

Variations on Forecasted Construction Cash Flows of Building Projects: A Structural Equation Modelling (SEM) Approach

Kimata N. Malekela^{1,*}, Juma Mohamed¹, Stanslaus K. Ntiyakunze², Musa I. Mgwatu¹

¹College of Engineering and Technology, University of Dar es Salaam, Dar es Salaam, Tanzania

²School of Architecture, Construction Economics and Management, Ardhi University, Dar es Salaam, Tanzania

Abstract There are significant variations between the forecasted and the actual construction cash flows in execution of construction projects due to risk factors inherent in those projects. These risk factors have relationships with variations that occur on forecasted construction cash flows. This research is therefore aimed to analyze the relationships between variations on forecasted construction cash flows and the significant risk factors involved in causing those variations on forecasted construction cash flows in building projects in Dar es Salaam, Tanzania. Also, this study identifies those significant risk factors and formulates a model for analyzing the relationships. This paper reports part of an on-going research concerned with modelling the construction cash flows. A questionnaire survey was administered to different building contractors based in Dar es Salaam, Tanzania. The primary data are mainly analyzed using structural equation modelling (SEM) specifically AMOS software, but statistical package for social sciences (SPSS) version 20 was used for factor reduction in identifying the significant risk factors (analytical variables). The developed model for analyzing the relationships is concluded to be good basing on overall model fit indices which appear quite good (RMSEA = 0.066 < 0.1, CFI = 0.939 and GFI = 0.710 (belong to the range of 0 to 1)). Also, the χ^2 test yields a value of 157.824 with 71 degrees of freedom were found to be significant at 0.01. Furthermore, the study found that there are significant causal relationships between identified significant risk factors and variations on forecasted construction cash flows related to substructure, superstructure, finishings and services installations. Additionally, all variations that occur on forecasted construction cash flows for substructure, superstructure, finishing and services installations are found to be positively correlated to each other in executing building projects. The identified significant risk factors are errors in project documents (Bills of Quantities), consultants' lack of experience and technical skills, poor communication among project participants, unethical practices to consultants, different meanings of specifications, design errors, incomplete information at tender stage and poor/incomplete design. It is therefore recommended that stakeholders in building industry should involve the strategies that can minimize the variations caused by identified significant risk factors on forecasted construction cash flows in execution of building projects. Also, contributing trends of the identified significant risk factors in causing variations on forecasted construction cash flows based on detailed elements of buildings should be established from historical data using contract documents for further modelling.

Keywords Construction cash flows, Variations, Risk factors, Structural Equation Modelling, Building projects, Tanzania

1. Introduction

Normally, variations between the actual and forecasted cash flows in construction projects are caused by risk factors inherent in those projects [13]. Hence, the existence of those risks makes very difficult to attain an accurate forecast of cash flows in construction projects [27]. Also, it has been revealed that there are large variations happened

on forecasted construction cash flows (FCCFs) in most of construction projects due to the risks involved in implementing those projects [21, 23, 24, 27]. In addition, over the past some decades, the issues related to identification of the risk factors and associated variations were ignored by the majority of the developed techniques and literature on construction cash flow forecasting [15, 24]. This situation makes the construction projects to continue experiencing large variations on FCCFs which sometimes disturb the budget of the client [15]. These variations occur in all forms of the project cash flows (i.e. monthly cash flow, staged cash flow and Turnkey cash flow) during execution of the construction projects [8, 13, 28].

* Corresponding author:

kmalekela@gmail.com (Kimata N. Malekela)

Published online at <http://journal.sapub.org/ijcem>

Copyright © 2017 Scientific & Academic Publishing. All Rights Reserved

According to [13], the risk factors cause variations on forecasted construction cash flows related to various parts of building projects such as substructure, superstructure, finishings and services installations. As well these risk factors may cause cost overruns and delays in construction projects. For instance in Tanzania, according to [5, 12, 19, 20], cost performance is poor in most of construction projects and they are completed with many cost variations compared to their initial budgets. This indicates that risk factors have relationships with variations that occur on forecasted construction cash flows for various works.

Basing on various sources (includes [7, 13, 15, 24, 25]) indicate that the empirical data related to the relationships between variations on positive FCCFs based on various work sections and the risk factors causing those variations in building projects are yet to be investigated.

Therefore, this study analyzes the relationships between variations on forecasted construction cash flows and the significant risk factors involved in causing those variations on forecasted construction cash flows in building projects in Dar es Salaam, Tanzania. Also, this study includes identifying those significant risk factors and formulating a structural model.

As far as the objective of this paper is concerned, this study is delimited to positive construction cash flows derived from staged cash flows in building projects. The word building project means the building project that is procured under fixed price contract. Also, the word variations mean variations that occur on forecasted construction cash flows.

2. Literature Review

2.1. Introduction

The variations that occur on forecasted construction cash flows of a construction projects deal specifically with the variations between forecasted and actual payments under a particular construction project. In this background, relevant studies on construction cash flows and their inherent risk factors, risk analysis and structural equation modelling are being reviewed.

2.2. Concept of Construction Cash Flows

Various authors examined the definitions of construction cash flows, but the cash flow is principally the actual movement of money in and out of any business. For positive cash flow is the money flowing into a business while negative cash flow is the monies paid out of a business. In case of net cash flow is the difference between the positive and negative cash flows [21]. Therefore, the movement of money from client to contractor during execution of construction project is termed as positive construction cash flow. This type of construction cash flow is much preferred by client [15]. This study is also concentrated on positive construction cash flows in building projects.

Moreover, according to [8, 22, 31], monies received by contractor in the form of staged cash flows or monthly cash flows which make positive cash flows in construction projects are commonly used. These monies can be in the form of payments to works performed, release of retention, settlements of final account, and settlements of profit lost due to termination of contract as exhausted from various materials such as [3, 18].

2.3. Payment Systems for Executing the Construction Project Cash Flows

Based on broad literature review from various authors on payment systems for executing the construction cash flows; monthly progress payments (or monthly cash flow), staged payments (or staged cash flows) and Turnkey cash flow are the main payment systems which are used for paying contractor during execution of construction projects.

According to [8, 28], monthly cash flow involves the periodic positive cash flows which are derived from funds received in the form of monthly payments to the construction works performed by contractor. While [2] pointed out that the staged cash flows constitute a single payment at the completion of the certain stage or element of construction works. Therefore, the funds are received by contractor in the form of staged payments to the performed work stage or element. For example, according to [13], these stages can be related to the completion of substructure, superstructure, finishings and services installations. For Turnkey cash flow is the rarely practiced payment system [28]. This payment system involves a single payment at the completion of the project [8].

2.4. Variations on Forecasted Construction Cash Flows

In this study, variation is the difference between actual and forecasted construction cash flows in executing the construction project [13, 23]. These variations occur to most of contracts which lead to change the amount due to the contractor [23]. According to [10, 13], forecasted construction cash flow is the estimated/projected amounts of money to be received by contractor from client after completion of various work stages of the project. While actual construction cash flows are the actual amounts of money paid to contractor for the various completed work stages of the project after being valued at the site and certified. If the actual construction cash flow has exceeded the forecasted construction cash flow for the specific work stage performed, variation is positive and vice versa.

These variations are caused by various risk factors during executing the construction projects [23]. Also, most of these risk factors affect time and quality aspects of the construction projects [31]. The list of risk factors causing variations on forecasted construction cash flows was adopted from the study of [13] as shown in Table 1. This list was also extracted from broad literature review based on different perceptions of the authors on cost issues and tested by pilot study as revealed by [13].

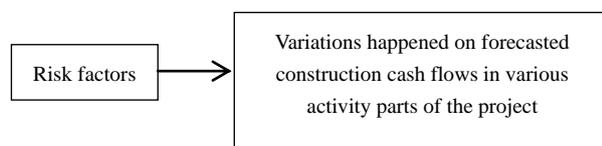
Table 1. Risk Factors causing variations on forecasted construction cash flows

Risk factors causing variations on forecasted construction cash flows
a. Errors in project documents (Bills of Quantities)
b. Poor communication among project participants
c. Consultants' lack of experience and technical skills
d. Different meanings of specifications
e. Unethical practices to consultants
f. Unclarity of client's requirements
g. Clients' lack of financial resources
h. Design errors
i. Poor/Incomplete design
j. Incomplete Information at tender stage
k. Inclement weather
l. Labour strike
m. Civil disturbances
n. Complexity of designs
o. Non-adherence to public laws and regulations
p. Change in geological conditions
q. Change in site layout
r. Shortage of key resources
s. Misunderstanding of contract clauses
t. Subcontractor/supplier's lack of experience and technical skills
u. Subcontractor/supplier's lack of financial resources
v. Contractor's lack of experience and technical skills
w. Contractor's lack of financial resources
x. Level of bureaucracy
y. Changes in currency rates
z. Conflicts among project participants
aa. Instability of Government

Adopted from [13]

2.5. Relationship between Risk Factors and Variations on Construction Project Cash Flows

Risks are the factors that can cause a project to fail in meeting its goals [26]. Basically, construction cash flow belongs to the cost objective which is one of the key project objectives. Therefore, in this study, risk factor means the factor that can cause variations on forecasted construction cash flows for a certain work part of building project as pointed out by [13]. As previously described, it indicates that there are the relationships between variations on forecasted construction cash flows and risk factors causing those variations during execution of construction projects (Figure 1). This is also supported by the study of [25]. Furthermore, the variations on forecasted construction cash flows based on various work stages have also the relationships to each other due to the nature of the building works.

**Figure 1.** Relationship between Variations on Forecasted Construction Cash Flows and Risk Factors

2.6. Risk Analysis

Since the risk factors causing variations on forecasted construction cash flows is the subject matter embedded in risk management. Therefore, these risk factors are required to be analysed in the way of managing risks during project implementation (i.e. risk analysis). According to [9], all risk factors are always analysed in terms of the potential impacts using either qualitative or quantitative tools. The potential impacts analysed from risk issues enable the setting of risk response planning actions to be done properly. Moreover, relationship analysis is recommended to be one of the tools for quantitative risk analysis. In this study, relationship analysis was used for quantifying the risk impacts.

2.7. Structural Equation Modelling (SEM)

Principally, structural equation modeling (SEM) includes statistical techniques that allow complex relationships between one or more dependent variables and one or more independent variables [1], such as multiple regression analysis, confirmatory factor analysis and path analysis. SEM analyses the complex interactions among meaningful factors by estimating the direct and indirect interrelations among variable. Then, it confirms the underlying structure among observed and latent factors [4]. This is one of the tools for the risk analysis because it estimates the relationships among variables as pointed out by [9]. These are the main reasons which make this study to use SEM in confirming the risk factors affecting FCCFs, and establishing the relationships between those risk factors and variations on FCCFs in building projects.

In SEM, observed variables are tangible variables for which data can be acquired and are shown via rectangles in drawn path diagrams, while latent factors are measured through the impacts of observed variables indicating them and are conventionally depicted with circles or ovals [4].

Furthermore, SEM is an appropriate technique that can be used in construction management context for risk analysis, development of decision support systems, expert systems, and predictive models [17]. This reason makes SEM to be used in this study for analysing various relationships between variations and risk factors causing those variations on forecasted construction cash flows to various parts of buildings.

3. Methodology

The data used in this study are primary data obtained through a questionnaire survey of addressing the objectives of the research. The questions were centred on how risk factors cause variations on positive construction cash flows based on staged cash flows related to substructure, superstructure, finishings and services installations (as described in section 2.2). The composition of these work parts is shown in Table 2.

Table 2. Composition of various work parts

Work parts	Descriptions
Substructure	Includes excavation and earthworks, foundations, ground beams, stub columns, concrete beds, basements, plaster and painting to plinth walls
Superstructure	Includes frames, upper floors, stairs, walls, partitions and roofing
Finishings	Includes all finishes, doors, windows, fixtures and fittings, and external works
Services installations	Includes electrical, air conditioning, plumbing, fire fighting, data cabling, and lift installations

3.1. Questionnaire Design

This research intended to analyze the relationships between variations on forecasted construction cash flows and the significant risk factors involved in causing those variations on forecasted construction cash flows in building projects. The questionnaire design targeted to collect the data related to the objectives of this study from building contractors based in Dar es Salaam City (from class I to class VII). A questionnaire survey was therefore used in this study to collect the data for analysing specifically the relationships between the risk factors and variations using structural equation modelling. The comprehensive list of risk factors causing variations on forecasted construction cash flows of the study of [13] was used as previously stated. Furthermore, the questionnaires used the closed ended questions to collect the data of this study. The scale was developed basing on a 5-point Likert scale defined as “very high = 5”, “high = 4”, “medium = 3”, “low = 2” and “very low = 1”. These rating scales were used by respondents to provide their views on how the risk factors cause variations on FCCFs by rating each of the statements in terms of those scales. The data were therefore collected using a questionnaire survey through quantitative approach.

3.2. Data Collection

Risk factors causing variations on forecasted construction cash flows in construction projects were identified through literature review. Then, a questionnaire survey was finally used to collect data on how risk factors cause the variations on forecasted construction cash flows from building contractors based in Dar es Salaam. It indicates that most of building contractors have enough experience in executing the building projects because the response showed that most of building contractors had experience of more than 10 years in executing the building projects.

3.3. Sample Size

The established sample was 281 building contractors (from class I to class VII) based in Dar es Salaam City, but an additional of 26 building contractors was added during distributing the questionnaires so as to overcome the shortage for those questionnaires which were not returned.

307 questionnaires were therefore distributed to building contractors. The sample was calculated using the statistical model (equation 1) presented by [11]. The total population for building contractors based in Dar es Salaam was 1082 (class I-76, II-18, III-31, IV- 97, V-264, VI-235, and VII-361) [29].

$$n = \frac{z^2 \cdot p \cdot q \cdot N}{e^2 (N-1) + z^2 \cdot p \cdot q} \quad (1)$$

Where:

n = Sample size; N = Total number of population; Z = Confidence level; e = Margin/sampling error; p = Degree variability, which is 50%; and $q = 1-p$.

The confidence level (Z) - 90% (1.645) and margin/sampling error (e) - 10% were used for sampling because these values are economical, and they have been used in various studies such as [10, 14, 30]. The sample was formed through stratified random sampling due to the heterogeneous nature of population of building contractors.

Structural Equation Modelling (SEM) was used to analyze the results from a questionnaire survey. Therefore, according to [4], SEM requires a large-sample method which is highly sensitive to the number of the cases. The larger the sample size, the higher parameters can be estimated. For instance, the study of [4] used the sample size of 166. In addition, [16] pointed out that SEM sample size is required to be at least 200 subjects. In that manner, the criteria for Structural Equation Modelling were met in this study by establishing the sample size of 281, but questionnaires distributed were 307.

3.4. Response to Questionnaires

The responses collected were 284 out of 307 that represent 92.51% responses rate. The number of respondents is still above the established sample size (281). This indicates that the number of respondents was good representation for the analysis of this study.

4. Results and Discussion

The data are mainly analyzed using structural equation modelling (SEM) specifically AMOS software for the data obtained from questionnaires. Statistical package for social sciences (SPSS) version 20 was also used for factor reduction in identifying the significant risk factors (analytical variables). While the interactions among meaningful factors and confirmation of significant risk factors were analyzed using AMOS. Furthermore, this study used means, loading values, Cronbach's alpha tests and Kaiser-Meyer-Olkin to identify significant risk factors (analytical variables). Also, loading values were used to analyze the risk factors through SEM including various structural model fit tests.

Both identification of significant risk factors (analytical variables) and relationships analysis were performed from

the responses of 284 respondents. The risk factors, variations and other general terms have been presented in abbreviations (short forms) in this study as shown in Table 8, 9 and 10 respectively in order to save space during presenting the data in tabulation form. But the abbreviations of risk factors used in path model are shown in Table 11. Other short forms used in this study are VE (variance explained), KMO (Kaiser-Meyer-Olkin) and GMI (Grand Mean Index) which is the mean of means of all sub-samples within the sample.

This part involves mainly three sections namely identification of significant risk factors (analytical variables), estimation of parameters of variables for various relationships, and structural equation model as discussed hereafter.

4.1. Identification of Significant Risk Factors (Analytical Variables)

Literature indicates that risk factors have relationships with variations happened on forecasted construction cash flows. The variations on FCCFs related to various work stages were measured using the risk factors presented by [13] as shown in Table 1. These variations were measured in terms of impacts caused by those risk factors in affecting forecasted construction cash flows basing on a 5-point Likert

scale as previously defined in section 3.1. These risk factors were chosen because they are the ones which extracted thoroughly from various related studies, but only significant risk factors were selected for SEM analysis from the list.

The significant risk factors were statistically identified through exploratory factor analysis using principal component analysis (PCA) as extraction method and varimax rotated as rotation method. These significant risk factors selected were based on collected data, construct quality, reliability and validity tests as suggested by [16]. Furthermore, the criteria for identification were set as follows;

- (i) The loading values were set above 0.5
- (ii) Cronbach's alpha tests were above 0.8 to respective group (latent variable)
- (iii) All means of the significant risk factors were greater than grand mean index (GMI) to respective group (latent variable).
- (iv) The Kaiser-Meyer-Olkin (KMO) was also set above 0.8 to respective group (latent variable) for sampling adequacy.
- (v) The variance explained (VE) was set above 0.5 to respective group (latent variable).

Table 3. Risk Factors Remained After Various Tests for Reduction (Exploratory Factor Analysis)

Factors	Constructs	Mean	Loading values	CR	VE	KMO Sampling adequacy
Substructure Variations caused by risk factors (SVRF)	EPDB	4.294	0.748	0.914	0.620	0.898
	PCAPP	3.890	0.724			
	CLETS	3.702	0.766			
	DMS	3.553	0.718			
	UPC	3.585	0.705			
	CLFR	3.624	0.779			
	DE	3.440	0.726			
Superstructure Variations caused by risk factors (SPVRF)	P/ID	3.362	0.775	0.931	0.626	0.898
	PCAPP	3.533	0.750			
	CLETS	3.420	0.783			
	CLFR	3.427	0.737			
	IITS	3.412	0.796			
Finishing Variations caused by risk factors (FVRF)	LB	3.146	0.712	0.935	0.608	0.910
	CLETS	3.359	0.750			
	UCR	3.299	0.759			
	DE	3.356	0.708			
	P/ID	3.249	0.771			
	IITS	3.267	0.735			
Services Installations Variations caused by risk factors (SEVRF)	CTLETS	3.146	0.726	0.934	0.585	0.904
	PCAPP	3.464	0.733			
	CLETS	3.429	0.751			
	DMS	3.325	0.708			
	P/ID	3.371	0.730			

Also, the mean scores of significant risk factors were above 3 (i.e. $3/5 = 60\%$) as suggested by [29]. These are passing criteria in this study for identifying the significant risk factors in causing variations on forecasted construction cash flows in building projects. It should be noted that grand mean index was used in this study because there were sub-samples of various classes within the general sample. The grand mean indices for the risk factors causing variations on forecasted construction cash flows for substructure, superstructure, finishings and services installations were 3.282, 3.144, 3.121 and 3.149 respectively.

Therefore, Table 3 indicates variables that remain after exploratory factor analysis basing on mentioned criteria above. In fact, factor analysis reduced the number of risk factors (constructs) from 27 or 26 risk factors to each latent factor to less than 8 significant risk factors to each latent group as indicated in Table 3.

Table 4. Reduced Factors after SEM Analysis

Factors	Reduced Constructs	Loading values (less than 0.5)
Substructure Variations caused by risk factors (SVRF)	CLFR	0.248
	DE	0.386
	P/ID	0.207
Superstructure Variations caused by risk factors (SPVRF)	CLFR	0.478
	IITS	0.380
	LB	0.335
Finishing Variations caused by risk factors (FVRF)	UCR	0.420
	CTLETS	0.486
Services Installations Variations caused by risk factors (SEVRF)	P/ID	0.439

Table 5. Risk Factors Remained after SEM Analysis

Factors	Risk factors (observed variables)
Substructure Variations caused by risk factors (SVRF)	EPDB
	PCAPP
	CLETS
	DMS
	UPC
Superstructure Variations caused by risk factors (SPVRF)	PCAPP
	CLETS
Finishing Variations caused by risk factors (FVRF)	CLETS
	DE
	P/ID
	IITS
Services Installations Variations caused by risk factors (SEVRF)	PCAPP
	CLETS
	DMS

Furthermore, identified significant risk factors from factor analysis (Table 3) were used in structural equation modelling. But modification was done by reducing nine variables from the list because their loading values were less than 0.5 during carrying out the SEM analysis (Table 4). Therefore, the risk factors remained after SEM analysis is shown in Table 5.

These are significant risk factors identified from exploratory factor analysis and SEM. It should be also noted that the same latent factors and data used for exploratory factor analysis using 5-Likert scale were also used in SEM analysis. The number of significant risk factors (constructs) remained is less than 5 significant risk factors to each latent group as indicated in Table 5 which is equivalent to 18.52% of all potential risk factors causing variations on forecasted construction cash flows (i.e. $5/27$).

4.2. Estimation of Parameters of Variables for Various Relationships

This part involves mainly estimating the parameters of the variables to various relationships through doing causal analysis and correlation analysis. The parameters for various significant risk factors (observed variables) in causing variations on FCCFs for substructure, superstructure, finishings, and services installations were estimated. Also, correlation parameters for variations on FCCFs for substructure, superstructure, finishings, and services installations of buildings were estimated.

4.2.1. Estimation of Parameters of Risk Factors (Observed variables) for Causal Relationships

Table 6 indicates an analysis on contribution of each significant risk factor in causing variations on FCCFs for substructure, superstructure, finishings, and services installations of buildings (all relationships are also indicated in a model (Figure 2)).

On the relationships between significant risk factors and substructure variations (variations on FCCFs related to substructure works), the most influential risk factor is consultants' lack of experience and technical skills (CLETS) measures 0.814 in causing variations, and it explains 66.3% (0.663) of the variability in the variations on FCCFs for substructure works at 1% level of significance (Table 6). All risk factors were identified as significant risk factors in causing substructure variations at 1% level of significance. According to these results, it can be noted that the construction cash flows related to substructure are much affected by consultants' lack of experience and technical skills (CLETS). This result matches well with the study of [20] which pointed out that incompetent and inexperienced personnel in preparation of project documents affects much the cost aspects in execution of building projects. Therefore, consultants' lack of experience and technical skills can cause variations between actual and forecasted construction cash flows for substructure works.

Table 6. Estimation of Parameters of the Risk Factors for the Measurement of the Variations on Forecasted Construction Cash Flows for Various Work Stages/Parts of Building Projects

Factors	Risk factors (observed variables)	Squared Multiple Correlation	Standardized Regression Weights	p-value
Substructure Variations caused by risk factors (SVRF)	EPDB	0.426	0.652	***
	PCAPP	0.527	0.726	***
	CLETS	0.663	0.814	***
	DMS	0.523	0.723	***
	UPC	0.421	0.649	***
Superstructure Variations caused by risk factors (SPVRF)	PCAPP	0.559	0.748	***
	CLETS	0.519	0.720	***
Finishing Variations caused by risk factors (FVRF)	CLETS	0.317	0.563	***
	DE	0.436	0.660	***
	P/ID	0.579	0.761	***
	IITS	0.532	0.730	***
Services Installations Variations caused by risk factors (SEVRF)	PCAPP	0.565	0.752	***
	CLETS	0.579	0.761	***
	DMS	0.477	0.691	***

*** - significant at 1%

For the relationships between significant risk factors and superstructure variations (variations on FCCFs related to superstructure works), poor communication among project participants (PCAPP) is the most influential risk factor in causing variations on FCCFs for superstructure works by measuring 0.748 (Table 6). Also, this risk factor explains most of its variability about 55.9% (0.559). While consultants' lack of experience and technical skills (CLETS) measures 0.720 in causing variations, and it explains variability about 51.9% (0.519). Furthermore, all risk factors were identified as significant risk factors in causing superstructure variations at 1% level of significance. From these results, it was so expected for poor communication among project participants to be most significant risk factor in causing variations on FCCFs related to superstructure works. Due to the cost impact of this risk factor, [13] insisted proper communication to be exercised in implementing building projects so as to minimize the risk factors which happen due to improper communication or breakdown of communication. This measure will also minimize the variations between actual and forecasted construction cash flows for superstructure works.

Poor/incomplete design (P/ID) is the most influential risk factor in causing variations on FCCFs related to finishing works (for the relationships between significant risk factors and finishing works). This risk factor measures 0.761 in causing variations on FCCFs related to finishing works (Table 6). Only two of the four risk factors explain above 50% of the variability in causing finishing variations (i.e. poor/incomplete design and consultants' lack of experience and technical skills) as indicated in Table 6. All risk factors causing variations on FCCFs related to finishing works were also identified as significant risk factors at 1% level of significance. In fact, these results match somehow with Tanzanian practice because poor/incomplete design is

sometimes dominant due to the existence of poor/incomplete designs for finishes, doors, windows, fittings and fixtures, and external works during tendering. Therefore, in construction phase, these incomplete designs cause large variations between actual and forecasted construction cash flows related to finishing works.

Furthermore, Table 6 indicates that poor communication among project participants (PCAPP), consultants' lack of experience and technical skills (CLETS) and different meanings of specifications (DMS) measure 0.752, 0.761 and 0.691 respectively in causing variations on FCCFs related to services installations (for the relationships between significant risk factors and services installations). These risk factors measure 47.7% to 57.9% of the variability in the variations on FCCFs related to services installations. The variations on FCCFs related to services installations had all its predictors (risk factors) identified as significant at 1% significance level. It is fact that consultants' lack of experience and technical skills is the most influential risk factor in causing variations on forecasted construction cash flows related to services installations due to the use of incompetent and inexperience personnel in preparation of project documents related to services installations. Basically, according to [13] services installations require specialized skills and various contract arrangements as compared to other work parts of building projects. Therefore, the consultants who missing specialized skills and knowledge about contract arrangements used in services installations are likely to cause variations on forecasted construction cash flows.

4.2.2. Estimation of Correlation Parameters of Variations on Forecasted Construction Cash Flows

Table 7 shows correlation analysis for variations on forecasted construction cash flows for substructure,

superstructure, finishings, and services installations of buildings (all correlations are indicated in a model (Figure 2)).

This study found that the strongest relationship is between variations on forecasted construction cash flows for superstructure works (SPVRF) and the variations happened on the services installations (SEVRF) with correlation coefficient of 0.710. The second strong relationship is between variations on forecasted construction cash flows for superstructure works (SPVRF) and the variations happened on the finishings (FVRF) with correlation coefficient of 0.644. Furthermore, all correlations exist among the variations on FCCFs for various works are positive, but two correlations have correlation coefficients less than 0.5 (i.e. 0.371 and 0.382) as indicated in Table 7.

Table 7. Estimation of Correlation Parameters of the Variations on Forecasted Construction cash Flows for Various Work parts

Factors	Variations (latent factors)	Correlations coefficients	p-value
SVRF	SPVRF	0.595	***
	FVRF	0.371	***
	SEVRF	0.382	***
SPVRF	FVRF	0.644	***
	SEVRF	0.710	***
FVRF	SEVRF	0.570	***

*** - significant at 1%

In fact, the proportions of positive variations which happen on FCCFs for superstructure works are almost the same with proportions of positive variations that happen on FCCFs related to services installations and finishings. For instance, due to the nature of these works, the increment of quantities of floors, walls and partitions as superstructure works may cause also the increment of quantities of cables, fittings, accessories, equipments and other components of services installations. Furthermore, the increment of the quantities of superstructure works may cause the increment of the quantities for the floors, walls and ceiling finishes, doors, windows, fittings and fixtures as finishing works. This justifies that the variations on FCCFs for superstructure works correlate much with variations on FCCFs related to services installations and finishings.

4.3. Structural Equation Model

Figure 2 indicates the results for SEM analysis. Overall fitness of the structural model was estimated using various model fit tests as pointed out by [13] such as Root mean square error of approximation (RMSEA) should be below 0.1, Goodness of Fit Index (GFI) and Comparative Fit Index (CFI) should be in the range of 0 to 1, then the overall model fit appears quite good. The current analysis reported a RMSEA = 0.066 < 0.1, CFI = 0.939 and GFI = 0.710 (belong to the range of 0 to 1). These tests recommend that the model fit can be concluded to be good. Also, the χ^2 test yields a value of 157.824 that is evaluated with 71 degrees of

freedom were found to be significant at 0.01, which are good results as revealed by [13]. From the results, it is clear that the tested model (Figure 2) provides better fit to data.

Furthermore, eight (8) risk factors were identified as contributing significantly to the variations on FCCFs for various works in building projects. But, 36% of these risk factors explain their variability less than 50% which indicate that the variability of more than 60% of all significant risk factors is maximally explained.

Normally, the larger the sample size, the higher parameters can be estimated. The sample size used in this study is appreciable large, because [6] pointed out that a rule of thumb requires 10 observations per variable in setting a lower bound for the adequacy of sample sizes. In this study, a number of variables were reduced to 23 (after passing the exploratory analysis and other tests in Table 3). Also, it should be noted that these 23 variables were subjected for further reduction using SEM as indicated in Table 3 and 4). This reduction enables to make more sense and easy interpretation of results. Based on this rule, corresponding number of respondents was supposed to be 230 as lower bound of sample size (since there were initially 23 variables for SEM analysis before final reduction). Therefore, SEM analysis in this study was done using 284 respondents which is greater than the proposed lower bound.

Also, Figure 2 indicates that when variations on FCCFs related to substructure works go up by 1 standard deviation, the standard deviations of the substructure variations caused by errors in project documents (EPDB-S), poor communication among project participants (PCAPP-S), consultants' lack of experience and technical skills (CLETS-S), different meanings of specifications (DMS-S) and unethical practices to consultants (UPC-S) go up by 0.652, 0.726, 0.814, 0.723 and 0.649 respectively. While variations on FCCFs related to superstructure works go up by 1 standard deviation, the standard deviations of the superstructure variations caused by poor communication among project participants (PCAPP-SP) and consultants' lack of experience and technical skills (CLETS-SP) go up by 0.748 and 0.720 respectively.

Furthermore, when variations on FCCFs related to finishing works go up by 1 standard deviation, the standard deviations of the finishing variations caused by consultants' lack of experience and technical skills (CLETS-F), design errors (DE-F), poor/incomplete design (P/ID-F) and incomplete information at tender stage (IITS-F) go up by 0.563, 0.660, 0.761 and 0.730 respectively. While variations on FCCFs related to services installations go up by 1 standard deviation, the standard deviations of the services variations caused by poor communication among project participants (PCAPP-SE), consultants' lack of experience and technical skills (CLETS-SE) and different meanings of specifications (DMS-SE) go up by 0.752, 0.761 and 0.691 respectively.

Basing on correlation results as indicated in Figure 2, all variations on forecasted construction cash flows related to substructure, superstructure, finishing and services

installations are positively correlated. More than 65% of all correlations have correlation coefficients greater than 0.5 which indicate that they are strongly correlated in execution of building projects.

Table 8. List of Abbreviations of the Risk Factors Used in Analysis

STATEMENT	ABBREVIATION
Errors in project documents (Bills of Quantities)	EPDB
Poor communication among project participants	PCAPP
Consultants' lack of experience and technical skills	CLETS
Different meanings of specifications	DMS
Unethical practices to consultants	UPC
Unclarity of clients' requirements	UCR
Clients' lack of financial resources	CLFR
Design errors	DE
Poor/Incomplete design	P/ID
Incomplete Information at tender stage	IITS
Level of bureaucracy	LB

Table 9. List of Abbreviations of the Variations

STATEMENT	ABBREVIATION
Substructure Variations caused by risk factors	SVRF
Superstructure Variations caused by risk factors	SPVRF
Finishing Variations caused by risk factors	FVRF
Services Installations Variations caused by risk factors	SEVRF

Table 10. List of Abbreviations of the General Terms

STATEMENT	ABBREVIATION
Forecasted Construction Cash Flows	FCCFs
Structural Equation Modelling	SEM

Table 11. List of Abbreviations of the Risk Factors Used in Model

STATEMENT	ABBREVIATION
Errors in project documents (Bills of Quantities) causing variations on forecasted construction cash flows related to substructure	EPDB -S
Poor communication among project participants causing variations on forecasted construction cash flows related to substructure	PCAPP -S
Consultants' lack of experience and technical skills causes variations on forecasted construction cash flows related to substructure	CLETS -S
Different meanings of specifications causing variations on forecasted construction cash flows related to substructure	DMS -S
Unethical practices to consultants causing variations on forecasted construction cash flows related to substructure	UPC -S
Poor communication among project participants causing variations on forecasted construction cash flows related to superstructure	PCAPP -SP
Consultants' lack of experience and technical skills causes variation on forecasted construction cash flow related to superstructure	CLETS -SP
Consultants' lack of experience and technical skills causing variations on forecasted construction cash flows related to finishings	CLETS -F
Design errors causing variations on forecasted construction cash flows related to finishings	DE -F
Poor/incomplete design causing variations on forecasted construction cash flows related to finishings	P/ID -F
Incomplete information at tender stage causing variations on forecasted construction cash flows related to finishings	IITS -F
Poor communication among project participants causing variations on forecasted construction cash flows related to services installations	PCAPP -SE
Consultants' lack of experience and technical skills causing variations on forecasted construction cash flows related to services installations	CLETS -SE
Different meanings of specifications causing variations on forecasted construction cash flows related to services installations	DMS -SE

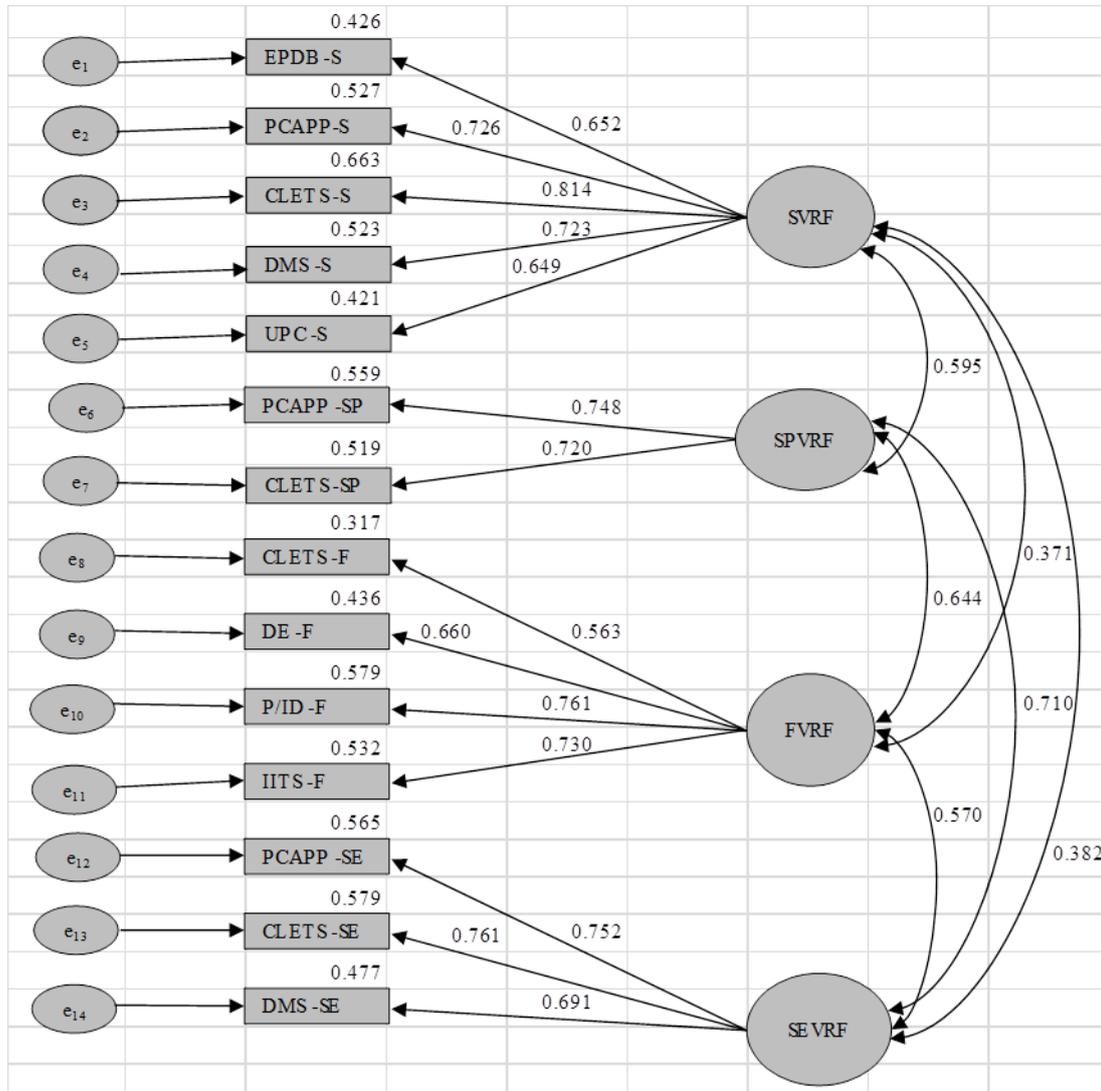


Figure 2. Structural Equation Model

5. Conclusions

This paper has been concentrated on analyzing the relationships between variations on forecasted construction cash flows and the significant risk factors involved in causing those variations in building projects. Also, it includes identifying the significant risk factors and formulating a structural equation model. The identified relationships have been analysed using SEM.

Based on the analysis, eight risk factors were identified as the significant risk factors in causing variations on forecasted construction cash flows related to substructure, superstructure, finishings and services installations. These risk factors showed significant causal relationships with variations on forecasted construction cash flows related to substructure, superstructure, finishings and services installations of building projects in Tanzania. Therefore, it can be concluded that variations on forecasted construction cash flows related to substructure, superstructure, finishings

and services installations have significant relationships with errors in project documents (Bills of Quantities), poor communication among project participants, consultants' lack of experience and technical skills, different meanings of specifications, unethical practices to consultants, design errors, poor/incomplete design and incomplete information at tender stage as shown in the model (Figure 2).

Furthermore, consultants' lack of experience and technical skills is only risk factor that shows the significant relationships with all variations on forecasted construction cash flows related to substructure, superstructure, finishings and services installations. Also, consultants' lack of experience and technical skills is the most influential risk factor in causing variations on forecasted construction cash flows related to substructure and services installations.

All variations that occur on forecasted construction cash flows related to substructure, superstructure, finishing and services installations are positively correlated to each other in executing building projects. But the strongest relationship

is between variations on forecasted construction cash flows for superstructure works and the variations on forecasted construction cash flows related to services installations.

Basing on the analysis (RMSEA = 0.066 < 0.1, CFI = 0.939 and GFI = 0.710 (belong to the range of 0 to 1)), the model fit can be concluded to be good for analysing all risk factors causing variations on positive construction cash flows related to various works in building projects. This model shows fourteen (14) positive relationships between variations on forecasted construction cash flows related to substructure, superstructure, finishings and services installations, and the significant risk factors causing those variations. Also, the model presents six (6) positive correlations existing among the variations on forecasted construction cash flows for various works in building projects.

6. Recommendations

The study recommends that stakeholders in building industry should involve the strategies that can minimize the variations caused by identified significant risk factors on forecasted construction cash flows in building projects.

Also, contributing trends of the identified significant risk factors in causing variations on forecasted construction cash flows based on detailed elements of buildings should be established from historical data using contract documents such as Bills of Quantities, cash flow projections, work programme, interim valuations for payments and site instructions. This will give actual contributing trends of these identified significant risk factors so as to suggest appropriate measures for minimizing the variations on forecasted construction cash flows. Additionally, this documentation will help to know if there are other significant risk factors causing variations on FCCFs or not basing on contract documents.

REFERENCES

- [1] Afrifa-Yamoah, E. (2016). Achievement Motivation as a Function of Participation, Strive, Willingness to Work and Maintaining Work: Application of Structural Equation Modelling (SEM). *International Journal of Psychology and Behavioral Sciences*, 6 (3), pp 133–138.
- [2] Cheetham, D. C., Lewis, J. and Jones, S. T. (1995). The Effect of Stage Payments on Contractor's Cash Flow: Some Possible Consequences. *Journal of Engineering, Construction and Architectural Management*, 2 (3), pp 127–157.
- [3] East Africa Institute of Architects (EAIA), (1997). Standard Agreement and Schedule of Conditions of Building Contract (with quantities). Nairobi, Kenya.
- [4] Eyboosh, M., (2010). Identification of Risk Paths in International Construction Projects. Middle East Technical University, MSc Thesis (Civil Engineering).
- [5] Hokororo, D. S., (2006). Evaluation of Cost Performance of Public Construction Projects: A Case of Tanzania. Dar es Salaam: University of Dar es Salaam, MSc. Dissertation.
- [6] Kahai, S.S. and Cooper, R.B., (2003). Exploring the Core Concepts of Media Richness Theory: The Impact of Cue Multiplicity and Feedback Immediacy on Decision Quality. *Journal of Management Information Systems*, 20(1), pp 263 - 299.
- [7] Kaka, A. P. and Price, A. D. (1993). Modelling Standard Cost Commitment Curves for Contractors' Cash flow Forecasting. *Construction Management and Economics*, 11, pp 271–283.
- [8] Kenley, R., (2003). *Financing Construction: Cash Flows and Cash Farming*. London, Taylor and Francis e – Library.
- [9] Kerzner, H., (2003). *Project Management: A Systems Approach to Planning, Scheduling, and Controlling*, 8th Edition. New Jersey: John Wiley & Sons Inc.
- [10] Kihauale, A. M., (2011). Analysis of Determinants of Rural Households Purchase of Micro Health Insurance Plans in Tanzania. Nairobi, Research Proposal approved and funded by the African Economic Research Consortium (AERC).
- [11] Kothari, C. R., (2004). *Research Methodology: Methods and Techniques*, 2nd Ed. New Delhi: New Age International Publishers.
- [12] Malekela, K. N., (2008). Risks in Implementing Public Private Partnership (PPP) Building Projects in Tanzania: The Case of National Housing Corporation. Ardhi University, MSc Dissertation.
- [13] Malekela, K. N., Mohamed, J., Ntiyakunze, S. K. and Mgwatu, M. I. (2017). Risk Factors Causing Variations on Forecasted Construction Cash Flows of Building Projects in Dar es Salaam, Tanzania. *International Journal of Construction Engineering and Management*, 6 (2), pp 46–55.
- [14] Mchome, E. E., (2014). Development of a Model for Improvement of Transport Network in Informal Settlements in Dar es Salaam, Tanzania. University of Dar es Salaam, PhD Thesis.
- [15] Melik, S., (2010). Cash Flow Analysis of Construction Projects Using Fuzzy Set Theory. Middle East Technical University, MSc Thesis (Civil Engineering).
- [16] Mohamed, J., (2010). Micro and Macro-Modelling of Environmental Information Systems for Decision-Making in Tanzania. Dar es Salaam: University of Dar es Salaam, PhD Thesis.
- [17] Molenaar, K., Washington, S., and Diekmann, J., (2000). Structural Equation Model of Construction Contract Dispute Potential. *Journal of Construction Engineering and Management*, 126(4), pp 268-277.
- [18] National Construction Council of Tanzania (NCC), (2006). Agreement and Schedule of Conditions of Building Contract (with quantities). Dar es Salaam, Tanzania.
- [19] Ngonwe, S. T., (2013). Cost and Time Overrun on Central Government Building Construction Projects in Tanzania (2000 – 2010). Dar es Salaam: University of Dar es Salaam, Masters in Engineering Management Dissertation.
- [20] Ntiyakunze, S. K., (2011). Conflicts in Building Projects in Tanzania: Analysis of Causes and Management Approaches.

- Stockholm: Department of Real Estate and Construction Management, Royal Institute of Technology (KTH), PhD Thesis.
- [21] Odeyinka, H. A., Kaka, A. and Morledge, R., (2003). An Evaluation of Construction Cash Flow Management Approaches in Contracting Organisations. Proceedings of the 19th Annual Association of Researchers in Construction Management (ARCOM) Conference, September 3-5, University of Brighton, pp 33-41.
- [22] Odeyinka, H. A. and Lowe, J. G., (2001). An Evaluation of Methodological Issues for Assessing Risk Impacts on Construction Cash Flow Forecast. Proceedings of the 167th Annual Association of Researchers in Construction Management (ARCOM) Conference, September 5-7, University of Salford, pp 381-389.
- [23] Odeyinka, H., Lowe, J. and Kaka, A., (2002). A Construction Cost Flow Risk Assessment Model. Proceedings of the 18th Annual Association of Researchers in Construction Management (ARCOM) Conference, September 2-4, University of Northumbria, Vol. 1, pp 3-12.
- [24] Odeyinka, H., Lowe, J. and Kaka, A., (2012). Regression Modelling of Risk Impacts on Construction Cost Flow Forecast. *Journal of Financial Management of Property and Construction*, Vol. 17, No. 3, pp 203 – 221.
- [25] Odeyinka, H. A., Lowe, J. and Kaka, A. P., (2013). Artificial Neural Network Cost Flow Risk Assessment Model. *Construction Management and Economics*, 31(5), pp 423-439.
- [26] Ogunsanmi, O. E., Salako, O. A. and Ajayi, O. M., (2011). Risk Classification Model for Design and Build Projects. *Journal of Engineering, Project, and Production Management*, 1(1), pp 46 – 60.
- [27] Ojo, G. K., (2012). Project Characteristics Influence on Risk Associated with Construction Clients' Cash Flow Prediction. *Journal of Research in International Business and Management*, Vol. 2(5), May, pp 142 – 150.
- [28] RICS, (2012). *Cash Flow Forecasting*. 1st Edition, Guidance Note, Coventry - UK: RICS.
- [29] The United Republic of Tanzania URT (2014). *Contractors Directory*. Contractors Registration Board, Dar es Salaam.
- [30] Zeb, A., Qudoos, A., and Hanif, H. (2015). Identification and Analysis of Factors Affecting Machinery in the Construction Industry of Pakistan. *International Journal of Sciences: Basic and Applied Research*, Vol 19, No. 1, pp 269–278.
- [31] Zou, P.X.W., Zhang, G., and Wang, J.Y. (2007). Understanding the Key Risks in Construction Projects in China. *International Journal of Project Management*, 25, 601–614.