
Panos Antonellis\(^1\), Dimitris Antoniou\(^1\), Yiannis Kanellopoulos\(^2\), Christos Makris\(^1\), Christos Tjortjis\(^{2,3}\), Vangelis Theodoridis\(^1\), Nikos Tsirakis\(^1\)

1. University Of Patras, Department of Computer Engineering and Informatics, Greece
2. The University Of Manchester, School of Computer Science, U.K.
3. Engineering Informatics and Telecommunications, University of Western Macedonia, Greece

adonel@ceid.upatras.gr, antonid@ceid.upatras.gr, Yiannis.Kanellopoulos@postgrad.manchester.ac.uk, makri@ceid.upatras.gr, theodori@ceid.upatras.gr, christos.tjortjis@manchester.ac.uk, tsirakis@ceid.upatras.gr

Abstract

The aim of the Code4Thought project was to deliver a tool supported methodology that would facilitate the evaluation of a software product's quality according to ISO/IEC-9126 software engineering quality standard. It was a joint collaboration between Dynacomp S.A. and the Laboratory for Graphics, Multimedia and GIS of the Department of Computer Engineering and Informatics of the University of Patras. The Code4thought project focused its research on extending the ISO/IEC-9126 standard by employing additional metrics and developing new methods for facilitating system evaluators to define their own set of evaluation attributes. Furthermore, to develop innovative and platform-free methods for the extraction of elements and metrics from source code data. Finally, to design and implement new data mining algorithms tailored for the analysis of software engineering data.

1. Introduction

Software is playing a crucial role in modern societies. Not only people rely on it for their daily operations or business, but for their lives as well. For this reason a correct and consistent behaviour of a software system is a fundamental part of users' expectations.

Therefore the demand for software quality is increasing and is setting it as a differentiator, which can determine the success or failure of a software product. Moreover delivering high quality products is becoming not just a competitive advantage but a necessary factor for companies to be successful.

The goal of the Code4Thought project was to deliver a tool supported methodology that would facilitate the evaluation of a software product's quality according to ISO/IEC-9126 software engineering quality standard [6].

It was a joint collaboration between Dynacomp S.A. and the Laboratory for Graphics, Multimedia and GIS of the Department of Computer Engineering and Informatics of the University of Patras. It was a 2 years R&D project co-funded by G.S.R.T. (General Secretariat of Research and Technology) and Dynacomp S.A. The project ended in May 2008 and its budget was 422,000 Euro. The members consisting the project’s team were:

- Project Coordinator: Dr Christos Tjortjis, University of Manchester-Dynacomp S.A, School of Computer Science
- University of Patras Coordinator, Dr Christos Makris, School of Engineering Department of Computer Engineering and Informatics
- Project Manager: Yiannis Kanellopoulos, PhD, Dynacomp S.A.– University of Manchester, School of Computer Science
- Evangelos Theodoridis, PhD Candidate, University of Patras, School of Engineering Department of Computer Engineering and Informatics
- Antoniou Dimitris, PhD Candidate, University of Patras, School of Engineering Department of Computer Engineering and Informatics
• Tsirakis Nikos, PhD Candidate, University of Patras, School of Engineering Department of Computer Engineering and Informatics
• Antonelis Panagiots, PhD Candidate, University of Patras, School of Engineering Department of Computer Engineering and Informatics.

The SQO-OSS project was also related to Code4Thought [7]. Both projects were focusing on software quality and on employing data mining techniques for the analysis of the derived software measurement data.

2. Research Focus

The research on the Code4Thought project was related to software quality and data mining. For this reason, the research focus in this project was the on extending at first, the ISO/IEC-9126 standard by employing additional metrics and developing new methods for facilitating system evaluators to define their own set of evaluation attributes [1], [4]. Furthermore innovative and platform free methods for the extraction of elements and metrics from source code data were developed. Finally new data mining algorithms or combination of data mining techniques tailored for the analysis of software engineering data were designed and implemented [2], [3].

3. Project Achievements

The Code4Thought project developed at first a generalised quality model for the assessment of both structural and OO software systems [1]. The characteristics of this model were:

   • The necessary metrics were elements extracted solely from source code.
   • It employed the ISO/IEC-9126 standard as a frame of reference for communication concerning software product quality.
   • It proposed a three-step approach and an associated model, in order to link system level quality characteristics to code-level metrics.
   • It applied the Analytic Hierarchy Process (AHP) in every level of the model’s hierarchy in order to reflect the importance of metrics and system properties on evaluating quality characteristics according to ISO/IEC-9126.
   
Furthermore, k-Attractors, a clustering algorithm tailored for the analysis of software measurement data was developed for the purposes of this project [4]. The characteristics of this algorithm are:

   • It defines the desired number of clusters (i.e. the number of k), without user intervention.
   • It locates the initial attractors of cluster centers with great precision.
   • It measures similarity based on a composite metric that combines the Hamming distance and the inner product of transactions and clusters’ attractors.
   • It can be used for large data sets.

Finally another methodology based on the clustering data mining technique was developed [2]. The scope of the proposed methodology was to facilitate maintenance engineers to identify classes which are fault prone and more difficult to understand and maintain as well as to study the evolution of a system from version to version, and its classes’ dynamics. It consists of two steps:

   • a separate clustering step for every version of a system to assist software system’s evaluation in means of maintainability.
   • a macro-clustering analysis in order to study the system’s dynamics from version to version.

4. Project Deliverable

The final deliverable of the project was a data mining tool that was responsible for the extraction, analysis and visualisation of data and results concerning the evaluation of a software system. This tool consisted of the following modules:

   • Data Extraction and Preparation.
   • Data Analysis.
   • Results Visualization.

The objective of the data extraction and preparation module was two-fold:

   • At first to collect appropriate elements that describe the software architecture and its characteristics. These elements included native source code attributes and metrics.
   • Then to analyze the collected elements, choose a refinement subset of them and store them in a relational database system for further analysis.

Native attributes included definition files, classes, structure blocks etc. Metrics, on the other hand, provided additional system information and described more effectively the system’s characteristics and behaviour.

All the metrics were associated with a native source code attribute, e.g. the lack of cohesion is associated with a class member method. All of the above collected attributes and metrics were stored into appropriate structured XML files. XML was chosen because of its interoperability and its wide acceptance as a de facto standard for data representation and exchange. Storing the metrics in XML files enables further processing and analysis with a variety of tools.

For simplicity, a refinement subset of the most important collected elements was chosen for analysis. This subset should be small enough in order to be easily analyzed and large enough to contain all the necessary system information. Based on this requirement, only the metrics and their associated native attributes were stored and further analyzed.
The elements chosen needed to be extracted from the XML files and stored permanently in a relational database. For this reason tools that mapped XML elements and nodes into any relational database, keeping the extraction method transparent from the underlying database were used.

Figure 1 depicts the general architecture of the data extraction and preparation module.

![Figure 1: Data Preparation and Extraction Module](image1)

As depicted in the Figure 2, the data analysis module is the core of the Code 4 Thought methodology. At first, the data mining algorithm, accepts data from the source code analyzer, by performing queries on the database, where the data reside. The outcome of the analysis is stored in XML files, in order to be visualized by the corresponding

![Figure 2: Data Analysis Module](image2)

![Figure 3: Data Visualisation Module](image3)
module. The primary objective of the data analysis is to obtain a general but illuminating view of a software system that may lead maintenance engineers to useful conclusions about its structure and maintainability.

The visualization module now consists of the following parts:
- An XML reader for the clustering results.
- Text files for the results derived from association rules and classification algorithms.

Figure 3 shows the parts of the visualization procedure for the XML files, from the moment data are being imported until the final results are available to the user.

5. Research Evaluation

The work during this project was evaluated on both open source and proprietary systems of industrial scale. Results were reviewed by domain experts who provided their comments and assessments. The criteria for this evaluation included accuracy of the tool and the ability to capture knowledge that is valid, novel and potentially useful to maintenance engineers. The evaluation results shown at first, that descriptive data mining techniques have the ability to support program comprehension and maintainability evaluation according to ISO/IEC-9126. It was shown that clustering can be complementary to association rules mining in the sense that their combination can form a single and coherent framework. These two techniques provide the ability to create overviews of a system and identify the same time hidden relationships between its artefacts [3]. Then it was demonstrated that k-Attractors is significantly faster than k-Means, a prominent clustering algorithm. Additionally, regarding software measurement data, k-Attractors appeared to form better, in terms of quality, and more concrete clusters [4]. Also it was demonstrated that clustering software metrics can create groups of artefacts with similar measurements and spot potentially important maintainability issues [1], [2], [5]. Finally, it was shown how to translate source code measurements into high-level quality characteristics (like maintainability) [1], [5].

All cases have shown promising results concerning the combination of data mining techniques with a model based on the ISO/IEC-9126. For instance, in one of the case studies two classes with low maintainability values were discovered and characterised by experts as a good find, since there were considered as an important maintainability issue. The third one demonstrated how to summarise maintainability appraisal information in the various levels of a software system, from raw source code metrics describing a system’s artefacts, to the system itself as a whole.

References
[1.] Antonellis et al. “A Data Mining Methodology for Evaluating Maintainability according to ISO/IEC-9126
[6.] Code4Thought: www.code4thought.org
[7.] SQO-OSS: www.sqo-oss.org