

## Developing a Benchmarking Model for Construction Projects in Hong Kong

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**Abstract:** This paper attempts to incorporate both leading and lagging KPIs and apply the reliability interval method (RIM) to formulate a benchmarking model to assess project success in Hong Kong. A list of leading and lagging KPIs was compiled based on a comprehensive literature review. This list of KPIs was used to develop a survey questionnaire and RIM was subsequently used to analyze the survey results and determine the relative importance and rankings of various leading and lagging KPIs. The results reveal that the top 10 KPIs to evaluate the success of construction projects in Hong Kong (in descending order) were: (1) safety performance; (2) cost performance; (3) time performance; (4) quality performance; (5) client's satisfaction; (6) effectiveness of communication; (7) end user's satisfaction; (8) effectiveness of planning; (9) functionality; and (10) environmental performance. Finally, a composite performance index (CPI) was derived by means of RIM to provide a comprehensive assessment of construction project success in Hong Kong. Different construction projects can now be assessed on the same basis for benchmarking and project monitoring

purposes. Construction senior executives and project managers can thus use the CPI to measure, evaluate and improve the performance of their construction projects at various stages of the project life cycle (i.e. pre-planning phase, planning phase, design phase, construction phase, and commissioning phase). Although the CPI was developed locally in Hong Kong, the research methods could be replicated elsewhere to produce similar indices for international comparisons. Such an extension would enhance the understanding of managing construction projects across different places.

**CE Database subject headings:** Benchmark; Construction management; Hong Kong.

**Author keywords:** Benchmarking; Key performance indicators (KPIs); Composite performance index (CPI); Reliability interval method (RIM); Hong Kong.

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## **Introduction**

Over the past decade, many researchers have applied the concept of Key Performance Indicators (KPIs) to conduct benchmarking studies in the construction management discipline (Cox et al. 2003; Chan and Chan 2004; Lee et al. 2005; Costa et al. 2006; Yeung et al. 2007, 2009). However, Beatham et al. (2004) and Costa et al. (2006) criticized that the most significant problem with the KPIs in their current format is that they do not offer the opportunity for organizational change. They are designed to be used as ex-post “lagging” KPIs, which are used to assess performance results of completed projects. They do not offer the opportunity to change performance or alter the result of associated performance of on-going projects. They are used only as a historic review. Therefore, the use of leading KPIs was advocated to provide early warnings, identify potential problems, and highlight any needs for further investigation or actions. Leading KPIs do offer the opportunity to change. They are measures of performance whose results are used to predict future performance of the activity being measured and present the opportunity to change practice accordingly, or to enable future decisions to be made on future associated activities based on the outcome of previous activities. In fact, few, if any, researchers have tried to incorporate both leading and lagging KPIs to compile a Composite Performance Index (CPI) for measuring the overall performance of construction projects, thus making benchmarking and project monitoring ineffective. In addition, they seldom consider the impact of the fuzziness of an individual KPI on the evaluation of the performance of a

construction project. This paper, therefore, aims to incorporate both leading and lagging KPIs and apply RIM to compile a CPI to assess the performance of construction projects in Hong Kong. By doing so, different construction projects can be evaluated on the same basis for benchmarking and project monitoring purposes. Construction senior practitioners and project managers can thus adopt the CPI to measure, evaluate and improve the performance of their construction projects to achieve excellence at different stages of the project life cycle.

## **Background of Study**

Many researchers have conducted research on project performance evaluation and benchmarking in the construction management discipline. Cox et al. (2003) stated that there is a great need in the construction industry for identifying a set of common indicators to be used by construction executives and project managers in measuring construction performance at the project level. The focus of the research was to collect management perceptions of the KPIs currently utilized in the construction industry. They concluded that six indicators, including (1) quality control; (2) on-time completion; (3) cost; (4) safety; (5) \$/unit; and (6) units/MHR were reported as being most useful by every segment of the construction industry. Chan and Chan (2004) developed a framework for measuring success of construction projects. The framework is composed of a set of KPIs, which are measured both objectively and subjectively. The validity of the proposed KPIs was also tested by three case studies. Lam et al. (2007) developed a project success index (PSI) to benchmark the performance of design-build projects from a number of KPIs. The findings showed that time, cost, quality, and functionality should be the principal success criteria for D&B projects. Yeung et al. (2007) developed a model using the Delphi survey technique to objectively measure the performance of partnering projects in Hong Kong. The results indicated that the top-7 weighted KPIs to evaluate the success of partnering projects in Hong Kong were: (1) time performance; (2) cost performance; (3) top management commitment; (4) trust and respect; (5) quality performance; (6) effective communications; and (7) innovation and improvement. Finally, a composite Partnering Performance Index (PPI) for partnering projects in Hong Kong was derived to provide an all-round assessment of partnering performance. Later, Yeung et al. (2009) applied the same Delphi survey technique to formulate a model to assess the success of relationship-based construction projects in Australia. The Delphi survey selected eight KPIs to evaluate the success of relationship-based projects in Australia. These KPIs included: (1) client's satisfaction; (2) cost performance; (3) quality performance; (4) time performance; (5) effective communication; (6)

safety performance; (7) trust and respect; and (8) innovation and improvement. An equation for calculating a performance index for relationship-based projects in Australia has been finally derived. It should be highlighted that these developed indices were composed of a set of lagging KPIs and they could be used to measure, monitor, and improve the performance of their completed construction partnering and relationship-based projects. This paper provides an objective basis for measuring and predicting project performance at different stages of the project life cycle by means of both leading and lagging KPIs.

## **Research Methodology**

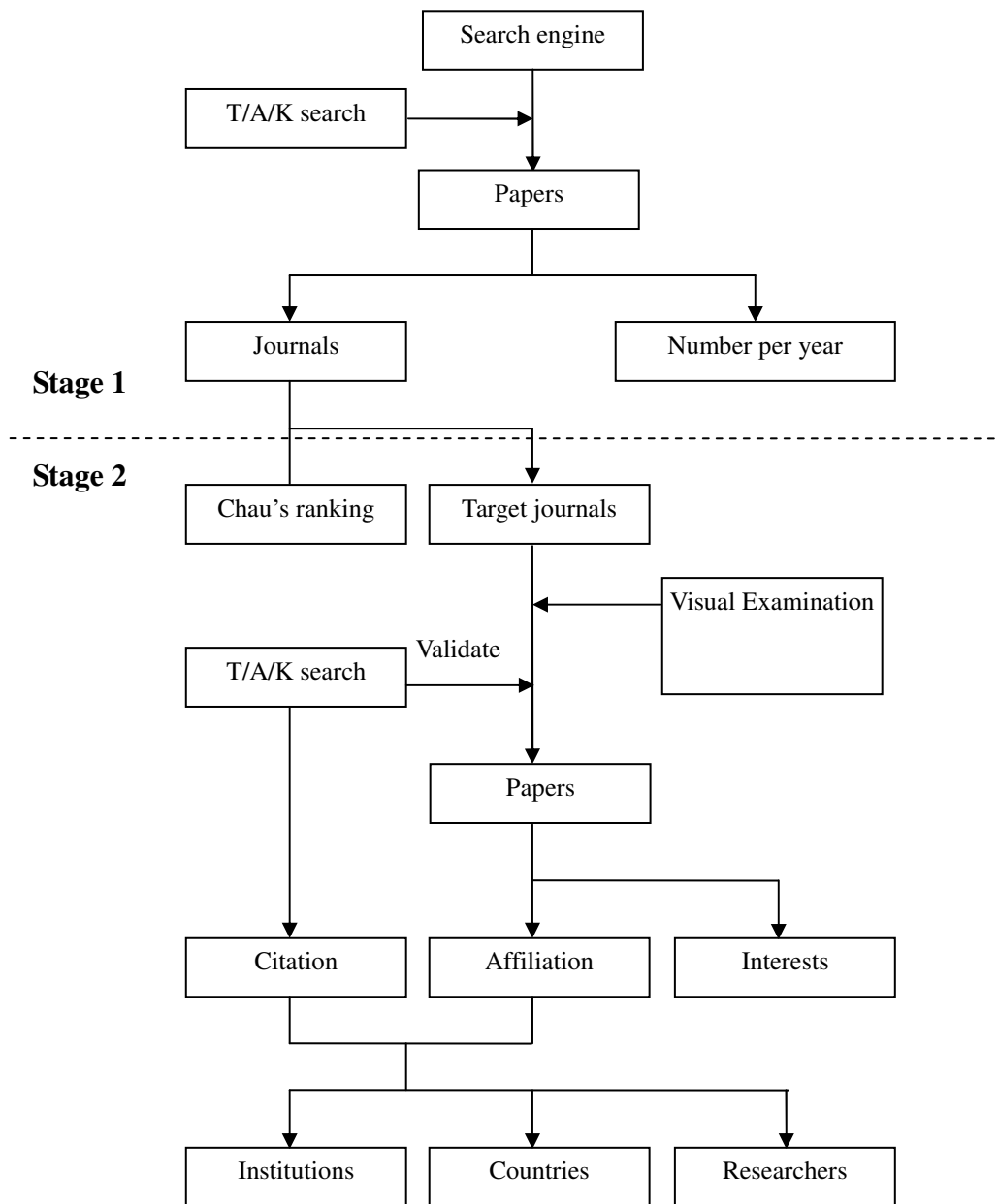
The research methods employed included: (1) a comprehensive and critical literature review; (2) empirical questionnaire survey; and (3) weighting assessment relating to the empirical questionnaire survey results by means of RIM.

## **Literature Review**

In order to acquire a clear understanding of benchmarking related research, this study carried out a two-stage literature review to conduct a content analysis of benchmarking related articles from 1998 to April of 2009, which is presented in Figure 1.

In stage 1, the search engine "Scopus" was used to conduct the literature search under the "Title/Abstract/Keyword" field. Search keywords included "Key Performance Indicators", "KPIs", "Benchmark", "Benchmarking", "Project Success", "Performance Measurement", "Performance Measure", "Critical Success Factors", "CSFs", "Critical Success Factor", "CSF", "Best Practice", "Best Practices", and "Continuous Improvement". Over thirty thousand (30,766) articles were so identified on 14 April 2009. The search included many irrelevant publications. To narrow down the search, only the construction journals that have published the most benchmarking papers were chosen. The results in stage 1 revealed that *International Journal of Project Management*, *Construction Management and Economics*, *Journal of Construction Engineering and Management*, *Journal of Management in Engineering*, and *Engineering, Construction and Architectural Management* have published the most benchmarking related papers in construction, and were thus selected as target journals in stage 2. As *Benchmarking: An International Journal* has published the largest number of benchmarking related studies, of which most are related to construction, it is also included as a target journal in stage 2. It should be noted that these journals were also ranked high in the ranking of Chau (1997). These selection

processes reinforce each other. The number of papers so identified was trimmed down to 572.



Note: T/A/K - Title/Abstract/Keywords

**Figure 1.** Two-stage literature review for this Study (Ke et al. 2009)

Table 1 shows the level of relevance of the 572 papers with benchmarking in construction, as evaluated according to their abstracts. It shows that 14 papers are classified as “Very Relevant” or above on benchmarking in construction (Table 1). These 14 papers were fully reviewed and a total of 56 performance indicators (including both leading and lagging performance indicators) were

identified (Table 2). Since the meanings of some performance indicators are similar in nature, they were combined together. For example, the meanings of “cost performance”, “project cost growth (owner)”, “project budget factor (contractor)”, “change cost factor”, “predictability cost”, “factor phase cost growth (owner data only)”, and “phase cost factor (owner)” are similar in nature, they are combined together as “cost performance”. Other performance indicators, such as time performance, safety performance, and quality performance, are combined in a similar way. By using this method, a total of 28 performance indicators were thus derived (Table 3). Furthermore, 8 of them were cited for one time only, they were regarded as less important so they are not chosen for further analysis. Finally, a total of 20 KPIs were selected for the development of the survey questionnaire. It should be noted that 7 out of the 20 KPIs, including (1) productivity performance; (2) project team satisfaction; (3) effectiveness of risk management; (4) effectiveness of planning; (5) provision of training courses; (6) effectiveness of material management and resource management; and (7) effectiveness of communication, are leading measures because they offer the opportunity to change performance or alter the result of associated performance of on-going construction projects.

### *Questionnaire Survey*

The questionnaire was then developed based on the KPIs identified from the comprehensive and critical literature review. The results of the survey would be used to develop appropriate weightings for different KPIs. There were two major sections in the questionnaire, encompassing: (1) background information of survey respondents; and (2) evaluation of appropriate weightings for a list of KPIs to assess the project success in Hong Kong. These two parts were to be answered by survey respondents with interval grading so that RIM can be facilitated. A total of 1,200 self-administered blank questionnaires were sent to target industrial practitioners via postal mail and 233 completed questionnaires were returned, representing an acceptable response rate of 19.42%. The professional affiliation for the 233 survey respondents included architect (7.7%), building surveyor (6.4%), quantity surveyor (7.3%), project manager (10.7%), engineer (51.1%), builder (4.7%), and others (12%). Most of them worked in either client organizations or main contractors (Table 4). A majority of them had more than 10 years of professional working experience (Table 5). It is believed that they possessed adequate knowledge and rich hands-on experience to evaluate the importance of each KPI on construction projects in Hong Kong. In order to assess the weighting for each KPI, the proper weighting assessment method must take into account the fuzzy nature of its perceived importance. The following section presents two possible weighting assessment methods.

### ***Weighting Assessment Methods***

It is important to choose the appropriate weighting assessment method since this directly affects the accuracy of evaluating the success of a construction project. Two weighting assessment methods were considered in this study. They are: (1) the Analytical Hierarchy Process (AHP); and (2) RIM.

AHP is a theory of measurement adopting pair-wise comparisons. It relies much on the judgments of experts to derive priority scales. It is these scales that measure the intangibles in relative terms. The comparisons are made using a scale of absolute judgments that represent the extent to which one element dominates another with respect to a given attribute (Saaty 2008). Yiu et al. (2005) reported that there are two major limitations of AHP. First, it is difficult to avoid inconsistency between pair-wise comparisons even if assessors have comprehensive explanations of the factors and sub-factors. Second, assessors may find it difficult to determine an exact weighting for some factors because they are vague in nature. In other words, the use of AHP is not able to cope with fuzziness satisfactorily and assessors may not be able to provide appropriate weightings when they find it difficult to weigh these vague criteria. These limitations make AHP not suitable in this study.

#### **Reliability Interval Method (RIM)**

With reference to Moore's (1979) research work, Lo et al. (2001) developed RIM to assess fire risk for high-rise buildings. RIM is particularly useful in handling imprecise information. It requires assessors to weigh a factor using a fuzzy range of numbers. For example, assessors can weigh a factor as a range of 3 to 5, [3, 5], instead of an exact value of [4]. The influence of a KPI on the performance of a project is greater if the weighting is higher. Since pair-wise comparisons are not needed in this assessment method, the problem of inconsistency arising from pair-wise comparison is removed. This method can also determine the degree of reliability, center variance (CV), and interval variance (IV). According to Lo et al. (2005), the degree of reliability is the proportion of the ranges weighted by the assessors which falls within the average range. CV and IV indicate the consistency of opinions amongst survey respondents. Yiu et al. (2005) used RIM to develop weightings for different decision criteria and their sub-criteria in evaluating cost estimator's performance. Lo et al. (2005) stated that this method is particularly practical when the number of factors and sub-factors are large because the use of pair-wise comparisons in AHP may lead to a lengthy questionnaire. RIM was therefore chosen for this research as an appropriate weighting assessment method for determining the weightings of each KPI. This method mitigates the

problem of fuzziness during the evaluation of appropriate weightings for a list of KPIs.

***Two assumptions are made for the development of RIM:***

- (1) The probability distribution function within the interval is linear;
- (2) Equal weighting is given to the opinions of the different experts.

To allow statistical analysis of the results, RIM provides three parameters with the fuzzy assessment of weightings, namely, reliability, center variance (CV) and interval variance (IV). The reliability illustrates the proportion of the ranges weighted by the experts that falls within the average range. The value of CV reflects the difference between the grade eigenvalue ( $\zeta_j$ ) and the average of interval grades ( $l_{ij}$  and  $r_{ij}$ ) for a particular KPI. The value of IV reflects the difference between the grade eigenvalue ( $\zeta_j$ ) and the interval value  $l_{ij}$  or  $r_{ij}$  (which has a larger difference with the grade eigenvalue). The consistency of opinions among experts can be reflected with the use of these two variances. The smaller the values of center variance (CV) and interval variance (IV) are, the more consistent are the opinions of the respondents (Lo et al. 2001, 2005; Yiu et al. 2005).

## **Research Findings and Discussions**

Table 6 indicates the results of the average interval grades for each KPI obtained from the 233 completed and valid questionnaires. Table 7 shows the survey results of the respondents' weightings of each KPI. Since RIM has only been recently applied to the construction management discipline, the following principles should be noted. Lo et al. (2001) stated that when the weightings of two factors are nearly the same, the one with the higher reliability and the vice versa is actually more reliable. They further stated that a low value of variance indicates that a higher level of consistency exists amongst survey respondents, and vice versa. Yiu et al. (2005) conducted questionnaires on performance evaluation for cost estimators and suggested that when adopting RIM, an achievement of 65% in reliability could be regarded as "reasonably good". They also took the view that only minor inconsistencies in opinions exist amongst clients if the values of average center and interval variances are lower than 0.65 and 2.10 respectively. Accordingly, cut-off values of 0.65, 0.65 and 2.10 for reliability, center variance (CV) and interval variance (IV) respectively were used in selecting appropriate KPIs in this study. In total, 18 KPIs met these requirements and the top-10 weighted KPIs were selected for compiling the CPI to assess the success of a construction project in Hong Kong. The



top-10 weighted KPIs were selected because all of their weightings are larger than 0.05. The rationale for choosing 0.05 as the cut-off value is mainly because 0.05 is the average value of all the KPIs' weightings. Since the weightings of top-10 weighted KPIs are larger than 0.05, they were selected to form the CPI.

Table 7 portrays the results of rankings and weightings of the 20 identified KPIs in descending order. The results reflect that "Safety Performance" is considered as the most important KPI for construction projects in Hong Kong. Its reliability nearly reaches 82%, which is satisfactory. The center variance (CV) and interval variance (IV) of this KPI are small (0.32490 and 0.85009 respectively) and this implies that the opinions of the survey respondents are very consistent. With high reliability and small variances, the top rank of this KPI is justified. In fact, "Safety" becomes the most core value in many contracting firms. Zero Harm Target was advocated by a leading contractor in Hong Kong since 2010 (Gammon Construction 2010). PASS scores administered by the Hong Kong Housing Authority (HKHA) are composed of a major component on safety issues. If a contractor scores low in PASS (Performance Assessment Scoring System), its tendering right might be jeopardized which is an effective means to ensure safety compliance from the contractor (Chan et al. 2006). Similar policies apply in other public works projects administered by the Hong Kong SAR Government. If a contractor achieves a poor safety record, its senior management needs to be interviewed by the Contractors Registration Committee (CRC) under the Buildings Ordinance before its registration can be renewed. The second and the third most important KPIs are "Cost Performance" and "Time Performance", with weightings of 0.05763 and 0.05762 respectively. These two KPIs achieve a reliability of nearly 93% and 95% respectively and their CV (0.28111 and 0.24727, respectively) and IV (0.93499 and 0.91820, respectively) are also small, which show that the opinions of survey respondents are consistent.

It is commonly accepted that project success is measured by project performance in terms of cost, time, and quality (Chan et al. 2002). Our research findings are consistent with this traditional wisdom because cost performance, time performance, and quality performance take the second, third, and fourth positions respectively in this study. In addition, the findings also emphasize the importance of safety performance and client's satisfaction. This implies that industrial practitioners in Hong Kong take safety seriously. In fact, the accident rate per 1000 workers has decreased from 247.9 in 1998 to 60.0 in 2007 (Hong Kong Labor Department 2009). In order to compile a composite indicator to evaluate the performance of construction projects in Hong Kong, a

Composite Performance Index (CPI) is developed which can be represented by the following formula:

$$\begin{aligned} \text{CPI} = & \textit{0.1086} \times \textit{safety performance} & + & \textit{0.1058} \times \textit{cost performance} \\ & + \textit{0.1058} \times \textit{time performance} & + & \textit{0.1018} \times \textit{quality performance} \\ & + \textit{0.0991} \times \textit{client's satisfaction} & + & \textit{0.0969} \times \textit{effectiveness of communication} \\ & + \textit{0.0968} \times \textit{end user's satisfaction} & + & \textit{0.0959} \times \textit{effectiveness of planning} \\ & + \textit{0.0955} \times \textit{functionality} & + & \textit{0.0937} \times \textit{environmental performance} \end{aligned}$$

Note: *Italic fonts* refer to “leading” KPIs

The coefficients are the “normalized” individual weightings of the top-10 weighted KPIs, which are calculated by dividing their individual weightings by the total weightings of top-10 weighted KPIs. For example, the coefficient of safety performance is calculated by  $0.05914 \div (0.05914 + 0.05763 + 0.05762 + 0.05541 + 0.05396 + 0.05274 + 0.05270 + 0.05226 + 0.05202 + 0.05100)$ , which is equal to 0.1086. The CPI is derived based on the assumption that this is a linear and additive model (Frisch et al. 1992; Curtin 1982; Nielsen 2001; Ramaswami and Roe 2004; Yeung et al. 2007 & 2009; Xu et al. 2010). It is logical and valid to derive this linear and additive model because the correlation matrix as shown in Table 8 reveals that most of the top-10 weighted KPIs are not highly correlated with each other at 1% significance level. In fact, the linear and additive model has been widely applied in many different areas. Frisch et al. (1992) developed the Quality of Life Inventory (QOLI), a measure of life satisfaction, which was based on an empirically validated, linear, and additive model. Nielsen (2001) introduced semi-parametric unmixing, which was based on a linear and additive model with a non-linear smooth function to represent end-member spectra. Ramaswami and Roe (2004) stated that a linear additive model can be useful in any kind of risk analysis where it is vital to distinguish between systemic and non-systemic risks. Yeung et al (2007 & 2009a) developed a Partnering Performance Index (PPI) for measuring the partnering performance of construction projects in Hong Kong by using a linear and additive model. Similarly, Yeung et al. (2009b), which was based on a linear and additive model, developed a Performance Index (PI) for measuring the performance of relationship-based construction projects in Australia. Xu et al. (2010) developed a fuzzy risk allocation model for PPP projects in Mainland China. By using a linear and additive model, the Risk Carrying Capability Index (RCCI) was developed to evaluate the acceptable risk level of each project participant. Supporting evidences concerning the appropriateness of applying a linear and additive model in this research study were provided because acceptable levels of model accuracy have been achieved in these studies (please

refer to the table in Appendix 1). Practically speaking, it is simpler and easier to use this model to measure the performance of construction projects in the Hong Kong construction industry (Nielsen 2001; Xu et al. 2010) because the procedures involved in the calculations are much simpler and easier when compared with a non-linear and multiplicative model.

In order to provide a greater flexibility to assessors to objectively, reliably and practically use the model, it is more appropriate to define reasonable quantitative ranges (QRs) for each KPI. In this research, a construction project with “good” time performance would be one between 4.5 scores and 5.5 scores (based on a 7-point Likert scale where 1 = Worst; 2 = Very Bad; 3 = Bad; 4 = Average; 5 = Good; 6 = Very Good; and 7 = Excellent). In this example, the lower boundary for the “good” time performance was simply taken as the average value of the “average” time performance and “good” time performance, whereas, the upper boundary for the “good” time performance was taken as the average value of the “good” time performance and the “very good” time performance. Similar approaches were adopted by Chow and Ng (2007) and Yeung et al. (2008). It is recognized that applying fuzzy membership functions to derive QRs for each KPI is an appropriate means for measurements involving fuzziness. However, to achieve this, another empirical questionnaire survey needs to be conducted which has not yet been executed in the current study because of time and cost constraints. An equally useful, valid, and scientific method as adopted by Chow and Ng (2007) in taking the average value of the lower and upper limits of each two consecutive performance levels to derive the QRs was adopted in the current study.

### **Case Studies – Application of KPIs and CPI**

A set of KPIs and the CPI have been developed in the previous section. In order to demonstrate the application of KPIs and CPI to measure the performance of construction projects in Hong Kong, three case studies were examined. The scope of analysis under each case study covers the project performance of safety, cost, time, quality, client’s satisfaction, effectiveness of communication, end user’s satisfaction, effectiveness of planning, functionality, together with environmental performance. Table 9 shows the summary of the background information and the results of different KPIs and CPI of these three case studies in Hong Kong. The details of each case study are discussed in the following subsections.

### ***Case 1 – Civil Engineering Project***

It is a civil engineering work, with total contract duration of 92 months and a total contract sum of US\$192.3077 million (HK\$1,500 million). The project was procured with sequential traditional method with tendering open to listed contractors and the payment mechanism was lump sum with bills of provisional quantities (re-measurement). The survey respondent perceived that 8 out of 10 weighted KPIs were constructed with “excellent” performance. The 8 weighted KPIs included: (1) safety performance; (2) time performance; (3) quality performance; (4) client’s satisfaction; (5) effectiveness of communications; (6) end user’s satisfaction; (7) functionality; and (8) environmental performance. The other 2 weighted KPIs, including cost performance and effectiveness of planning, were perceived to have “very good” performance. As a whole, a CPI score of 6.80 out of a total of 7 was computed which suggests a project with “excellent” performance.

### ***Case 2 – Building Project***

It is a building work, with total contract duration of 30 months and a total contract sum of US\$58.98 million (HK\$460 million). The project was tendered with restricted tendering method and the payment mechanism was lump sum with bills of quantities. It was procured with management contracting. The survey respondent perceived that 9 out of 10 weighted KPIs were constructed with “good” performance. The 9 weighted KPIs were: (1) safety performance; (2) cost performance; (3) time performance; (4) quality performance; (5) client’s satisfaction; (6) effectiveness of communications; (7) end user’s satisfaction; (8) functionality; and (9) environmental performance. The remaining weighted KPI, effectiveness of planning, was perceived to have “average” performance. As a whole, the CPI was found to be 4.90 (out of a total of 7), suggesting a project with “good” performance.

### ***Case 3 – Building Project***

It is a building work, with total contract duration of 48 months and a total contract sum of US\$192.31 million (HK\$1,500 million). The project was procured with sequential traditional method with tendering open to listed contractors and the payment mechanism was lump sum with bills of quantities. The survey respondent perceived that 5 out of 10 weighted KPIs were constructed with “very bad” performance. These included: (1) safety performance; (2) cost performance; (3) time performance; (4) quality performance; and (5) client’s satisfaction. Four of 10 weighted KPIs were

perceived to have “average” performance, which included: (1) effectiveness of communications; (2) end user’s satisfaction; (3) functionality; and (4) environmental performance. The remaining weighted KPI, effectiveness of planning, was perceived to have “bad” performance. As a whole, the CPI stood at 2.86 (out of a total of 7), implying a project with “bad” performance.

### **Significance and Limitations of the Research**

The development of a series of both weighted leading and lagging KPIs is very important. Otherwise, without an ex-ante evaluation of the performance level of construction projects, project managers would find it difficult to allocate their limited resources in the most efficient and effective way. Their decisions are often made by perceived intuition, and they cannot ensure whether their actions are correct or not. The proposed model provides an objective basis for not only measuring but indeed predicting the performance of an on-going construction project. The prediction of project performance may be conducted on an on-going project once in a month (i.e. at the end of each month). The model can be applied to measure, evaluate, and monitor the performance of their individual construction project at different stages of the project life cycle and right up to completion. The CPI not only enhances the understanding of clients, contractors, and consultants to run a successful construction project, but also it sets a solid base for industrial practitioners to measure, evaluate, and monitor the performance of their individual construction projects right up to completion. In addition, the CPI helps set a benchmark for measuring the performance of a portfolio of construction projects within an organization, so that this can help improve the overall performance of the firm through proper monitoring and control of its projects. It also provides valuable insights into developing a strong and comprehensive base for future research, for instance, identifying critical success factors for current construction projects and then developing a best practice framework for them. A similar research method can also be extended to develop a benchmarking model for construction projects internationally.

However, it is worth noting that it is likely for different evaluators to have their own semantic interpretation of each KPI. For instance, an evaluator may use “Percentage of conformance to the specifications” to measure quality performance while another assessor may adopt “Number of non-conformance reports generated per month” to measure it. Even though a mutually agreed set of linguistic interpretations exists, its qualitative nature could lead to subjective judgment instead of evidence-based consideration. Thus it is desirable to identify appropriate quantitative interpretations/indicators (QIs) for

each KPI in order to avoid any possible discrepancies in interpreting the meaning of each KPI and provide objective evaluation results based on quantitative evidence. By incorporating these quantitative indicators into the evaluation process, evaluators could perform their evaluation based on quantitative evidence.

## **Conclusions**

KPIs in construction have been discussed for many years, but there are not many comprehensive and systematic studies on both leading and lagging KPIs. This study has applied RIM to develop a model to objectively measure and forecast the performance of construction projects in the Hong Kong construction industry. The descending order of the top-10 weighted KPIs identified were found to be: (1) safety performance, with the normalized weighting of 0.1086; (2) cost performance, with the normalized weighting of 0.1058; (3) time performance, with the normalized weighting of 0.1058; (4) quality performance, with the normalized weighting of 0.1018; (5) client's satisfaction, with the normalized weighting of 0.0991; (6) effectiveness of communication, with the normalized value of 0.0969; (7) end user's satisfaction, with the normalized value of 0.0968; (8) effectiveness of planning, with the normalized value of 0.0959; (9) functionality, with the normalized value of 0.0955; and (10) environmental performance, with the normalized value of 0.0937. The KPIs' framework for construction projects helps develop a CPI and sets a benchmark for measuring the performance of construction projects in Hong Kong. Different construction projects can then be evaluated and compared objectively based on this CPI established. As a result, construction senior executives and project managers can use the CPI to measure, monitor, and upgrade the performance of their construction projects at different stages of the project life cycle. It also deepens the current body of knowledge and understanding of both academics and practitioners in the construction industry to achieve outstanding construction project performance.

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**Table 1.** Level of Relevance to Benchmarking Related Studies in Construction for Reviewed Journal Abstracts

Level of relevance to benchmarking studies in construction	Descriptor	Total number of journal abstracts reviewed
Not relevant = 0	The aim of the paper is not relevant to benchmarking study in construction. The keywords selected for the Scopus database search are rarely mentioned in the abstract. In addition, the paper title and keywords do not reflect any relevance on benchmarking study.	379
Least relevant = 1	The aim of the paper is least relevant to benchmarking study in construction. The keywords selected for the Scopus database search are seldom mentioned in the abstract. Besides, the paper title and keywords only reflect a low level of relevance on benchmarking study.	70
Slightly relevant = 2	The aim of the paper is slightly relevant to benchmarking study in construction. The keywords selected for the Scopus database search are sometimes mentioned in the abstract. Moreover, the paper title and keywords reflect a moderate level of relevance on benchmarking study.	30
Relevant = 3	The aim of the paper is relevant to benchmarking study in construction. The keywords selected for the Scopus database search are mentioned in the abstract. In addition, the paper title and keywords reflect a high level of relevance on benchmarking study.	79
Very relevant = 4	The aim of the paper is very relevant to benchmarking study in construction. The keywords selected for the Scopus database search are frequently mentioned in the abstract. In addition, the paper title and keywords reflect a very high level of relevance on benchmarking study.	12
Most relevant = 5	The aim of the paper is extremely relevant to benchmarking study in construction. The keywords selected for the Scopus database search are very frequently mentioned in the abstract. In addition, the paper title and keywords reflect an extremely high level of relevance on benchmarking study.	2
Total		572

**Table 2.** Performance Indicators for Construction Projects

Performance Indicators	Chan et al. (2002)	Cox et al. (2003)	Westerveld (2003)	Beatham et al. (2004)	Chan and Chan (2004)	Ramirez et al. (2004)	Lee et al. (2005)	Costa et al. (2006)	El-Mashaleh et al. (2007)	Yeung et al. (2007 & 2009)	Lam et al. (2008)	Ling et al. (2008)	Lau et al. (2008)	Total
1. Schedule/Time performance	✓	✓	✓		✓	✓			✓	✓	✓	✓	✓	10
2. Cost performance	✓	✓	✓		✓	✓			✓	✓	✓	✓	✓	10
3. Safety performance/Accident rate	✓	✓		✓	✓	✓		✓	✓	✓	✓	✓	✓	9
4. Profit/Profitability	✓			✓	✓	✓		✓	✓	✓		✓		7
5. Client's satisfaction	✓		✓	✓	✓	✓		✓	✓	✓		✓		7
6. Quality performance			✓		✓	✓			✓	✓	✓	✓		6
7. Total field rework factor (leading measure)/Scope of rework		✓			✓	✓		✓	✓	✓	✓	✓		5
8. Productivity performance (leading measure)	✓			✓		✓		✓	✓	✓				5
9. Environmental performance	✓			✓	✓				✓	✓				4
10. End user's satisfaction (on services or on products or on projects)					✓				✓	✓			✓	4
11. Project cost growth (owner)							✓	✓	✓	✓				3
12. Project budget factor (contractor)							✓	✓	✓	✓				3
13. Functionality	✓				✓						✓			3
14. Recordable incident rate (contractor)							✓	✓	✓					3
15. Project schedule factor								✓	✓					2
16. Project schedule growth								✓	✓					2
17. Lost workday case incident rate								✓	✓					2
18. Change cost factor								✓	✓					2
19. Defects								✓	✓					2
20. Predictability cost				✓				✓	✓					2
21. Predictability time				✓				✓	✓					2
22. Extent and layer of subcontracting								✓	✓					2
23. Efficiency of direct labor						✓		✓	✓					2
24. Effectiveness of risk management (leading measure)				✓		✓		✓	✓					2
25. Effectiveness of planning (leading measure)						✓		✓	✓					2
26. Project team satisfaction (leading measure)				✓				✓	✓					2
27. Provision of training courses (leading measure)				✓				✓	✓					2
28. Effectiveness of material management and resource management (leading measure)		✓											✓	2
29. Professional image establishment									✓		✓			2
30. Innovation and improvement				✓					✓	✓	✓			2
31. Claim avoidance									✓	✓	✓			2
32. Effectiveness of communication (leading measure)				✓					✓	✓	✓			2
33. Staff turnover		✓		✓										2
34. Experience modification rating (EMR)									✓					1
35. Project management expenses									✓					1
36. Total project duration								✓						1
37. Factor phase cost growth (owner data only) (leading measure)								✓						1
38. Phase duration factor (leading measure)								✓						1
39. Construction phase duration (leading measure)								✓						1
40. Percentage of plan completed (leading measure)								✓						1
41. Supplier performance (leading measure)								✓						1
42. No. of nonconformity in audits (leading measure)								✓						1
43. Rate of employees trained (leading measure)								✓						1
44. Quality management system (QMS)													✓	1
45. Project team performance													✓	1

**Table 2. (Continued)**

46. Change management													√	1
47. Labor safety management													√	1
48. Phase cost factor (owner)														1
49. Zero accident techniques practice use (owner)														1
50. Litigation avoidance													√	1
51. Dispute avoidance													√	1
52. Harmonious working relationships													√	1
53. Long-term business relationship													√	1
54. Top management support													√	1
55. Employee's attitude													√	1
56. Understanding client needs														1
<b>Total</b>	<b>8</b>	<b>6</b>	<b>4</b>	<b>15</b>	<b>9</b>	<b>10</b>	<b>5</b>	<b>30</b>	<b>15</b>	<b>20</b>	<b>7</b>	<b>5</b>	<b>8</b>	

**Table 3.** Performance Indicators after Consolidation for Construction Projects

Performance indicators	Chan et al. (2002)	Cox et al. (2003)	Westerveld (2003)	Beatham et al. (2004)	Chan and Chan (2004)	Ramirez et al. (2004)	Lee et al. (2005)	Costa et al. (2006)	El-Mashaleh et al. (2007)	Yeung et al. (2007 & 2009)	Lam et al. (2008)	Ling et al. (2008)	Lau et al. (2008)	Total
1. Cost performance	√	√	√	√	√	√	√	√	√	√	√	√	√	13
2. Schedule/Time performance	√	√	√	√	√	√		√	√	√	√	√	√	12
3. Safety performance/Accident rate	√	√		√	√	√	√	√	√	√	√		√	11
4. Quality performance		√	√	√	√	√		√	√	√	√	√	√	11
5. Profit/Profitability	√			√	√			√	√	√		√		7
6. Client's satisfaction	√		√	√	√			√		√		√		7
7. Productivity performance (leading measure)	√			√		√		√		√				5
8. Environmental performance	√			√	√					√				4
9. End user's satisfaction (on services or on products or on projects)					√				√	√			√	4
10. Functionality	√				√						√			3
11. Project team satisfaction (leading measure)				√				√					√	3
12. Extent and layer of subcontracting						√		√						2
13. Effectiveness of risk management (leading measure)				√				√						2
14. Effectiveness of planning (leading measure)						√		√						2
15. Provision of training courses (leading measure)				√				√						2
16. Effectiveness of material management and resource management (leading measure)		√											√	2
17. Professional image establishment										√	√			2
18. Innovation and improvement				√						√				2
19. Claim avoidance										√	√			2
20. Effectiveness of communication (leading measure)				√						√				2
21. Project management expenses									√					1
22. Supplier performance (leading measure)								√						1
23. Change management													√	1
24. Harmonious working relationships										√				1

**Table 3.** (Continued)

25. Long-term business relationship										√				<b>1</b>
26. Top management support										√				<b>1</b>
27. Employee's attitude										√				<b>1</b>
28. Understanding client needs				√										<b>1</b>
<b>Total</b>	<b>8</b>	<b>5</b>	<b>4</b>	<b>14</b>	<b>9</b>	<b>7</b>	<b>2</b>	<b>13</b>	<b>7</b>	<b>17</b>	<b>7</b>	<b>5</b>	<b>8</b>	

**Table 4.** Type of Working Organization for Survey Respondents

Type of organization	Frequency	Valid percent	Cumulative percent
Client organization	143	61.4	61.4
Main contractor	39	16.7	78.1
Architectural consultant	8	3.4	81.5
Engineering consultant	13	5.6	87.1
Quantity Surveying consultant	4	1.7	88.8
Project management consultant	5	2.1	91.0
Subcontractor	7	3.0	94.0
Supplier/Manufacturer	2	.9	94.8
Others	12	5.2	100.0
Total	233	100.0	

**Table 5.** Years of Professional Working Experience for Survey Respondents

Years of professional working experience	Frequency	Valid percent	Cumulative percent
Below 5 years	8	3.4	3.4
5-10 years	21	9.0	12.4
11-15 years	30	12.9	25.3
16-20 years	33	14.2	39.5
Over 20 years	141	60.5	100.0
Total	233	100.0	

**Table 6.** Average Interval Grades for 20 KPIs for Construction Projects in Hong Kong

KPIs for construction projects in Hong Kong	Average interval grades
1. Time performance	[3.174, 4.680]
2. Cost performance	[3.740, 4.656]
3. Safety performance	[3.916, 4.700]
4. Profit/Profitability	[2.987, 3.923]
5. Client's satisfaction	[3.479, 4.382]
6. Quality performance	[3.561, 4.512]
7. Productivity performance	[3.054, 3.976]
8. Environmental performance	[3.251, 4.179]
9. End user's satisfaction	[3.394, 4.284]
10. Functionality	[3.324, 4.255]
11. Extent and layer of subcontracting	[2.528, 3.465]
12. Effectiveness of risk management	[3.119, 4.031]
13. Effectiveness of planning	[3.341, 4.273]
14. Project team satisfaction	[2.866, 3.833]
15. Provision of training courses	[2.439, 3.395]
16. Effectiveness of material and resource management	[2.958, 3.879]
17. Professional image establishment	[2.907, 3.799]
18. Innovation and improvement	[2.788, 3.709]
19. Dispute avoidance	[2.867, 3.835]
20. Effectiveness of communication	[3.395, 4.288]

**Table 7.** Results of Reliability Interval Method (RIM) for KPIs Related to Construction Projects in Hong Kong

KPIs for construction projects in Hong Kong	Weighting	Reliability	Centre variance (CV)	Interval variance (IV)
1. Safety performance	0.05914	0.81974	0.32490	0.85009
2. Cost performance	0.05763	0.92704	0.28111	0.93499
3. Time performance	0.05762	0.95279	0.24727	0.91820
4. Quality performance	0.05541	0.92704	0.30568	1.02566
5. Client's satisfaction	0.05396	0.87983	0.39514	1.12176
6. Effectiveness of communication	0.05274	0.85837	0.47722	1.23273
7. End user's satisfaction	0.05270	0.85408	0.42093	1.14217
8. Effectiveness of planning	0.05226	0.87554	0.39412	1.14699
9. Functionality	0.05202	0.90558	0.36175	1.08857
10. Environmental performance	0.05100	0.84979	0.47001	1.20828
11. Effectiveness of risk management	0.04908	0.75966	0.51977	1.24782
12. Productivity performance	0.04826	0.84120	0.38984	0.99513
13. Profit/Profitability	0.04744	0.59307	0.85748	1.71176
14. Effectiveness of material and resource management	0.04693	0.77682	0.47352	1.17108
15. Professional image establishment	0.04603	0.68240	0.73076	1.56802
16. Dispute avoidance	0.04601	0.75966	0.57985	1.40981
17. Project team satisfaction	0.04599	0.76395	0.56225	1.40423
18. Innovation and improvement	0.04460	0.74678	0.62209	1.42950
19. Extent and layer of subcontracting	0.04114	0.75862	0.66686	1.53460
20. Provision of training courses	0.04005	0.77682	0.61361	1.51269



**Table 8.** Correlation Matrix among the Top Ten Weighted Leading and Lagging KPIs (Sample Size = 278)

Correlation matrix	Safety performance	Cost performance	Time performance	Quality performance	Client's satisfaction	Effectiveness of communication	End user's satisfaction	Effectiveness of planning	Functionality	Environmental performance
Safety performance	1	0.414**	0.402**	0.504**	0.506**	0.468**	0.351**	0.345**	0.385**	0.444**
Cost performance		1	0.495**	0.488**	0.573**	0.461**	0.412**	0.456**	0.426**	0.359**
Time performance			1	0.513**	0.612**	0.482**	0.491**	0.538**	0.464**	0.408**
Quality performance				1	0.749**	0.656**	0.689**	0.526**	0.616**	0.540**
Client's satisfaction					1	0.631**	0.687**	0.602**	0.589**	0.541**
Effectiveness of communication						1	0.629**	0.533**	0.560**	0.491**
End user's satisfaction							1	0.552**	0.649**	0.457**
Effectiveness of planning								1	0.588**	0.504**
Functionality									1	0.618**
Environmental performance										1

\*\* . Correlation is significant at the 0.01 level (two-tailed)

**Table 9.** Case Studies: Application of KPIs and CPI

Case study	Case 1	Case 2	Case 3
<b>Background</b>			
Nature of project	Civil work	Building work	Building work
Procurement method	Sequential traditional	Management contracting	Sequential traditional
Tendering method	Tendering open to listed contractors	Restricted tendering	Tendering open to listed contractors
Payment mechanism	Lump sum with bills of provisional quantities (re-measurement)	Lump sum with bills of quantities	Lump sum with bills of quantities
Total contract duration	92 months	30 months	48 months
Total contract sum	US\$192.31 million (HK\$1500 million)	US\$58.98 million (HK\$460 million)	US\$192.31 million (HK\$1500 million)
<b>KPIs survey result</b>			
Safety Performance	Excellent (7 out of 7 scores)	Good (5 out of 7 scores)	Very Bad (2 out of 7 scores)
Cost Performance	Very Good (6 out of 7 scores)	Good (5 out of 7 scores)	Very Bad (2 out of 7 scores)
Time Performance	Excellent (7 out of 7 scores)	Good (5 out of 7 scores)	Very Bad (2 out of 7 scores)
Quality Performance	Excellent (7 out of 7 scores)	Good (5 out of 7 scores)	Very Bad (2 out of 7 scores)
Client's Satisfaction	Excellent (7 out of 7 scores)	Good (5 out of 7 scores)	Very Bad (2 out of 7 scores)
Effectiveness of Communications	Excellent (7 out of 7 scores)	Good (5 out of 7 scores)	Average (4 out of 7 scores)
End User's Satisfaction	Excellent (7 out of 7 scores)	Good (5 out of 7 scores)	Average (4 out of 7 scores)
Effectiveness of Planning	Very Good (6 out of 7 scores)	Average (4 out of 7 scores)	Bad (3 out of 7 scores)
Functionality	Excellent (7 out of 7 scores)	Good (5 out of 7 scores)	Average (4 out of 7 scores)
Environmental Performance	Excellent (7 out of 7 scores)	Good (5 out of 7 scores)	Average (4 out of 7 scores)
<b>Composite Performance Index (CPI)</b>	6.7976 (out of a total of 7)	4.9034 (out of a total of 7)	2.8615 (out of a total of 7)

## Appendix. Comparisons of Levels of Model Accuracy between the Results of Former Studies and the Current Study

Study	Model
1. Frisch et al. (1992)	Frisch et al. (1992) developed the Quality of Life Inventory (QOLI), a measure of life satisfaction, which was based on an empirically validated, linear, and additive model. Test-retest coefficients for the QOLI ranged from 0.80 to 0.91, and internal consistency coefficients ranged from 0.77 to 0.89 across 3 clinical and 3 non-clinical samples.
2. Nielsen (2001)	Nielsen (2001) introduced semi-parametric unmixing, which was based on a linear and additive model with a non-linear smooth function to represent end-member spectra. An example with two generated bands shows that both full unmixing, the Constrained Energy Minimization (CEM), the Iterated CEM and Target Constrained Interference Minimized Filter (TCIMF) methods perform well. A case study with a 30 bands subset of AVIRIS data shows the utility of full unmixing, Spectral Angle Mapping (SAM), CEM and Iterated CEM to more realistic data.
3. Ramaswami and Roe (2004)	Ramaswami and Roe (2004) stated that a linear additive model can be useful in any kind of risk analysis where it is vital to distinguish between systemic and non-systemic risks. The authors have mathematically derived the linear additive model (LAM) from aggregation of micro-production functions.
4. Yeung et al. (2007, 2009a).	Yeung et al (2007 and 2009a) developed a Partnering Performance Index (PPI) for measuring the partnering performance of construction projects in Hong Kong by using a linear and additive model. Three case studies were used to validate the usefulness of the model. In fact, the model has also been validated by seven independent experts who had not previously been involved in the Delphi questionnaire surveys for proper validation.
5. Yeung et al. (2009b)	Yeung et al. (2009b), based on a linear and additive model, developed a Performance Index (PI) for measuring the performance of relationship-based construction projects in Australia. Three case studies were used to validate the usefulness of the model. In addition, it was noted that the Delphi survey technique by its inherent nature serves as a self-validating mechanism because each expert was given a chance to re-evaluate their scores with reference to the consolidated mean scores as assessed by other experts.
6. Xu et al. (2010)	Xu et al. (2010) developed a fuzzy risk allocation model for PPP projects in Mainland China. By using a linear and additive model, the Risk Carrying Capability Index (RCCI) was developed to evaluate the acceptable risk level of each project participant. An illustrative example was used to demonstrate the usefulness of the model.
7. Current study	Yeung et al. (2013), based on a linear and additive model, developed a benchmarking model for construction project in Hong Kong by incorporating both leading and lagging KPIs and applying the Reliability Interval Method (RIM). Three case studies were used to validate the usefulness of the model.