

# Software Cost Estimation for Global Software Development

## *A Systematic Map and Review Study*

Manal El Bajta<sup>1</sup>, Ali Idri<sup>1</sup>, José Luis Fernández-Alemán<sup>2</sup>, Joaquin Nicolas Ros<sup>2</sup> and Ambrosio Toval<sup>2</sup>

<sup>1</sup>Software Project Management Research Team, ENSIAS, Mohammed V University, Rabat, Morocco

<sup>2</sup>Software Engineering Research Group, Regional Campus of International Excellence "Campus Mare Nostrum", University of Murcia, Murcia, Spain

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**Abstract:** Software cost estimation plays a central role in the success of software project management in the context of global software development (GSD). The importance of mastering software cost estimation may appear to be obvious. However, as regards the issue of customer satisfaction, end-users are often unsatisfied with software project management results. In this paper, a systematic mapping study (SMS) is carried out with the aim of summarising software cost estimation in the context of GSD research by answering nine mapping questions. A total of 16 articles were selected and classified according to nine criteria: publication source, publication year, research type, research approach, contribution type, software cost estimation techniques, software cost estimation activity, cost drivers and cost estimation performances for GSD projects. The results show that the interest in estimating software cost for GSD projects has increased in recent years and reveal that conferences are the most frequently targeted publications. Most software cost estimation for GSD research has focused on theory. The dominant contribution type of software cost estimation for GSD research is that of models, while the predominant activity was identified as being software development cost. Identifying empirical solutions to address software cost estimation for GSD is a promising direction for researchers.

## 1 INTRODUCTION

Global Software Development (GSD) refers to software work starting at geographically separated areas across national boundaries considering synchronous and asynchronous interaction. GSD has been adopted by numerous companies. However, these global projects confront a number of problems, which are particularly linked to the gap between different participants: physical distance between the groups of developers causing a lack of trust, time-zone differences, communication problems among teams, effort estimation problems, cultural differences, and others. Current research tends to characterise these problems, but if success is to be achieved in GSD, companies must minimise challenges by adjusting their processes and rearranging their tools and organisational structure.

GSD projects can increase requirements as regards development processes, project management practices, architecture, quality, collaboration tools and so on. These challenges may exceed the advantages of the lower labour rates in the developing country since they could lead to substantial overheads in

the day-to-day operations of a GSD project. This reasoning shows that it is vital to understand and estimate the total costs of GSD in order to help evaluate the comparison with local software development in terms of efficiency.

A large range of software cost estimation techniques had already been developed before the GSD trend began (Jørgensen, 2004). Early research on the topic was conducted in 2006 (Keil et al., 2006), when researchers were able to promote analyses of project factors in order to gain insights into the comparison of development costs for distributed software development projects and collocated projects. In a study published in 2012 (Ramasubbu and Balan, 2012), researchers advance the question of cost estimation for distributed software projects by identifying challenges and proposing solutions with which to better drive estimates. Britto et al. (Britto et al., 2014) present a systematic literature review on effort estimation in GSD. In their study, only 5 papers were selected, which allowed the extraction of only 10 estimation methods. It is important to note that the study of Britto et al. did not consider software maintenance effort/cost estimation; it only concerned software de-

velopment effort/cost estimation. What is more, the study did not classify the techniques according to their contribution type. Considering the importance of the above limitations, the objective of this study is to carry out a systematic review which: 1) includes 16 selected papers among them the 5 ones of Britto et al., 2) considers software development as well as maintenance effort estimation, and 3) discusses effort/cost estimation performance.

The paper is structured as follows: Sect. 2 presents the research method used in the study. Sect. 3 reports the results and findings obtained from the SMS. Sect. 4 outlines threats to validity. Sect. 5 discusses the main findings and presents implications for researchers and practitioners, while our conclusions and future work are presented in Sect. 6.

## 2 RESEARCH METHODOLOGY

### 2.1 Mapping Questions

The SMS was performed to obtain the current research on software cost estimation for GSD. This study answers nine mapping questions (MQs). These questions are presented in Table 1.

Table 1: Mapping questions.

ID	Mapping question
MQ1	Which publication sources and channels are the main targets for software cost estimation for GSD research?
MQ2	How has the frequency of software cost estimation for GSD research changed over time?
MQ3	What are the research types of software cost estimation for GSD studies?
MQ4	Which research approaches are used in software cost estimation for GSD studies?
MQ5	What are the contribution types of software cost estimation for GSD research?
MQ6	Which cost estimation techniques are most frequently used for GSD projects?
MQ7	Which software cost estimation activities have been addressed by GSD research?
MQ8	Which cost drivers affect GSD projects?
MQ9	Which cost estimation performances have been obtained from GSD projects?

### 2.2 Search Strategy and Paper Selection Criteria

The articles were identified by consulting the following sources: IEEE Xplore digital library, ACM digital library, ScienceDirect and Google Scholar. The fol-

lowing search string was used in order to perform the automatic search in the digital libraries selected:

(Software OR system\* OR application\*) AND (cost OR effort OR resource) AND (estimat\* OR plan\* OR predict\* OR measur\* OR calcul\* OR manage\* OR control\*) AND (Global development OR distributed development OR outsourc\* OR Offshor\* OR Dispersed development). This search string was applied to the title, abstract and keywords of the papers to reduce the search results. Each paper was retrieved by the first author and specific information of each relevant paper was filled in an Ms Excel file.

The aim of the selection process was to identify the most relevant studies for this mapping study. Each paper was retrieved and evaluated by one author who decided whether it should be included by considering its title, abstract and keywords. The final selection result was reviewed and approved by the remaining authors. The first step after the articles had been identified was to eliminate duplicate titles, and titles which were clearly not related to the review (16 selected studies out of 103 relevant studies). The inclusion criteria were limited to those studies that focused on software cost estimation for GSD projects, and any studies that met at least one of the following exclusion criteria (EC) were excluded:

- EC1. Papers that are not published in journals, conferences or workshops.
- EC2. Papers that are not in English.

### 2.3 Quality Assessment (QA) Process

The QA in an SMS is a major focus that increases the depth of a study. In order to enhance our study, a questionnaire was therefore designed to assess the quality of candidate papers. The scoring used in this questionnaire was determined on the basis of previous studies (Idri et al., 2015), (Ouhbi et al., 2013b) and (Ouhbi et al., 2013a).

(a) The paper has been published in a recognized and stable journal or conference. This question was rated by considering the computer science conference rankings in the Computing Research and Education (CORE) 2013 Conference Rankings, and the 2013 Journal Citation Reports. The possible answers to this question were:

- For conferences: (+2) if it is ranked CORE A\*; (+1.5) if it is ranked CORE A; (+1) if it is ranked CORE B; (+0.5) if it is ranked CORE C; (+0) if it is not in CORE ranking.
- For journals: (+2) if it is ranked Q1; (+1.5) if it is ranked Q2; (+1) if it is ranked Q3; (+0.5) if it is ranked Q4; (+0) if it is not in JCR ranking.

- (b) The main focus of the paper is software cost estimation activities used to deal with GSD challenges. Yes (+1); Partially (+0.5); No (+0)
- (c) The study is complete and discusses the results obtained. Yes (+1); Partially (+0.5); No (+0)
- (d) The study is empirical and presents relevant results for our SMS. Yes (+1); No (+0)

## 2.4 Data Extraction Strategy

The data extraction strategy was based on providing the set of possible answers to the MQs. The strategy is explained below:

**MQ1.** In order to answer this question, it is necessary to identify the publication source and channel for each paper.

**MQ2.** In order to discover the publication trend, the articles should be classified per publication year.

**MQ3.** A research type can be classified into the following categories:

- **Evaluation research:** existing software cost estimation for GSD approaches are implemented in practice and an evaluation of them is conducted.
- **Solution proposal:** a solution for software cost estimation for GSD is proposed. This solution may be a new software cost estimation for a GSD approach or a significant extension of an existing approach.
- **Other, e.g. opinion paper, experience paper.**

**MQ4.** The research approach can be classified as being:

- **A case study:** an empirical inquiry that investigates a software cost estimation approach for GSD within its real-life context.
- **A survey:** a method used to collect quantitative software cost estimation for GSD information.
- **An experiment:** an empirical method applied under controlled conditions in order to observe its effects on software cost estimation in the GSD context.
- **A review:** an analysis of software cost estimation for existing GSD literature.

**MQ5.** A contribution can be classified as being:

- **A technique:** a procedure used to accomplish a software cost estimation for a GSD task. e.g. a data mining technique.
- **A model:** a representation of a system that allows software cost estimation for GSD properties to be investigated.
- **Other, e.g. process, tool.**

**MQ6.** Several cost estimation techniques for GSD projects have been used in the last few decades. These techniques can be classified as (Wen et al., 2012) and (Jorgensen and Shepperd, 2007):

- **Expert judgment:** this involves consulting a group of experts in order to use their experience to propose an estimation of a given project (Hughes, 1996).
- **machine learning models:** Approaches that are based on soft computing such as artificial neural networks, fuzzy logic models and genetic algorithms (Idri et al., 2006).
- **non-machine learning models:** these provide linear and non-linear regression models to establish equations with which to perform software estimation. (Boehm et al., 2000).

**MQ7.** Software cost estimation activities that were addressed by GSD research can be categorised as:

- **Software development cost:** Performed by managers and software system engineers for activities such as functional design, software requirement, development code, development tools, integration of software and finally the test procedures.
- **Software maintenance cost:** Related to the control and the monitoring of the software after it has been delivered to the final user, since there will always be problems with the software as it gets older
- **Other, e.g. Reengineering cost**

**MQ8.** Cost drivers that affect GSD projects are divided into 4 categories, namely Product, Platform, Personnel and Project factors (Boehm, 1981).

**MQ9.** In this paper, we focus on the two main criteria that affect GSD projects: geographical and temporal challenges and their influence on cost performance. According to the PMBOK Cost Management knowledge area, cost performance is included in three main outputs of a GSD project:

- **Cost Performance Baseline:** An authorised time-phased budget at completion used to measure, monitor, and control overall cost performance on the project.
- **Work performance measurements:** The calculated cost variance for work packages and control accounts
- **Basis of estimates:** The amount and type of additional details supporting the cost estimate vary according to the application area.

### 3 RESULTS

#### 3.1 Quality Assessment

SMSs generally emphasise the quality of selected studies. This QA is usually carried out to discover the general view of the paper’s implication in the subject. However, Kitchenham et al. (Kitchenham and Charters, 2007) specify that even if some researchers use QA as a selection criterion in their systematic review, this assessment is not mandatory for an SMS. Table 2 provides information about the total score of the selected studies. The majority of the selected papers (66.25%) have at least a medium score for quality, which shows that they contain useful information, particularly as regards information on software cost estimation and the impact of GSD projects on the cost estimates. No studies were discarded from these inputs during the QA process.

Table 2: Quality levels of relevant studies.

Quality level	Papers	Percent (%)
Very high ( $4 < score \leq 5$ )	1	6,25
High ( $3 < score \leq 4$ )	1	6,25
Medium ( $2 < score \leq 3$ )	7	43,75
Low ( $1 < score \leq 2$ )	5	31,25
Very low ( $0 < score \leq 1$ )	2	12,50

Table 3 shows the number of articles based on the ranking of the conference or journal at/in which they were published.

Table 3: Articles by their journal or conference rank.

Journals	Number	Conferences	Number
Q1	1	CORE A*	1
Q2	2	CORE A	1
Q3	0	CORE B	0
Q4	1	CORE C	6

#### 3.2 MQ.1: Source and Channel of Publications

Table 4 provides a schematic representation of publication channels and the number of articles per publication source. Table 5 presents the journals and conferences at which the papers selected for this SMS were published. This result clearly shows that the International Conference on Global Software Engineering (ICGSE) is the main publication source for our topic. With regard to journals, systems, software and computer science journals are the targets of researchers in the field.

Table 4: Publication channel.

Publication channels	Selected papers	Percent
Conference	11	68,75%
Journal	5	31,25%
Total	16	100%

Table 5: Journal (J) and Conferences (C) of selected studies.

Publication channels	Type	Total
International Conference on Global Software Engineering (ICGSE)	C	4
Computer Science and Information Technology (CSIT)	C	2
Software Engineering International Conference (ICSE)	C	1
SRII Global Conference (SRII)	C	1
Software Engineering, Artificial Intelligence, Networking and Parallel/Distributed Computing (ACIS)	C	1
Services Computing, IEEE International Conference (SCC)	C	1
Innovations in Information Technology Conference	C	1
International workshop on Economics driven software engineering research (EDSER)	C	1
IEEE Software	J	1
Advances in Software Engineering	J	1
Systems and Software	J	1
European Journal of Scientific Research	J	1

#### 3.3 MQ.2: Publication Distribution Per Year

Fig. 1 shows the number of publications per year. The amount of publications interested in software cost estimation for GSD projects has increased since 2006. This year corresponds to the outset of the increasing concern about the effect of globalization on the software industry in general (da Silva et al., 2010) and is also the year in which the first ICGSE conference took place.

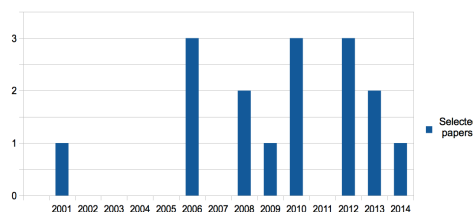


Figure 1: Publication per year.

#### 3.4 MQ.3: Research Type

Sixty two percent of the selected articles are evaluation research, while 25% of the selected papers are so-

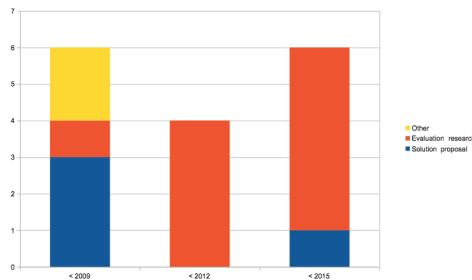


Figure 2: Research Type.

lution proposals. 12,50% are contained in the "Other" category, which comprises theoretical papers and experience papers. Fig. 2 divides the selected articles by their publication date. The first column shows articles published before the year 2009, the second shows those published between 2009 and 2011 and the last shows those published since 2012.

According to the data shown in Fig. 2, the number of evaluation research papers is low in comparison to the number of solution proposals up until 2009. In this period, estimation cost for GSD projects was a relatively new subject that needed more investigation and exploration. From 2012 on, the focus shifted to the validation and evaluation of existing software cost estimation methods for GSD projects.

### 3.5 MQ.4: Research Approach

Four of the selected papers are solution proposals. Two of them were validated using experiments, while the other two were not empirically validated. Five out of 10 of the selected evaluation research studies were based on theoretical approaches and 4 out of 10 were based on case studies, while not a single article was based on an experiment. This situation may result from the difficulty involved in observing the effects of methods on software cost estimation under controlled conditions, particularly in the case of distributed projects in the GSD context. More details on MQ.3 and MQ.4 are provided in Table 6.

Table 6: Research Types and Approaches.

	Case study	Experiment	Survey	Theory
Evaluation	4	0	1	5
Solution	1	1	0	2
Other	1	0	0	1

### 3.6 MQ.5: Contribution Types

Fig. 3 presents the distribution of the selected studies' contribution types. Thirty eight percent of the categories are models. Techniques (Lotlikar et al., 2008)

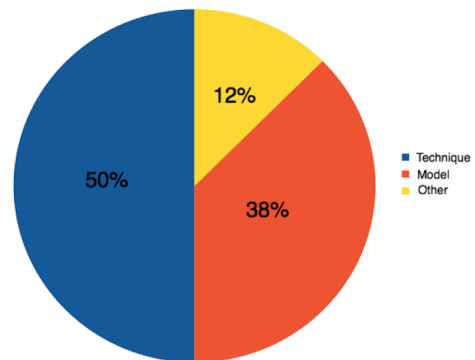


Figure 3: Contribution types.

for the cost estimation of GSD represent 50% of the selected studies' types. These models gather data mining techniques used to help researchers and software companies establish data by providing a number of algorithms and methods with which to deal with software cost and effort challenges. Each of these data mining techniques analyses data and provides results with which to best match the software cost of a GSD project. The third partition "Other" represents only twelve percent split between processes and tools.

### 3.7 MQ.6: Software Cost Estimation Techniques

Several software estimation techniques can successfully be used to estimate costs. non-machine learning models (7 out of 16 selected studies) include CO-COMO (II) (Keil et al., 2006), SLIM (Muhairat et al., 2010), Use Case Points (Azzeh, 2013) and Function Points (Peixoto et al., 2010). The use of expert judgment (3 out of 16 selected studies) consists of asking the opinion of multiple experts who use their experience and knowledge of the project to provide an estimation of the cost. An objective estimation is secured by obtaining as many values as possible from different experts. Indeed, the objective of the Delphi technique (Peixoto et al., 2010) is to repeat the estimation process until an agreement is established. Table 7 presents details of the cost estimation techniques used for GSD projects.

### 3.8 MQ.7: Software Cost Estimation Activities

About 80% of the selected studies discuss the software development costs of GSD projects. These studies show the strong link between the software life cost and its development phase. The second most frequent topic after development cost is contained in the few

Table 7: Estimation techniques for GSD projects.

Type technique	Estimation techniques	Papers	Percentage
non-machine learning models	COCOMO(2)	(Nassif et al., 2012), (Ramasubbu and Balan, 2012), (Azzeh, 2013), (Muhairat et al., 2010), (Keil et al., 2006), (Lamersdorf et al., 2010)	85,7%
	SLIM	(Nassif et al., 2012), (Muhairat et al., 2010)	28,5%
	Function points	(Nassif et al., 2012), (Peixoto et al., 2010)	28,5%
	Use case points	(Nassif et al., 2012), (Azzeh, 2013), (Peixoto et al., 2010)	42,8%
Expert judgment	Multiple Linear Regression	(Nassif et al., 2012)	14,2%
	Delphi	(Nassif et al., 2012), (Peixoto et al., 2010)	28,5%
	ISBSG	(Nassif et al., 2012), (Muhairat et al., 2010)	28,5%
	Planning Pocker	(Peixoto et al., 2010)	14,2%
machine learning models	Epert Judgement	(Peixoto et al., 2010)	14,2%
	Artificial Intelligence	(Humayun and Gang, 2012)	14,2%
	Case-based reasoning	(Hamdan et al., 2006), (Ramasubbu and Balan, 2012)	28,5%
	Regression trees	(Humayun and Gang, 2012)	14,2%
	Neural Network	(Nassif et al., 2012)	14,2%
Genetic Algorithm	(Humayun and Gang, 2012)	14,2%	

studies that concentrate on the maintenance phase. This phase focuses principally on the extraction and consideration of factors that affect software maintenance. If the software maintenance cost is to be properly applied, it is essential to estimate the cost and reduce it by controlling certain factors.

Table 8 summarises the elements that affect software cost development and maintenance in the GSD context. Software development and maintenance are the major issues to affect a GSD project. The study is based on the analysis of data collected from selected papers. Software activities have been shown to have significant costs. The development cost resulting from the overall estimate and the estimation of the benefits of strategies and the networking remain highly uncertain and open to improvement, as do the costs incurred as the results of maintenance, particularly modification, improvement or enhancement along with reengineering costs. These costs have been known to erode whatever benefits the GSD model may provide.

### 3.9 MQ.8: Software Cost Drivers

There are 16 cost drivers, which are divided into the four categories depicted in Table 9: Product, Platform, Personnel, and Project Factors. As this table, shows some cost drivers are common to all types of software projects while others are specific to GSD projects. The majority of cost drivers that impact on GSD projects are related to factors in distributed software projects: time zone, language (communication) and cultural differences (team culture). Note that the most frequently used cost drivers are project effort (44,4%), process model (33,3%) and time zone (22,2%).

In order to establish trust in distributed projects,

researchers recommend bringing about cultural understanding, creditability, capabilities, pilot project performance, personal visits and investments in the field of GSD. These studies also suggest cultural understanding, capabilities, contract conformance, quality, timely delivery, development processes, managing expectations, personal relationships and performance as the key factors for better achievement particularly as regards good communication.

### 3.10 MQ.9: Software Cost Performances

The main reason for studying cost performances in the GSD context is to reduce costs. Five different cost performance variables were included to quantitatively characterise GSD projects: Distributed work, client control and behavior, project team, project methodology and technology variables (Ramasubbu and Balan, 2012).

Cost performance is principally evaluated in three ways, as can be seen in Table 10 (Ramasubbu and Balan, 2012). The direction of distributed development as regards cost performance is decided by the direction of the methods in a statistical test model created using quantitative data or grounded conclusions from qualitative data obtained from primary studies. In summary, only 3 studies provide estimates derived from empirical data obtained from cost performance methods applied in different projects of different companies.

## 4 THREATS TO VALIDITY

The results of this SMS may have been influenced by

Table 8: Software cost estimation activities.

Activities	Elements	Descriptions	Papers
Software development cost	Development budget	Costs resulting from the overall estimate to software development	(Nassif et al., 2012), (Azzeah, 2013)
	Software improvement	Costs resulting from estimating the benefits of strategies such as tools, reuse, and process maturity	(Ramasubbu and Balan, 2012)
	Project planning and control	cost of schedule and control breakdowns by component and activity	(Lamersdorf et al., 2010), (Narendra et al., 2012)
	Project constraints	Costs resulting from the networking, communications, delay in Response and different Time Zone	(Peixoto et al., 2010), (Muhairat et al., 2010)
Software maintenance cost	Corrective maintenance	Costs resulting from the modification of software into correct issues detected after initial deployment	(Ramasubbu and Balan, 2012)
	Adaptive maintenance	Costs resulting from the modification of a software solution to help it stay effective in a changing business environment	(Ramasubbu and Balan, 2012)
	Perfective maintenance	Costs resulting from the improvement or the enhancement of a software solution to improve overall performance	(Ramasubbu and Balan, 2012)
Reengineering cost	Enhancements	Costs resulting from the sequence innovations	(Forbath et al., 2008)

Table 9: Software cost drivers.

Category	Cost drivers	Papers
Product	Code size	(Muhairat et al., 2010)
	Reuse	(Ramasubbu and Balan, 2012)
	Product complexity	(Keil et al., 2006)
Platform	Design and technology newness	(Ramasubbu and Balan, 2012), (Forbath et al., 2008)
	Time zone	(Narendra et al., 2012), (Lamersdorf et al., 2010)
	Platform volatility	(Keil et al., 2006)
Personnel	Team size	(Ramasubbu and Balan, 2012)
	Team culture	(Azzeah, 2013)
	Team trust	(Azzeah, 2013), (Muhairat et al., 2010)
	Communication	(Keil et al., 2006), (Narendra et al., 2012)
	Development productivity	(Ramasubbu and Balan, 2012), (Lamersdorf et al., 2010)
Project	Project effort	(Ramasubbu and Balan, 2012), (Peixoto et al., 2010), (Lamersdorf et al., 2010), (Muhairat et al., 2010)
	Project management effort	(Ramasubbu and Balan, 2012), (Peixoto et al., 2010), (Lamersdorf et al., 2010), (Nassif et al., 2012)
	Process model	(Azzeah, 2013), (Muhairat et al., 2010)
	Task allocation	(Lamersdorf et al., 2010), (Narendra et al., 2012)
	Work Pressure	(Muhairat et al., 2010)
	Client involvement	(Ramasubbu and Balan, 2012)
	Work dispersion	(Keil et al., 2006), (Ramasubbu and Balan, 2012)

Table 10: Software cost performances.

Evaluation type	Cost performance method	papers
Baseline comparison	Historical project databases	(Muhairat et al., 2010)
Variation reduction	MRE , Prediction level	(Ramasubbu and Balan, 2012)
sensitivity analysis	CCNN	(Nassif et al., 2012)

the coverage of the study search, bias in study selection, and inaccuracy in study data extraction. Four

types of threats to the validity (Easterbrook et al., 2008) of the study results are therefore discussed in the following subsections.

Construct validity is concerned with the exactitude of the interpretation of the concepts studied and the completeness of the relevant studies collected. In this mapping study, the key concepts under consideration are contributions towards software cost estimation for GSD projects. To ensure the correct interpretation of these key concepts, we verified the definitions of the concepts in related literature and all the

authors discussed these definitions in order to reach a consensus as to their understanding of them.

Internal validity is concerned with the analysis of the data extracted. The threats to internal validity are minimal considering that only descriptive statistics were used during the data analysis in this SMS.

Conclusion validity is concerned with the search terms used in the automatic search and the search sources are presented in order to make the results of this mapping study reproducible.

External validity is concerned with the representativeness of the selected studies as regard the overall goal of the mapping study. The results of this mapping study were considered with regard to the software cost estimation for distributed projects. These results and representative venues can serve as a starting point for researchers and practitioners working in this field.

## 5 DISCUSSION

This mapping study indicates that the application of software cost estimation techniques for GSD projects is a fairly immature area in both research and practice. First, about two thirds of the selected studies (11 studies out of 16) were published at conferences and workshops, while only 31.2% (5 out of 16) of the selected studies attained the maturity needed to be published in a journal. Furthermore, only one of the selected studies (Ramasubbu and Balan, 2012) attained a very high quality level (i.e., evidence obtained from QA).

The fact that the number of selected studies increased over the last decade shows that the application of software cost estimation knowledge is receiving increasing attention from the software research community. The selected studies were published at 12 different venues, indicating that extensive attention is being paid to this study topic by researchers with a broad range of different research interests in software cost estimation. All of the above indicates that this study topic is likely to remain attractive. However we would urge the research community to strive for high-level evidence in future studies. The results of this SMS also highlight a number of implications for further research in the field:

(1) Challenges associated with software cost and effort estimation in GSD are not new. One of the main reasons for the growth in GSD is the cost of reducing software development, and effort estimation is a key component of this cost. Good effort estimation is thus important for the success of any GSD project. The results of this mapping study show the need for

more research into techniques that can be used to improve software cost estimation analysis. An adaptation of techniques and models that takes into account the challenges and factors associated with GSD must also be investigated.

(2) This mapping study also shows that the application of the knowledge recovery approach in various forms needs to be explored seriously. In many software cost estimation cases, practitioners need to recover the knowledge about software characteristics, especially when developing or maintaining a global software project that is not well described and documented. But little work has been done on the application of knowledge recovery in software cost estimation activities for GSD.

(3) The quantification of the cost drivers' impact on productivity implies a high degree of objectivity and accuracy. However, concepts such as the impact of communication or team trust and team culture on productivity are very difficult to quantify, and the results should be treated with care. This is owing to the complexity and unpredictability of personnel behaviour which has the greatest impact on estimation costs, particularly in distributed development.

## 6 CONCLUSIONS AND FUTURE WORK

This paper presents the outcomes of an SMS of cost estimation in the context of GSD projects, in order to serve both research and practice. This SMS has shown a wide spectrum of software estimation techniques, activities and cost drivers for GSD projects. Most of the selected studies present cost contribution as regards cultural, language and time zone differences, which are directly related to making the achievement of globally performed software projects more stimulating.

Upon considering the lack of primary studies identified in this SMS, we believe that further research is required into the approaches used in the GSD context. We are also of the opinion that the adaptation of those techniques based on the specific aspects of GSD, in addition to the inherent uncertainty of the data, could provide more faithful estimates of effort. The globally distributed environment implies many challenges and elements. The GSD sourcing strategy and cost estimation process topology could have a great influence on cost estimates. Future research should therefore be carried out to explore how these challenges and factors affect cost estimation techniques.



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