5$  = 'critical' (C),  $v_6$  = 'very critical' (VC), and  $v_7$  = 390 'extremely critical' (EC). Therefore,  $\mathbf{V} = \{v_1, v_2, v_3, v_4, v_5, v_6, v_7\}$ . These linguistic variables 391 392 were used to maximize the extensive knowledge of the industry respondents, thereby 393 minimizing subjectivity and vagueness in human perception, and to compute the linguistic

(2)

394 variables for the risk level in the NSDP project.

395

#### 396 Step 2: Compute the membership function sets and impact scores of risks

The membership function set  $(MF_{r_i})$  of each risk can be derived by using fuzzy mathematics based on the value judgment of the respondents. Given the seven linguistic variables in Step 1, the membership function set of a particular risk  $r_i$  is obtained through Equation (1) (Chan, 2007; Liu et al., 2013) as follows:

401

402 
$$MF_{r_i} = \frac{a_{i1}}{v_1} + \frac{a_{i2}}{v_2} + \dots + \frac{a_{in}}{v_n} = \frac{a_{i1}}{not \ critical} + \frac{a_{i2}}{very \ low \ criticality} + \dots + \frac{a_{in}}{extremely \ critical}$$
(1)

403 where  $a_{ik}$  is the membership grade and  $a_{ik}/v_k$  signifies the relationship between  $v_{ik}$  and 404 its *MF* but not fractions. Thereafter, a single-factor evaluation vector for a risk  $r_i$  is obtained 405 (Li et al., 2000) as follows:

406 
$$MF_{r_i} = (a_{i1}, a_{i2}, ..., a_{in}).$$

For example, regarding *unfavourable economy in the host country* ( $\mathbf{r}_2$ ), the expert evaluation results suggested that the risk assessment team scored its impact on the NSDP as follows: 0% as 'not critical'; 0% as 'very low criticality'; 0% as 'low criticality'; 14.3% as 'moderately critical'; 14.3% as 'critical'; 57.1% as 'very critical'; and 14.3% as 'extremely critical'. Using Eq. (1), the membership function (MF) is derived as:

412



415 and the single-factor evaluation vector is written through Equation (2) as:

416 (0.000, 0.000, 0.000, 0.143, 0.143, 0.571, 0.143)

417

Consequently, the single-factor evaluation vectors of all the 18 risks are expressed in a fuzzyrelational matrix as follows (to 2 d.p.):

	$MF_{r_1}$		<i>a</i> <sub>11</sub>	<i>a</i> <sub>12</sub>	•••	$a_{17}$		0.00	0.00	0.00	0.00	0.33	0.33	0.33	
	$MF_{r_2}$		<i>a</i> <sub>21</sub>	$a_{21}$		a <sub>27</sub>		0.00	0.00	0.00	0.14	0.14	0.57	0.14	
	$MF_{r_3}$		<i>a</i> <sub>31</sub>	<i>a</i> <sub>32</sub>		<i>a</i> <sub>37</sub>		0.00	0.00	0.00	0.29	0.14	0.14	0.43	
	$MF_{r_4}$		<i>a</i> <sub>41</sub>	$a_{42}$		$a_{47}$		0.00	0.00	0.00	0.29	0.14	0.29	0.29	
	$MF_{r_5}$		$a_{51}$	<i>a</i> <sub>52</sub>	•••	$a_{57}$		0.00	0.00	0.00	0.00	0.57	0.29	0.14	
	$MF_{r_6}$		a <sub>61</sub>	$a_{62}$	•••	a <sub>67</sub>		0.00	0.00	0.00	0.00	0.43	0.57	0.00	
	$MF_{r_7}$		$a_{71}$	<i>a</i> <sub>72</sub>	•••	<i>a</i> <sub>77</sub>		0.00	0.00	0.00	0.00	0.67	0.17	0.17	
	$MF_{r_8}$		$a_{81}$	$a_{82}$	•••	a <sub>87</sub>		0.00	0.00	0.00	0.17	0.50	0.00	0.33	
R -	$MF_{r_9}$	_	$a_{91}$	<i>a</i> <sub>92</sub>	•••	<i>a</i> <sub>97</sub>	_	0.00	0.00	0.00	0.00	0.71	0.14	0.14	(3)
π –	$MF_{r_{10}}$	_	$a_{101}$	$a_{102}$	•••	$a_{107}$		0.00	0.00	0.00	0.14	0.29	0.57	0.00	(3)
	$MF_{r_{11}}$		$a_{111}$	$a_{112}$	•••	<i>a</i> <sub>117</sub>		0.00	0.00	0.00	0.40	0.20	0.00	0.40	
	$MF_{r_{12}}$		<i>a</i> <sub>121</sub>	<i>a</i> <sub>122</sub>	•••	<i>a</i> <sub>127</sub>		0.00	0.00	0.00	0.43	0.14	0.14	0.29	
	$MF_{r_{13}}$		<i>a</i> <sub>131</sub>	<i>a</i> <sub>132</sub>	•••	<i>a</i> <sub>137</sub>		0.00	0.00	0.17	0.17	0.33	0.00	0.33	
	$MF_{r_{14}}$		<i>a</i> <sub>141</sub>	<i>a</i> <sub>142</sub>	•••	<i>a</i> <sub>147</sub>		0.00	0.00	0.00	0.14	0.57	0.29	0.00	
	$MF_{r_{15}}$		$a_{151}$	<i>a</i> <sub>152</sub>	•••	<i>a</i> <sub>157</sub>		0.00	0.00	0.00	0.43	0.14 0.29 0.14	0.14		
	$MF_{r_{16}}$		$a_{161}$	$a_{162}$	•••	$a_{167}$		0.00	0.00	0.00	0.14	0.57	0.29	0.00	
	$MF_{r_{17}}$		$a_{171}$	$a_{172}$	•••	$a_{177}$		0.00	0.00	0.00	0.43	0.14	0.29	0.14	
	$MF_{r_{18}}$		$a_{181}$	$a_{182}$	•••	$a_{187}$		0.00	0.00	0.00	0.29	0.43	0.14	0.14	

422 After deriving the membership function set of each risk in Equation (3), an index suggested by 423 Chen (1998) was used to compute the 'mean criticality' ( $Z_i$ ) of each risk to determine its rank 424 and degree of criticality to the project. Criticality index of each risk is obtained by 425 defuzzificating its membership function set using Equation (4). The reason for using Equation 426 (4) is that the risk criticality rating has drawn on the expert judgment of the risk assessment 427 team using linguistic values (which can be considered an ordinal measurement system) and is 428 representative of the risk assessments of the respondents.

- 429
- 430

$$Z_i = a_{i1}k_1 + a_{i2}k_2 + \dots + a_{in}k_i = \sum_{i=1}^{\circ} a_{ij}k_i$$
(4)

431 where

432  $Z_i$  denotes the mean criticality score for the *i*th risk (a higher index indicates greater 433 potential impact of the risk on the project),

434  $a_{ii}$  represents the degree of membership, and

435  $k_i$  represents a variable of varying impact level of a risk. The seven linguistic grades in 436 Step 1 ( $v_1$ ,  $v_2$ ,  $v_3$ ,  $v_4$ ,  $v_5$ ,  $v_6$ , and  $v_7$ ) with the corresponding numeric grades (1, 2, 3, 4, 5, 6, 437 and 7, respectively) assigned to them described the impact levels of the risks. The numeric

- 438 grades were used to defuzzify the membership function sets of the risk factors.
- 439

440 Using Equation (4) the criticality score of risk of *unfavourable economy in the host country* ( $r_2$ )

441 is derived as:

443

$$Z_2 = (0.00 \times 1 + 0.00 \times 2 + 0.00 \times 3 + 0.143 \times 4 + 0.143 \times 5 + 0.157 \times 6 + 0.143 \times 7) = 5.714$$

444

The third column of Table 5 shows the computation of  $Z_1$  to  $Z_{18}$ . Arranging the  $Z_i$  values in decreasing order of magnitude can determine the criticality levels and ranks of the risk factors. Consequently, the mean criticality score of a factor can be included in any of the seven bands of the factor prioritization scale in Table 4. Risks with  $Z_i$  values  $\geq 4.51$  are considered critical. Based on the transformed measurement scale in Table 4, a risk factor with  $Z_i$  values < 4.51belong to NC, VLC, LC, or MC.

451

452

#### [Insert Table 6]

453

460

## 454 Step 3: Compute the weighting functions of the risks

The weighting function  $w_i$  denotes the relative criticality of a risk evaluated by the project participants. In this research, the normalized mean method (Yeung et al., 2007) to obtain weightings of the risk factors. The weighting of each risk is derived by normalizing its mean criticality index through Equation (5) (i.e., dividing each index by the sum of the indexes). The weighting vector must also satisfy the following normality condition (Li et al., 2000):

$$w_{i} = \frac{Z_{i}}{\sum_{i=1}^{\circ} Z_{i}}, \quad 0 < w_{i} < 1, \text{ and } \sum_{i=1}^{\circ} w_{i} = 1$$
(5)

461 Therefore, the normalized weighting function set is

462 
$$W_{r_i} = (w_{r_1}, w_{r_2}, ..., w_{r_{18}})$$
 (6)

Using equation (5) weighting functions of the risk factors are obtained and presented in fifthcolumn of Table 5. Figure 2 further illustrates the weighting functions.

465 466

467

[Insert Fig. 2]

468 Step 4: Determine the fuzzy vector of the project risk level

From the fuzzy evaluation matrix *R* in Equation (3) and the weighting function set *W* in
Equation (6), the following equation is employed to establish the fuzzy synthesis evaluation
result, namely, the evaluation vector:

$$472 R \circ W = D, (7)$$

473 
$$D = \frac{d_1}{v_1} + \frac{d_2}{v_2} + \ldots + \frac{d_7}{v_7} \quad (0 \le d_k \le 1),$$
(8)

where  $d_k$  is the membership function of the denominator  $v_k$  with respect to the fuzzy evaluation vector  $D = (d_1, d_2, ..., d_7)$ . The symbol " $\circ$ " refers to the fuzzy operation, which is performed by various mathematical functions (Lo, 1999). The accuracy of the assessment results depends on a careful selection of the appropriate function to process Equation (7). In the present study, the  $M(\bullet, \oplus)$  (weighted mean) function is selected. This function is defined as follows (Hsiao, 1998):

480 
$$d_k = \min\left\{1, \sum_{i=1}^{\circ} w_i a_{ij}\right\}, \quad j = 1, 2, ..., n$$
 (9)

481 Li et al. (2000) and Hsiao (1998) posited that when the weighting  $w_i$  satisfies the normality 482 condition  $\sum_{i=1}^{\circ} w_i = 1$ , the " $\oplus$ " degenerates to  $M(\bullet, +)$ ; thus,

483 
$$d_k = \sum_{i=1}^{\circ} w_i a_{ij}, \qquad j = 1, 2, ..., n.$$
 (10)

In this regard, Equation (10) accounts for the influences of all the risks, which is suitable forevaluating the contribution of risks from a general perspective (Hsiao, 1998).

486

487 Therefore, by using Equation (8), the result of the fuzzy evaluation vector of the project risk488 level becomes

489 
$$D = \frac{0.00}{\text{not critical}} + \frac{0.00}{\text{very low criticality}} + \frac{0.01}{\text{low criticality}} + \frac{0.19}{\text{moderate}} + \frac{0.36}{\text{critical}} + \frac{0.25}{\text{very critical}} + \frac{0.19}{\text{extremely critical}}$$
(11)  
490 
$$= (0.00, \ 0.00, \ 0.01, \ 0.19, \ 0.36, \ 0.25, \ 0.19)$$

491

#### 492 Step 5: Defuzzify the fuzzy vector of the project risk level

After establishing the fuzzy evaluation vector in Step 4, the FRL of the NSDP project was
quantified by defuzzifying its membership function set through Equation (12). The risk score
of this project can be included in any of the seven bands of the risk levels in the last column of
Table 5, which range from extremely risky (ER) to not risky (NR).

497 
$$Z_{\text{FRL}} = \sum_{k=1}^{\circ} d_k \cdot k = 0.00 \times 1 + 0.00 \times 2 + 0.01 \times 3 + 0.19 \times 4 + 0.36 \times 5 + 0.25 \times 6 + 0.19 \times 7 = 5.4312 \quad (12)$$

The key assumption of the aforementioned fuzzy-based analysis is that all seven respondents are experienced in BOOT projects and highly familiar with the study project (Table 3), and thus, the reliability of their judgments is ensured. Notably the approach presented above analyses the influences of risks and determines a project's risk level but the management or mitigation of the risk items is beyond the scope of this research.

503

#### 504 Reliability Analysis

Table 6 provides information termed "project risk level (score) if risk item is deleted." This 505 506 follows measurement scales' reliability analysis (see Pallant, 2005). This information measures 507 the effect or contribution of each risk factor to the overall risk score (index) of the case project. 508 The risk scores are the scores of the overall risk level of the NSDP project if the corresponding 509 risk is removed from the calculation of the fuzzy model. Therefore, the risk scores (which 510 depict the project risk level) are based on 17 risk factors, excluding the corresponding risk 511 factor. By comparing these risk level scores with the overall risk level score (5.43) obtained in 512 Equation (12), any risk factor that effectively contributes to the FRL of the NSDP project 513 should have a corresponding score  $\leq$  5.43. By contrast, a risk factor that does not contribute 514 will have a risk level score > 5.43. However, this condition is not violated; thus, each risk factor 515 effectively contributes to the financial risk level of the NSDP project. None of the risks should also be excluded from the 18-factor risk list. Also, Table 6 implies that the items in our 516 517 measurement scale measured the same underlying construct and that the scale is reliable and 518 has a good internal consistency.

- 519
- 520

#### [Insert Table 6]

521

## 522 Discussion of Results from the FSE Analysis

523 The assessment results provide two major conclusions. First, the global risk level of the NSDP 524 project is 5.43, which suggests that the 18 risks collectively have a critical impact on the cash 525 flow and viability of this project. Therefore, the NSDP project can be described as financially risky (R) (Tables 5 and 6). The project stakeholders should develop and implement effective 526 mitigation measures to neutralize the adverse consequences of the risks. Second, all the risk 527 factors are risky because their mean criticality ratings range between 5.14 ('critical') and 6.00 528 ('very critical') categories. Table 5 shows that eight risks are included in the 'very critical' 529 530 band, while the remaining 10 risks are found in the 'critical' band. The top five risk factors are 531 briefly discussed here because they have 'very critical' scores and because of the space

532 limitation in this paper. The discussion is supported with references to similar examples to533 enrich our understanding of the risks.

534

#### 535 *Bankruptcy of consortium member(s)*

The risk factor is assessed as the top-ranked risk with a 'very critical' rating (Table 5). It 536 informs the government that smooth progress and completion of the NSDP project can be 537 538 jeopardized in case the concessionaire files for bankruptcy. This is critical because a potential bankruptcy risk may or may not necessarily relate to the NSDP project but to other business 539 540 operations of the consortium members (Xenidis and Angelides, 2005). For example, in the Tampa Bay Seawater Desalination Plant project, Because of the poor and mistrustful 541 542 relationship between Covanta Tampa Construction (awarded a construction contract and 30year concession to operate and maintain the facility) and Tampa Bay Water, the former filed 543 544 for bankruptcy in October 2003; other primary reasons include the energy crisis in California, which affected the cash flow of Covanta (Barnett, 2007), and to stop Tampa Water from 545 546 terminating the partnership and replacing Covanta (Vinning et al., 2005). Thus, bankruptcy risk 547 will adversely affect NSDP project in terms of cost and time, given that Ghana Water Company will have to replace the concessionaire, Befesa-Ghana. 548

549

## 550 Unfavorable economy of the host country

551 The risk reminds the government, Ghana Water Company and Befesa-Ghana that the Ghanaian 552 economic environment has a significant influence on the eventual success of the NSDP project 553 (Xenidis and Angelides, 2005). The result indicates that the risk assessment team is highly 554 concerned with the unstable local economy with structural deficiencies, immature and 555 undersized stock market, foreign exchange fluctuations, currency devaluation, corruption, and 556 fluctuation in interest and inflation rates (Ameyaw and Chan, 2015a). The implication of poor economy is that the Ghana government may fail to meet agreed guarantees, honor its payment 557 obligations under the contract, or cost slippage problems may occur, which will have a negative 558 impact on smooth implementation of the NSDP project. The significance of poor economy on 559 560 BOOT projects is supported by past research; in the aftermath of the 1997 East Asian financial crisis, the Taiwanese currency was devalued by approximately 30%, which resulted in a huge 561 cost overrun of roughly US\$500 million in the Taiwan High Speed Rail project (Lee and 562 Schaufelberger, 2014). 563

- 564
- 565

#### 566 Uncertainty in the tariff adjustment of water products

This risk hints that the risk assessment team is concerned with the commitment of the current 567 or future government to accept upward adjustments of the operating tariff in case of unexpected 568 569 macroeconomic conditions (such as high inflation rate, currency devaluation, foreign exchange 570 volatility, etc.) during the 25-year concession period. Such unfavorable local conditions are 571 frequently beyond the control of the concessionaire (Befesa-Ghana in this case) and may 572 require a revision/adjustment of the operating tariff. The risk also reflects Ghanaian governments' history of opposing water tariff increases and their implementation in a timely 573 574 manner (Ameyaw and Chan, 2015a). The risk is likely to affect the confidence of the concessionaire. Over the past decade, two BOOT water projects were initiated and eventually 575 576 abandoned following a lack of assessment of public concern over water tariffs and foreign 577 (private) company involvement in public water services, which resulted in public resistance and protests. Elsewhere, tariff adjustment in BOOT contracts in China is the most critical risk 578 579 issue because the government insists on tariff renegotiation on an annual basis; a government 580 price control authority must also approve the adjustment (Wang et al., 2000, p. 202). In addition, 581 the 'very critical' rating of the risk in this study corroborates the findings of Choi et al. (2010) 582 and Wibowo and Mohammed (2010) that tariff adjustment risk has damaging outcomes on 583 private investments in water supply projects in developing countries. Potential implications of 584 uncertainty in tariff adjust on the NSDP will include low operating margins and poor service 585 levels and unpredictable revenue flow and profit levels, which will threaten long-term 586 sustainability of the Befesa-Ghana and the project itself.

587

#### 588 *Rate of return restriction risk (profitability)*

589 Ranked forth, this risk reflects the decision of the current or future government to restrict or impose a cap on the rate of return of the investment of the NSDP project, for example, if the 590 returns of the investors are deemed excessive) (Xenidis and Angelides, 2005). Being the first 591 592 capital-intensive BOOT water supply project in Ghana, the risk assessment team is concerned 593 that a future government may retain a rate of return for the investment. Experience suggests 594 that rate of return restrictions frequently occur in BOOT projects; for example, foreign 595 investors in China have raised concerns regarding the 15% cap of the authorities on the rate of 596 return of private investment projects (Lee and Schaufelberger, 2014; Wang et al., 2000). Therefore, imposing caps on the rate of return of the NSDP project will generate serious 597 consequences, as reflected by its 'very critical' score. These consequences include a reduction 598 599 in the viability of the NSDP, because the cap will limit the ability of the Befesa-Ghana and its investors to balance the project's risks with corresponding return (Wang et al., 2000), and also
 discourage potential investors from participating in similar infrastructure projects in the
 country in future.

603

#### 604 Availability problems of private sector capital

605 The risk of availability of private capital reminds both the Ghana government and private water 606 developers of the difficulties in raising sufficient finances on time for water supply infrastructure projects in a developing country like Ghana. This difficulty reflects reluctance of 607 608 financial institutions and private water developers to provide sizeable funds because of the perceived high-risk profile of the country and its water sector (Ameyaw and Chan, 2015a). 609 610 With a 'very critical' score (5.71), the risk assessment team is concerned with funding 611 unavailability until the completion of the desalination plant construction. This is important 612 because it relates to a successful implementation of the project; when the NSDP project was 613 first awarded to a Norwegian developer (Aqualyng) in 2008, the developer failed to raise 614 financing from the international financial market, which led to the termination of the project in 2010 (GWI, 2012). In another example, a consortium of Mitsubishi and Anglian Water failed 615 to implement the Beijing No. 10 Water Treatment plant due to inability to raise debt financing 616 617 as a result of inadequacies in the financing policies and regulatory systems of China (Zhang and Biswas, 2013). This finding supports the results of previous studies (Li and Zou, 2011; 618 Wang et al., 2000; Tiong, 1990) which showed that a major aspect of the successful execution 619 620 of the BOOT model is raising financing. Responding to financing risk requires innovative 621 approaches to the financing and security of private investments through provision of guarantees 622 by the Ghana government (e.g., foreign exchange guarantees, interest subsidies, revenue 623 guarantees, tariff guarantees, off-take agreements, and debt guarantees), sound contractual 624 structures, and fair risk allocations.

625

The proposed fuzzy methodology provides useful implications for practitioners. This 626 627 methodology is more suitable for the early phase of a BOOT or PPP project, as used for prioritizing major risk events that require further analysis or action by management and for 628 measuring the NSDP's risk level. This process is important because it allows the determination 629 630 of risks for a detailed analysis and pricing in the later stages of a project. The proposed 631 methodology also has the advantage of minimizing subjectivity associated with the assessment 632 of risks by the experts. By using linguistic variables and appropriate fuzzy mathematical algorithms, the weightings and memberships of all the risks are combined and transformed to 633 634 reduce imprecision and vagueness (Lo, 1999). Therefore, the proposed method can improve

- 635 the accuracy of the risk evaluation results.
- 636

#### 637 Limitations and Further Work

The main limitations of this research lie in the perception-based assessment of a set of financial 638 639 risks in a single case study and the small sample size of the risk assessment team of project participants. The risk list may not be representative of all BOOT water supply projects risks in 640 641 the Ghanaian project environment. However, being the first BOOT project in the water sector, 642 it is crucial to study it in order to determine the important risk issues. Also, multiple methods, 643 including literature review and project documentary analysis, a discussion to review and 644 validate the shortlisted risks, expert risk rating exercise, and fuzzy set analysis, were used for 645 purpose of research validity. For a single case, the use of seven project participants with direct 646 experience with the project may be considered appropriate. This study's sample size was 647 similar to those of previous analyses. Thomas et al. (2006) and Ng and Loosemore (2007), for 648 example, used six respondents for risk analysis in a single case study. This limitation is further 649 addressed through the careful selection of members of risk assessment team. The selection 650 process was guided by industry/sector expertise, hands-on experience with BOOT procurement, 651 and familiarity with the NSDP project, and top-level officials of the project management team. 652 The third limitation is that this research does not explore the mitigation or management of the 653 identified financial risks as well as their relationship with other project risks.

654

The above limitations provide avenues for further research to enhance risk management in 655 BOOT projects. Research should be conducted on more project cases to include possible risks 656 657 missed in this research. Such a study should examine other important risk categories, including 658 political, legal/regulatory, social and operational risks. Here, this research will apply other 659 decision models to risk management in PPP projects; these methods include portfolio decision 660 models (Convertino and Valverde, 2013) and global sensitivity and uncertainty analysis 661 (GSUA) (Saltelli et al., 2008; Lüdtke et al., 2007). The research will also cross compare results 662 obtained from the fuzzy set theory with portfolio decision methods and GSUA and elaborate 663 on the strengths and weaknesses of the different methods. Related to the above, the third 664 limitation should be addressed by establishing the linkages or relationships among the different 665 project risk categories in order to develop a full understanding of NSDP project's 666 comprehensive risk management program. This will help to achieve and sustain efficiency in 667 managing this and other BOOT projects to realize prescribed objectives.

#### 669 Conclusions

This research identified and assessed the financial risks in a BOOT water supply project using 670 671 the FSE technique. The risk assessment results of the NSDP project showed the project can be regarded as financially risky, and that the FSE technique can be used to evaluate and prioritize 672 risk factors in terms of their criticality and to rank BOOT projects regarding their overall risk 673 levels. The risk assessment results suggest that for a top five risk factors in a typical BOOT 674 675 water supply project in the Ghanaian environment are bankruptcy of consortium member(s), unfavourable economy of the local economy, uncertainty in the tariff adjustment of water 676 products, restrictions on the rate of return, and availability problems of the private-sector 677 678 capital.

679

680 These risk factors must be the initial focus of the government and private water developers/investors if they are to effectively manage the risks associated with BOOT water 681 682 projects. Four out of the top-five risk factors discussed (unfavourable economy of the local economy, uncertainty in the tariff adjustment of water products, restrictions on the rate of return, 683 684 and availability problems of the private-sector capital) relate to the Ghana's economic environment and/or government actions. A country's economic environment and government 685 686 actions poses significant risks to the infrastructure sector, because such risks influence financial 687 structures supporting sustainability of infrastructure projects. Going forward with its PPP 688 programme, the Ghana government needs to develop innovative ways to address these important risk issues. 689

690

To extend and validate the wider applicability of the FSE technique and the shortlisted risk factors, more research is required, for example, to test the applicability of the risks across infrastructure sectors where BOOT/PPP is applied or increasingly considered by the government, such as energy/power, transport, social sector (education and prisons).

695

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  November 2013).

Tables

## 

## Table 1. Selected previous studies on application of the FSE method

Study	Specific area of	Summery of application
Study	application	Summary of application
Liang et al. (2001)	Damage stage	FSE is applied to establish a multiple layer fuzzy model for
	assessment of	assessing the damage stage of reinforced concrete bridges. The
	structures	method is advantageous at assessing damage conditions of existing
C1 (2001)		concrete structures.
Chang et al. (2001)	River water quality	Utilized the FSE methods to determine the water quality conditions
	analysis	of the Iseng-Wen River system in Taiwan. The fuzzy approach is
Sadia et al (2004)	Distronativis desision	neipful at developing sound water quality management strategies.
Sadiq et al. (2004)	Risk analysis decision-	visite discharge ontion
Lietal $(2005)$	Concrete durability	General FSE framework is developed for the evaluation of
L1 ct al. (2003)	assessment	accelerated concrete durability. The FSF's results are consistent
	ubbebbillent	with that of the experimental results.
Lan et al. (2005)	Prototyping process	FSE and an expert system are integrated to design a decision
()	selection	support system for selecting suitable rapid prototyping processes.
		FSE rank orders the alternatives and selects the appropriate
		prototyping system.
Huang et al. (2008)	Enterprise risk analysis	FSE is embedded in a tabu search algorithm for risk analysis in
		virtual enterprises. It is used to tackle uncertainty and fuzziness.
Khatri et al. (2011)	Urban infrastructure	FSE method is proposed to synthesize performance indicators into
	performance	an index to assess the overall performance of individual urban
$M_{1}^{2} \rightarrow 1$ (2011)	Engline and to doing	Infrastructure systems.
Mi et al. (2011)	environment lodging	the everall stress level for various study sites are derived through
	stress	the ESE method
Tran et al. (2012)	Manhole inspection	Developed a fuzzy risk ranking model based on fuzzy set and
11ull et ul. (2012)	Mainole inspection	analytical hierarchy process (AHP). FSE is performed to obtain the
		fuzzy number of final risk rank.
Liu et al. (2013)	Construction risk	A risk assessment model based on the FSE method is proposed for
~ /	analysis	construction drilling projects risk assessment.
Pang and Bai (2013)	Supplier selection	An analytical network process (ANP)-FSE supplier evaluation and
		selection methodology is proposed, in which FSE is applied to
		select a supplier alternative.
Ma et al. (2014)	Urban rail facilities	FSE is integrated with AHP to develop an AHP-FSE model for
		assessing the impact of adverse weather on urban rail transit
1.01	$D^{+} = 1$	facilities and to derive the risk level of an evaluation target.
Ameyaw and Chan	Kisk allocation	A fuzzy-based risk allocation model for the assignment of risks
(20130)	decision-making	between the public and private parties in PPP projects.

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Financial risks		* Selected					references				
		[1]	[2]	[3]	[4]	[5]	[9]	[7]	[8]	[6]	No.
Bankruptcy of consortium member/s	Х		х								1
Unfavourable (poor) economy in the host country	х		Х			Х					2
Tariff adjustment uncertainty of the water product	х			х		х	х	х	х		5
Rate of return restrictions	х		х						х		2
Availability problems of the private capital	х	х	х	х	х	х		х	х	х	8
Inflation rate volatility	х	х	х		х	х	х	х			6
Lack of guarantees	х		х								1
High construction costs	х	х	х		х			х		х	5
Insufficient performance during operation	х		х		х	х					3
Lack of creditworthiness	х		х				х		х		3
Fluctuating demand	х				х	х	х	х			4
Prolonged approval time for the project	х		х		х					х	3
Taxation risk	х	х	х				х				2
Poor contract design	Х					х					1
Operation cost overruns	Х		х		Х	х	х	х			5
Errors in forecasting the demand	х		х			х					2
Foreign exchange rate volatility	х	х	х	х		х	х	х		х	7
Unfavourable (poor) economy of the country of	х		х								1
the main stakeholders											

#### Table 2. Identification and comparison of financial risks from the NSDP project and the literature

\*NSDP = Nungua Seawater Desalination Plant project

[1] = Lam and Chow (1999); [2] = Xenidis and Angelides (2005); [3] = Wang et al. (2000); [4] = Li and Zou (2011); [5] = Ameyaw and Chan

(2015a); [6] = Zeng et al. (2007); [7] = Wibowo and Mohamed (2010); [8] = Choi et al. (2010); [9] = Lee and Schaufelberger (2014)

Risks not applicable to the NSDP project:

1. unpaid bills by customers; 2. supporting utilities risk; 3. design deficiency; 4. land unavailability; 5. water theft by consumers; 6. high bidding costs; and 7. technology risk

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ID	Participant position	Participant organisation	Years of water industry experience	Familiarity to NSDP project	Participant role
А	Manager, Business Planning	Ghana Water Company Ltd (GWCL)	7	Very familiar	Member of the concession contract preparation team. Involved in project negotiations.
В	Director, Project Development and Investment	PPP Advisory Unit – Public Investment Division	25	Very familiar	Involved in all contract negotiations with project developer/investors for the government, including risk allocation.
С	Manager, Water Sector	Public Utilities Regulatory Commission (PURC)	30	Very familiar	Involved in the tariff review and negotiations with the private consortium.
D	Project Manager	Hydrocol Ghana*	13	Very familiar	Involved in all stages of the project, risk-related negotiations with the GWCL, PURC and sponsors.
E	Project Coordinator	Hydrocol Ghana	4	Very familiar	Project management team member for the local private partner. Involved in project negotiations, such as tariff negotiations.
F	Project and Financial Analyst	PPP Advisory Unit – Public Investment Division	35	Very familiar	In charge of project control and financial feasibility for the government. Involved in preparing the contract agreement.
G	Manager, Projects Construction and Contracts Management	Ghana Water Company Ltd (GWCL)	27	Very familiar	In charge of the project for GWCL. Involved in preparing the concession contract, negotiations and finalizing the concession agreement. Member of the project management team.

Table 3. Designation of members of the risk assessment team

\*Local partner to the NSDP project

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Risk criticality	Project risk level	Numerical rang
Not critical	Not risky	< 1.51
Very low criticality	Very low risk	1.51 - 2.50
Low criticality	Low risk	2.51 - 3.50
Moderately critical	Moderately risky	3.51 - 4.50
Critical	Risky	4.51 - 5.50
Very critical	Very risky	5.51 - 6.50
Extremely critical	Extremely risky	> 6.50

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#### Table 5. Evaluation results of the financial risks

ID	Critical financial risks	Criticality index	Standard deviation	Weighting function	Rank**	Criticality level*
$r_1$	Bankruptcy of consortium member/s	6.00	0.89	0.061	1	Very critical
$r_2$	Unfavourable (poor) economy in the host country	5.71	0.95	0.059	2	Very critical
$r_3$	Tariff adjustment uncertainty of the water product	5.71	1.38	0.059	3	Very critical
$r_4$	Rate of return restrictions	5.57	0.53	0.057	4	Very critical
$r_5$	Availability problems of the private capital	5.57	0.79	0.057	5	Very critical
$r_6$	Inflation rate volatility	5.57	1.27	0.057	6	Very critical
$r_7$	Lack of guarantees	5.50	0.84	0.056	7	Very critical
$r_8$	High construction costs	5.50	1.22	0.056	8	Very critical
$r_9$	Insufficient performance during operation	5.43	0.79	0.056	9	Critical
$r_{10}$	Lack of creditworthiness	5.43	0.79	0.056	9	Critical
<i>r</i> <sub>11</sub>	Fluctuating demand	5.40	1.64	0.055	11	Critical
$r_{12}$	Prolonged approval time for the project	5.29	1.38	0.054	12	Critical
$r_{13}$	Taxation risk	5.17	1.60	0.053	13	Critical
$r_{14}$	Poor contract design	5.14	0.69	0.053	14	Critical
$r_{15}$	Operation cost overruns	5.14	1.21	0.053	17	Critical
$r_{16}$	Errors in forecasting the demand	5.14	0.69	0.053	14	Critical
$r_{17}$	Foreign exchange rate volatility	5.14	1.21	0.053	17	Critical
<i>r</i> <sub>18</sub>	Unfavourable (poor) economy of the country of the main stakeholders	5.14	1.07	0.053	16	Critical

\*Refer to Table 4 for definition of terms and their ranges. \*\*Where two or more factors scored the same mean, the highest ranking is assigned to the one with the least standard deviation.

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	Overall project financial risk index = 5.43 (Risky [R])					
ID	Critical financial risks	Project risk level (score) if risk item deleted	Linguistic project risk level			
$r_1$	Bankruptcy of consortium member/s	5.06	Risky (R)			
$r_2$	Unfavourable (poor) economy in the host country	5.10	Risky (R)			
$r_3$	Tariff adjustment uncertainty of the water product	5.10	Risky (R)			
$r_4$	Rate of return restrictions	5.11	Risky (R)			
$r_5$	Availability problems of the private capital	5.11	Risky (R)			
$r_6$	Inflation rate volatility	5.11	Risky (R)			
$r_7$	Lack of guarantees	5.12	Risky (R)			
$r_8$	High construction costs	5.12	Risky (R)			
$r_9$	Insufficient performance during operation	5.13	Risky (R)			
$r_{10}$	Lack of creditworthiness	5.13	Risky (R)			
$r_{11}$	Fluctuating demand	5.13	Risky (R)			
$r_{12}$	Prolonged approval time for the project	5.14	Risky (R)			
$r_{13}$	Taxation risk	5.16	Risky (R)			
$r_{14}$	Poor contract design	5.16	Risky (R)			
$r_{15}$	Operation cost overruns	5.16	Risky (R)			
$r_{16}$	Errors in forecasting the demand	5.16	Risky (R)			
$r_{17}$	Foreign exchange rate volatility	5.16	Risky (R)			
<i>r</i> <sub>18</sub>	Unfavourable (poor) economy of the country of the main stakeholders	5.16	Risky (R)			

 Table 6. Checking reliability of the risk assessment result



Fig. 1 FSE-based risk assessment process





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The authors wish to thank the referees for their constructive comments and suggestions which aimed at improving the paper. Each individual comment has either been addressed or defended as appropriate (refer below) and a final file resubmitted for your consideration. Once again, thank you.

Reviewers' Comments	Authors' response
All reviewers	
This manuscript was submitted as a Technical Paper. Does the reviewer think this is the appropriate article type? To see descriptions of the article types, <a href="download.aspx?scheme=7&amp;id=28">Click Here</a> .	
Reviewer #1: Yes. The author is using the correct article type.	
Reviewer #2: Yes. The author is using the correct article type.	The authors are delightful to read this feedback – thank you.
Reviewer #3: Yes. The author is using the correct article type.	
Reviewer #1: General comments	
After a careful reading of the manuscript I really like the study and I feel it can have a lot of impact in the field. However, I suggest to accept the manuscript after some Moderate or Minor Revisions. Below I provide some recommendations of topics that you may want to include in the revision: I think these topics can be explored further down the line in additional projects / papers but needs to have some clarification here in this paper at least.	The authors than the reviewer for the comment.
The first comment is about the choice of the fuzzy logic model that has been largely criticized in the literature versus other decision-structured analytical models that consider uncertainty. Also, uncertainty can and must be characterized using the probability distribution functions inferred from data or hypothesized rather than using fuzzification. Yet, I think that some caution should be placed in the model.	The fuzzy set technique is able to handle uncertainty and subjectivity (see Boussabaine and Elhag, 1999; Lo, 1999; Hsiao, 1998). The methodology adopted in this paper handles the decision makers' uncertainty and subjectivity of evaluation, as outlined in a full paragraph 3, page 6: Line 183–203: "Further, given its theoretical basis in fuzzy set theory (Zadeh, 1965), the FSE approach to risk assessment extends to subjective and uncertain phenomena (Boussabaine and Elhag, 1999)"

	Also, the fuzzy-based approach objectifies decision makers' subjective evaluations by a predetermined fuzzy composite function (see Lo, 1999; Hsiao, 1998). The weighted mean method (Eq. [9]) is used in our analysis to quantify the fuzzy membership grades level by level from sub-criteria to the upper-criteria. This is a hierarchical process which further improves reliability of evaluation results.
	From the above, and the risk management literature (e.g., Boussabaine, 2014; Khatri et al., 2011; Tah and Carr, 2000), the fuzzy set theory has been successfully used to handle uncertainty and imprecision of evaluation.
	We agree to the reviewer's suggestion that uncertainty should be characterized through probability distribution functions inferred from data. And so, we are characterizing uncertainty in this way in our next research papers – we are thankful for this.
Second, I suggest to mention at least the existence of portfolio decision models (such as the one in Convertino and Valverde, 2013) that are better than MCDA as well and include global sensitivity and uncertainty analyses.	Thank you for your suggestion here. We have mentioned these methods (portfolio decision, global sensitivity analysis and uncertainty analysis) in the 'Limitation and further work' section of the paper, which we will be applying in subsequent papers/research projects;
	Lines 658–663: "Here, this research will apply other decision models to risk management in PPP projects; these methods include portfolio decision models (Convertino and Valverde, 2013) and global sensitivity and uncertainty analysis (GSUA)"
	Space limitations (imposed by the Journal) will not permit us to include these methods in the current paper. The revised manuscript exceeds slightly the suggested word limit.
Lastly my two minor observations are about the lack of global sensitivity and uncertainty analyses (GSUA) and a conversation about management implications that we can extract from the model/GSUA.	We thank the reviewer for the comment. First, as indicated earlier, we are applying GSUA to risk management in our further research. Space limitation does not allow us to include the suggested
	methods in this manuscript. We have acknowledged this in in the paper. In addition, the design (including sample size) of the current study does not make it easy to apply the suggested methods in the current paper. We will use a big sample size in order obtain good results from these methods.

	Second, we have discussed the management implications of the study under <i>Discussion of Results from the FSE Analysis</i> , with a focus on the 'very critical' risk factors regarding how they affect the BOOT project (Lines 522–624) and then the implications of the fuzzy methodology for practitioners (Lines 626–635)
Particularly, GSUA is very important because it given an idea of what is driving the output in term of model input factor importance and interaction,	
and how that can be used for management. In your case I do not expect different results of GSUA for different models but GSUA can highlight factor importance and interaction for predicting PM2.5.	As stated, we have not used GSUA in the current paper. We are interested in GSUA and we explored it in the further work of this research.
GSUA is a variance-based method for analyzing data and models given an objective function. It is a bit unclear how many realizations of the model have been run and how the authors maximized prediction accuracy. Are the values of the input factors taken to maximize predictions?	The fuzzy methodology used in our analysis converts linguistic variables (input) into quantitative outcomes, allowing the decision maker to obtain the risk level of the project (as in this case). It is not based on objective functions. As illustrated under 'Results obtained from FSE analysis' and operationalised in Fig. 1, the fuzzy methodology contains series of steps that transforms input data into a crisp output.
GSUA (see references below) typically assigns probability distribution functions to all model factors and propagate that into model outputs. That is useful for assessing input factor importance and interaction, regimes, and scaling laws between model input factors and outcomes. This differs from traditional sensitivity analysis methods (that are even missing here)	This is a good comment, we thank the reviewer. However, from the literature on fuzzy set approach, the technique is applied to qualitative data without running sensitivity analyses. And this does not affect the reliability of the outputs. The FSE has been used as a stand-alone method or with other techniques to resolve many practical problems; some of these studies are provided in Table 1.
	As indicated earlier, suggestions regarding applying GSUA is well taken and will be implemented in subsequent papers.
I also suggest to include figures rather than tables to communicate results. They are much more effective.	We agree with tour comment and have included a figure to communicate the results; Fig. 2 presents the weightings of the risk factors.
Thanks.	
Specific comments about GSUA	
Variance-based methods (see Saltelli and Convertino below) are a class of	We appreciate the comments and suggestions and references provided by
probabilistic approaches which quantify the input and output	the reviewer – thank you. We are exploring these methods in risk
uncertainties as probability distributions, and decompose the output	management of PPP projects in our next papers for which we will be using
variance into parts attributable to input variables and combinations of	big sample sizes to ensure good results from these variance-based methods.
variables. The sensitivity of the output to an input variable is therefore	This paper is based on a single case study, with participation from a risk
measured by the amount of variance in the output caused by that input.	assessment team of seven project participants. Having looked at these
variance-based methods allow full exploration of the input space,	methods, they will provide interesting results when applied to PPP projects.
accounting for interactions, and nonlinear responses. For these reasons	

they are widely used when it is feasible to calculate them. Typically this	We have expressed interest in applying these methods in next projects in
calculation involves the use of Monte Carlo methods, but since this can	Limitation and further work section (Lines 658–663).
involve many thousands of model runs, other methods (such as emulators)	
can be used to reduce computational expense when necessary. Note that	
full variance decompositions are only meaningful when the input factors	
are independent from one another. If that is not the case	
information theory based GSUA is necessary (see Ludtke et al. )	
Thus, I really would like to see GSUA done because it (i) informs about the	
dynamics of the processes investigated and (ii) is very important for	
management purposes. However, in this context I feel like the models are	
already extremely comparable and GSUA would not give additional	
information except for the information of variable relative importance and	
interaction.	
Convertino M, Valverde LJ Jr (2013) Portfolio Decision Analysis	
Framework for Value-Focused Ecosystem Management. PLoS ONE 8(6):	
e65056. doi:10.1371/journal.pone.0065056	
Converting et al. Untangling drivers of species distributions: Global	
sensitivity and uncertainty analyses of MaxEnt. Journal Environmental	
Modelling & Software archive Volume 51, January, 2014, Pages 296-309	
Saltelli A, Marco Ratto, Terry Andres, Francesca Campolongo, Jessica	
Cariboni, Debora Gatelli, Michaela Saisana, Stefano Tarantola	
Global Sensitivity Analysis: The Primer, ISBN: 978-0-470-05997-5	
Ludtke et al. (2007), Information-theoretic Sensitivity Analysis: a general	
method for credit assignment in complex networks J. Royal Soc. Interface	
Reviewer #2	
Overall the paper presents a very good methodology on handling subjective	We are delighted to read this positive feedback and the suggestions (below)
uncertainties on Build-own-operate-transfer (BOOT) scheme applied to bulk	– thank you.
water supply projects. The paper has some scholarly contribution with the	
fuzzy sets mathematics well-explained and the results well-narrated.	
There may be a need to explain why the fuzzy sate based method would be	
better than an equivalent probabilistic model where say data is available to	Thank you for your constructive suggestion. We have provided three major
model these criteria with the uncertainties.	reasons from using the fuzzy set approach in this paper:
	Lines des 404. "A main a human of FCF ' d (d) l ' l
	Lines 175-181: A major advantage of FSE is that the analysis does not
	always require statistically significant sample size"

	<ol> <li>These reasons are summarised as follows:         <ol> <li>Fuzzy set does not always require a significant sample size (Li et al., 2000)</li> <li>Data is required for only the lower-level attributes (Hsiao, 1998)</li> <li>The fuzzy set approach takes into account concepts such as uncertainty and vagueness in data (Jato-Espino et al., 2014; Boussabaine and Elhag, 1999).</li> </ol> </li> </ol>
Some of the literature references (format) may also need to be reviewed.	We agree with your observation here and have reviewed the references as appropriate.
Reviewer #3	
The objective of the paper was to investigate the financial risks associated with BOOT in water projects. The authors have developed a set of questionnaires to identify the financial risk indicators, classified the indicators values using expert opinions, applied the fuzzy set and fuzzy synthetic approaches to synthesize the selected indicators into the index and calculate the financial risk of Nugua Seawater Desalination Plant in Ghana. The paper is average in merit; interesting to read; unsure this could be bet fit to the ASCE's Journal of Construction Engineering and Management.	<ul> <li>We are delighted to read this positive feedback – thank you.</li> <li>Regarding suitability of our paper in J. of Infrastructure Systems, we believe it is a best fit for this journal as it accepts and publishes papers on PPPs for infrastructure development, such as:</li> <li>Zhang, X. Q., and Kumaraswamy, M. M. (2001). "BOT-based approaches to infrastructure development in China." <i>J. Infrastruct. Syst.</i>, 10.1061/(ASCE)1076-0342(2001)7:1(18), 18–25.</li> <li>Ke, Y., Wang, S., and Chan, A. P. C. (2010a). "Risk allocation in public-private partnership infrastructure projects: Comparative study." <i>J. Infrastruct. Syst.</i>, 10.1061/(ASCE)IS.1943-555X.0000030, 343–351.</li> <li>Chan, A., Lam, P., Wen, Y., Ameyaw, E., Wang, S., and Ke, Y. (2014). "Cross-Sectional Analysis of Critical Risk Factors for PPP Water Projects in China." <i>J.</i></li> </ul>
The introduction and literature review sections of the paper is clear; however, it has very weak methodology, results and discussion sections. The latter part of the paper is not concise, and to some extent beyond their own work and findings. In my view, the paper needs additional work to make it publishable,	<ul> <li>Infrastruct. Syst., 10.1061/(ASCE)IS.1943-555X.0000214, 04014031.</li> <li>Also, the Editor, Professor Sue McNeil, has indicates that PPPs is one of the 'hot' topics ( http://ascelibrary.org/page/jitse4/editorjis). Hence, this work which focuses on BOOT for water projects is a well fit for the journal.</li> <li>We thank the reviewer for the constructive comments. We address these comments as follows.</li> </ul>

and the authors are requested to address the following comments if they would like to resubmit for a journal publication	
Major comments:	
1)Authors presented that "there is a limited number of research studies on, and hence a less understanding of, financial risks affecting water projects, especially, in developing countries (lines:75-76)". Also, "BOOT water supply projects face financial risks not only because of their complexity" (line:90).	
However, there is no explanation on what those parameters are of water sectors in developing countries that makes it different from developed countries;	To the best of our knowledge there are no definitive studies comparing differences in water PPPs in developing and developed countries. Hence, we do not intend to provide comparisons, but submit that:
	Lines 78–82: Developing countries are associated with higher risks resulting from unfavourable local conditions, such as macroeconomic factors, tariff sustainability, user willingness to pay, legal frameworks, political factors, institutional capacity and fiscal space (Vives et al., 2006; Matsukawa et al., 2003). These issues influence conditions of investment and private sector's investment decision-making.
why risk assessment methods developed/applied in other sectors such as road and power cannot be applied to water sectors;	Lines 87–89: We have not covered risk assessment methods and their applicability to different infrastructure sectors. Such a comparison is beyond the purpose of this paper. However, we made reference to Cheung and Chan's (2011) which found differences in critical risks faced by water, transportation and power projects, to highlight a need for sector-specific risk assessments.
what are those special attributes of water sectors that makes it complex and challenging from the financial perspectives?	We have amended this part by providing a summary of characteristics of the water sector that make it difficult from financial perspectives:
	Lines 91–101: BOOT water supply projects partly face financial risks to design and construct due to the sector's challenging characteristics which differentiate it from other infrastructure sectors. These characteristics result from the following (Ameyaw and Chan, 2015b; see Ameyaw and Chan (2013) for discussion):

I don't think Table:1 presents a convincing and sufficient evidence to the study.	<ul> <li>Water infrastructure projects are associated with huge initial capital, lengthy payback periods and lower rates of return;</li> <li>Water assets are highly specific and immobile (with approximately 80% fixed underground);</li> <li></li> <li>We thank the reviewer for this comment. We agree with the reviewer and Table 1 is removed from the review version</li> </ul>
2) A set of 18-risk indicators were selected after the literature review and consultation with the experts (Table 6). I am unsure how many of those indicators are meaningful, how they can measure the different aspects of the financial risks, and which of those are water sectors and developing countries related. What if-if they consider only 7-8 indicators? Would the results be changed by doing so?	We thank the reviewer for the comment. The risk factors used for the study are meaningful in that they were initially selected after a review of literature and project documentation - this is expected of a study of this nature. Following this, the risks were further scrutinized through expert consultation in order to determine those risks relevant/applicable to the case project (Table 2). The above steps generated 18 (out 25) risks that are useful to the study. Again, the literature sources of the risks are provided in Table 2; these risks are consistent with those reported as financial risk category in the PPP literature (summarised in Lines 145-152; and detailed in Lines 220-288 and 310-359). Following the above, the 18 risks were assessed by a team of practitioners who have a direct involvement in the case project. Of course, each risk will have a different level of impact on the project, and where a different number (say 7–8 as suggested) of risk variables are used, the extent of their impact (overall risk level) will differ; this is because, by our methodology, the effect/contribution of each risk is accounted for in the overall index. So, the overall index which measures the risk level is dependent of the contributions of all risks.
3) Despite their reasons for choosing the fuzzy set theory in their application, the manuscript does not present the important procedures of the fuzzy synthetic evaluation. I cannot see anywhere how the indicators were characterized - meaning what are the fuzzy values (to class into fuzzy membership functions), and what is the basis of classifying them into a "risky" or "not risky" group? The paper must present membership functions of all the risk criteria and basis of their classification.	We thank the reviewer for the comment. As noted by the reviewer, the fuzzy synthetic evaluation (FSE) approach is applied in the analysis. FSE works without building traditional triangular or trapezoidal fuzzy membership functions and the approach adopted is consistent with what is reported in the literature (see for example Li et al., 2013; Chan, 2007; Hsiao, 1998; Ameyaw and Chan, 2015b). In FSE analysis, and in this paper, membership functions can be, or are, derived directly from the expert evaluation using appropriate fuzzy equations (Chan, 2007;

	Li et al., 2013). We showed how the membership functions were derived through Eqns. (1) and (2).
	In comparison with other fuzzy-based methods, this is one of the features of FSE that makes it widely applicable.
	We used a seven-point grading scale to solicit the value judgment of the risk assessment team regarding the criticality of the risks. Based on the seven- point scale, a factor prioritization scale was developed for the risk factors and the overall risk index of the case project (NSDP), as in Table 4. This factor prioritization approach is appropriate and has been used in previous studies (see e.g., Murphy et al., 2015; Li et al., 2013).
	Following the above, and regarding the classification of the NSDP project as 'risky', we submit in <i>Step 5: Defuzzify the fuzzy vector of the project risk level</i> as follows:
	<b>Lines 493-496:</b> After establishing the fuzzy evaluation vector in Step 4, the FRL of the NSDP project was quantified by defuzzifying its membership function set through Equation (12). The risk score of this project can be included in any of the seven bands of the risk levels in the last column of Table 5, which range from extremely risky (ER) to not risky (NR).
	The scale helps to generate rankings of the risks and their membership function sets, in order to quantify the criticality levels of the risks and subsequently the overall risk index of the case project (NSDP).
(A) Figure 1 is not clear and correct Please correct that with the right steps:	We thank the reviewer for the comment
such as fuzzification (membership development) normalization assignment	the main the reviewer for the comment.
of weights and further.	Per the application of the FSE technique, Fig. 1 is correct and captures all the necessary steps which are summarised as follows (Li et al., 2013; Hsiao, 1998):
	1. Establish a set of basic criteria (or factors)
	2. Establish a set of grade alternatives (expressed in linguistic terms) for
	2 Establish a set of weightings by computing the weight vectors of the
	evaluation factors s:
	4. Determine a fuzzy evaluation matrix $R = (r_{ij})_{mxn}$

	5.Determine the final fuzzy evaluation by considering the weightings (Step 3) and fuzzy evaluation matrix (step 4) through the appropriate fuzzy equation.
	Figure 1 reflects the steps involved in applying the FSE and it is consistent with how FSE is applied and reported in the literature – fuzzification, normalisation, fuzzy relational matrix, weighting vector, transformation (application of one of the five fuzzy operators), and defuzzification (see Lo, 1999; Hsiao, 1998; Chan, 2007). The steps outlined in Fig. 1 are also explained/illustrated in Step 1 through Step 5 in the manuscript (Lines 384- 502). In these steps, we showed how the relevant equations are derived and applied through the survey data obtained from the risk assessment team.
5) The paper must illustrate each step of the method with an illustrative	We thank the reviewer for the comment.
example (after line 375). For example, if you are presenting the fuzzificaiton process, you should illustrate with an example.	Overall, we present the fuzzy approach with illustrations from the survey results. Where appropriate, we indicate how a particular result was derived. In the revised manuscript, we show how the membership functions of the risks were obtained using Equations 1 and 2 (Lines 402-406). Also, we show how the criticality scores were calculated using Equation (4) in Lines 407-416.
	As a result of space limitation, where the equation is self- explanatory/straightforward, the result is presented, such as in determining the weighting functions and the normalised weighting function set through equations (5) and (6).
	We believe the read is able to follow the steps outlined in this manuscript.
6) The paper does not present results clearly - it's too vague. Please present what are the main findings? What are the sensitivity of the results? What are	We thank the reviewer for this comment.
the key sector specific and region specific indicators to be considered for the	The entire manuscript is structured under the following major headings
risk assessment? Present your tabulated results.	(with sub-headings):
	1. Introduction and research background 2. Research methods
	3. Evaluation of survey results using FSE analysis
	4. Discussion of results from FSE analysis
	5. Limitation and further work
	6. Conclusion

7) The readers will not be interested to read the discussion section that was derived from others work (line: 494 to 598). In my view, the discussion section is redundant (although some of the information synthesized will have potential added values BUT not in this place), one should present what was found from their study and would have compared/contrasted to others results. Please present your results and discuss based on your analysis, case, and results.	In section 2, we present relevant information about data collection regarding the 18 risk factors that were used in the risk assessment survey. Note that these shortlisted risk factors are the primary factors relevant in this study and subjected to a risk assessment by a team of practitioners involved in the case project. And then in section 3, the FSE is applied to perform the risk analysis based on outcome of section 2. The mean criticality and ranking of the 18 risks as well as the risk level of the project were determined. Here, all relevant results are tabulated and/or presented in figure. Following the above, a discussion based on risk level of the project and the top five risks were discussed in section 4. Note that the discussion of top- five risk factors is due in part to space limitation, as all the 18 risk factors are very critical or critical. The headings and subheadings are structured to reflect the focus of each section to ensure order and to avoid vagueness. We thank the reviewer for this constructive comment and the suggested approach to the discussion of the results. As suggested, we present the outcome of the FSE analysis and then discuss based on the overall risk level and top-five risk factors of the case project. We have made the NSDP the focus of the discussion (although with reference to other examples). We also made an effort to and compare/contrast the results with other cases or published literature, which is useful given that our analysis draws on a single case and to enrich our understanding of the critical risk factors. Reference to the literature further supports why the risks identified in the current study are critical. However, an effort was made to remove redundant information from the discussion.
Similar redundancy can be observed in the conclusion section. I hope the conclusion will be redrawn along with the revision of the results.	The Conclusion is re-drawn to reflect the preceding results and discussion. The redundant information is eliminated.
Minor Comments:	We thank the reviewer for the following questions and comments.
1) what do you mean by complexity (line 90)?	to better convey the intension of the authors (Lines 91-92).

2) Line: 265, how the validation was undertaken?	We submit that:
	Lines 274-275: The consultant was asked to indicate the important financial risk factors that apply to the NSDP project.
3) Line:274; what are the criteria to judge for significant?	'Significant' as used here (Line 285) denote the 18 risk factors that were considered important or applicable to the NSDP project following the review and verification of the shortlisted risk factors (25) by the consultant.
4) Lines: 346 to 349, it's unclear on how do you calculate the mean, STD please explain how did you do that in your case.	The mean criticality index scores were calculated through Equation (4) and this has been explained.
	Regarding standard deviation, we submit that:
	Lines 357-358: Standard deviation values were calculated using SPSS statistical package 21.0 (Pallant, 2005).
Associate Editor	
The reviewers provide a lot of valuable criticisms, comments, and suggestions. The author is requested to revise the paper according to the reviewers' opinions.	We are grateful to the reviewers for their constructive comments and suggestions. We have responded to all the comments appropriately.

## **References**<sup>1</sup>

Lo, S.M. (1999) A fire safety assessment system for existing buildings. *Fire Technology*, 35(2), 131–52.

- Li, T.H.Y., Ng, S.T. and Skitmore, M. (2013) Evaluating stakeholder satisfaction during public participation in major infrastructure and construction projects: A fuzzy approach. *Automation in Construction*, 29, 123–135.
- Murphy, M.E., Perera, S. and Heaney, G. (2015) Innovation management model: a tool for sustained implementation of product innovation into construction projects. *Construction Management and Economics*, 33(3), 209-232.

<sup>&</sup>lt;sup>1</sup>Note: Only references not included in the manuscript are provided here.

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