Extensions to Generic Automated Marking Environment: 
GAME-2+

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Abstract:

This paper describes the Generic Automated Marking Environment (GAME-2+), which is the extension of GAME-2 and provides an analysis of its performance in assessing student programming projects. GAME-2+ has been designed to automatically assess programming exercises written in C, C++, JAVA, Delphi and PHP languages based on a number of factors including meaningful comments, the structure of functions and the detection and correction of compile-time errors. The assessment is marked based on these metrics using heuristic and fuzzy rules. In this research, GAME-2+ has been tested on a number of student programming exercises and assignments. The system has attained encouraging result as compared to a human marker.

1. Introduction

The development of automatic assessment systems has become important with application in a number of areas over the last few decades. In particular, interest has grown in the development of tools for automatic assessment of computing programs. These tools can be used in the field of education, proving to be useful for educators in assisting students’ based on their capabilities and providing useful feedback according to their skills [1].

Fuzzy logic enables Automated Marking to assess programming assignments, with the sort of decisions which a human would make. This is exactly what fuzzy logic can do. What is more impressive is that fuzzy logic offers a way of processing these decisions so that a final result is still correct [2].

The final aim of automatic marking systems is to perform the grading of assignments as close as possible to a human marker. Although some limited systems currently exist, there is still much research that must be undertaken to develop an accurate marker that can be used for small and large computer programs written in a variety of languages. However the difficulties in determining a clear marking methodology and also understanding the comments contained in a program remains a major challenge for researchers [3].

In the next section, we describe some existing systems that have been designed for automatic assessment. The description of GAME-2+ and its functionality is reported in section 3. Section 4 provides some experiences in evaluating GAME-2+ and in section 5, results and experiments are shown. Finally, in section 6, conclusion and future work is presented.
2. Current Automated Marking Systems

There are numerous automated systems, which have been developed [3]-[6]. Jackson and Usher [3] planned a system called ASSYST that tests the accuracy of an ADA program by analyzing its output and comparing it to a correct specification using in-built tools of the UNIX operation system. Saikkonen [4] proposed a system called Scheme-robo for assessing programming exercises written in the functional programming language Scheme. The system assesses individual procedures instead of complete programs. Ghosh et al. [5] developed a fully automated system for marking and plagiarism detection of programs written in the C language. The system compiles and executes each student program and performs a simple comparison between the program's output and a model output file. Automatic control educational software (ACES) [6] presents an interactive software platform. ACES automatically grades assessment items and produces a mark in the range according to the grade of correctness of a student’s answer, instead of giving full credit for correct answers and zero credit for wrong answers using a fuzzy grading technique. Finally, GAME [7] and GAME-2[8] has been designed to automatically assess programming assignments written in a variety of languages based on the structure of the source code and the correctness of the program's output. The system is able to mark programs written in Java, C++, and the C language [10].

2.1 Problems of Previous Systems

One of the main limitations of most automated marking systems is that they can only mark one type of programming language. GAME was designed with the intention that it could mark a wide variety of programming languages, by looking at what was common to all programming assessments. The last version of GAME (GAME-2) was able to assess C, C++, and JAVA. However, there were still some deficiencies in the marking methodology, which affected its accuracy, including the problem of dealing with errors in programs.

ACES grades the answers of students’ exercises and produces a mark based on the fuzzy grading principles and overall grade is produced. If the answer of student is correct, he receives full credit. Any other answers than is wrong, it gives a partial credit base on the closeness of the correct answer [6]. ACES provides fuzzy sets with triangular membership functions and grading principles applied [8]. Although ACES demonstrates good results in marking HTML code, and some programs written in Visual C++, the ACES platform is unable to mark programs written in Java and other object-oriented (O-O) programming languages and thus is not generic.

3. System Design of GAME-2+

GAME-2+ was based on the previous version for marking Java, C, and C++ assignments (GAME) [7]. GAME-2[8] and was developed in JDK 6. It was designed to overcome the limitations of the C-Marker, GAME and GAME-2 system, and other existing systems. A summary of GAME-2+ is presented in Figure 1. The final aim of automatic marking is to be able to mark assignments as close as possible to a human.
3.1 GAME-2+ Functionality

From previous results were obtained by GAME [7] and GAME-2 [8], it was evident that the next version of GAME-2 needs to address the following points: 1) The analysis of meaningful comments, 2) The ability to accurately examine the structure of students' source code and 3) Amending of simple compile errors. In an earlier version, GAME and GAME-2 pointed out all the tree requirements mentioned above. In following sections, a detailed description of GAME-2+'s functionality is presented including a discussion of the components addressing the above deficiencies.

3.2 Description of the Fuzzy Grading

Computer logic is exact, deterministic, relates to finite states and numbering systems. Computer logic marks distinct boundaries between any states. Whereas, fuzzy logic enables a computer to make decisions, which are more in line with the sort of decisions made by humans. Computer logic is exact, deterministic, relates to finite states and numbering systems. Computer logic marks distinct boundaries between any states. In this research, a fuzzy grading system is applied and is composed of a single fuzzy unit. The inputs to the Fuzzy unit are the comments and function/Method structure in source code. The meaning of comments and function/method algorithms are two measurements to detect limitations in a program. Depending on the stage of the marketing process, fuzzy decision can be made to find an appropriate mark [9].

3.3 Meaningful Comments

A large aspect of writing maintainable code is to provide meaningful commenting. Source code headers, function pre and post conditions, and in line comments provide valuable documentation into understand the source code. A human marker considers the quality of comment as part of their marking criteria. The question that may be asked is, which criteria need to be considered to identify useful comments? GAME-2+ processes a comment in two ways, Meaningful and Artificial comments. An Artificial comment is identified as such when more than one quarter of the comment's words is a member of “A”, which is considered as code that has been commented out and Fuzzy logic assigns zero marks for this type of comments.

\[
\text{IF (more than one forth of words present in a comment is a member of A) THEN (assign a zero marks)}
\]

\[
A = \{; \ \{ \ \} \ = \ = \ = \ != \ "if" \ "else" \ "import" \ "while" \ "do" \ "switch" \ "for" \ "white space\}
\]
Meaningful comment words are comprised of alphabetic words. There are two kinds of Meaningful comments: Block and Inline Comments. A block comment is usually located prior to the header of the function/method and inline comments are located inside of the function/method body.

Each Meaningful comment is marked according to simple mathematical calculation. The value for block comments is considered as 10% of total marking (5% of whole marking is assigned for inline comments) [9]. Each function/Method should have a block comment as a header to explain the function operation. So the number of block comments might be equal to function/Method number. As a result, the value for each block comment is \[\frac{10\%}{\text{number of functions}}\]. Processing meaningful comments is applied by the following metrics. At present the GAME-2+ system performs two operations with respect to meaningful comments: 1) comment words are analysed in terms of the number of nouns and preposition article present and 2) an evaluation of the number of comment words that are conjunctions. The result is evaluated using simple fuzzy rules. A particular advantage of using fuzzy rules for this operation is that it will be possible to extend this component with relative ease in future versions of the system by adding additional rules.

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\text{MeaningfulProportion} = \frac{\text{NumberOfNounArticles}}{\text{NOW}}, \frac{\text{NumberOfConjunctionWords}}{\text{NOW}} \tag{3}
\]

The number of word in each comment (NOW) was calculated by counting the number of nouns, prepositions and conjunction articles. The “NumberOfNounArticle” was obtained by determining the number of noun and preposition articles. Finally, “NumberOfConjunctionWord” is considered by the number of conjunction articles present. A human marker was consulted to determine a reasonable fuzzy grading schema that would assess a suitable commenting percentage as required in a source code file. The most important component for human marker was the number of noun and preposition words used in the comment and the conjunction words were the other important factor to make the of words composed of nouns and preposition articles and one sixth was allocated by the conjunction words. The exact shape of the fuzzy membership function employed (e.g., bell-shaped) and the corresponding span of the fuzzy membership function are obtained through experimentation on different types of students assignments. Then, GAME-2+ grades the comments and produces a partial mark instead of giving full credit for correct answers and zero credit for wrong answers, a fuzzy grading system was used as detailed in Appendix A.

\[
\text{IF } (\text{each word in a comment is not a member of set A and each character is not alphabetic}) \text{ THEN } (\text{mark are allocated based on appendix A}) \tag{4}
\]

### 3.4 Algorithm Analysis

Good algorithm design [7] is another important area that students need to learn in order to produce high-quality software and for making it accessible to succeeding programmers. To examine the quality of an algorithm (specifically when a program does not compile), GAME-2+ currently looks at the “main” aspects present in the student's source file present in a given assignment. These points are program complexity which includes the number of iteration statements, selection statements as well as the number of data structure (i.e. arrays), assignment statements, inline comments and other important aspects of algorithm structure. So, the accuracy of algorithm is based on:
AlgorithmAccuracy = (NumOfIterations, NumOfConditions, NumOfAssignments, NumOfInlineComments, NumOfArrays). (5)

The fuzzy AlgorithmAccuracy is analysed by calculating the ratio of the number of items obtained, to the number of items from a model algorithm set by the instructor. To assign AlgorithmAccuracy marks, the result obtained from the human marker were analysed to create realistic fuzzy rules that would be instructive to mark the function/method algorithms. For example, the algorithm of a search function is compared to the model of an instructor's algorithm. Consequently, if the number of iteration and condition statements is two, GAME-2+ gives full mark for this part if there is a match with the model solution. Otherwise, a partial mark is allocated by the system. Therefore, GAME-2+ gives a partial mark (2.5 out of 3), if a search function has 2 iteration statements and 1 condition statement. Moreover, the number of assignment statements and arrays is 4 providing a full mark for this part. For other situations, depending on the number of arrays and assignments, partial marks are allocated. However, the mark is full (1 out of 1) in the current case.

4. Experiments

A number of experiments were carried out on real-world data to examine the capability of GAME-2+. Five different types of programming assessments were marked and the results produced by GAME-2+ were compared to a human marker, GAME and GAME-2. The different types of programming assessments were written in Delphi, PHP, Java, C++ and C. All five assessments were marked based on the meaning of comments, source code (algorithm) analysis and correction of compile errors.

4.1 Java, C++, Delphi and PHP Programming Evaluation

The first type of assessment item evaluated was set in O-O courses at the current institution involving a simple programming structure. Additional assessment items were also used in the experiments. The experiments were conducted with 10 Java files, 10 C++ assignments, 10 Delphi and 10 PHP student projects. The assessment types were obtained from first and second year programming courses. This assessment involved only a small amount of coding using single source files. In performing source code analyzing, the GAME-2+ performed reasonably well, with seventy-six percent (76%) and GAME-2 performed sixty-three (63%) agreement with the human marker. However, the original GAME could not analyse the algorithm in the source code and hence could not be used for comparison. In the meaningful comment component of the marking criteria, the GAME-2+ system performance compared well to the human marker with (83%) and GAME-2 (72%) similarity. On the other hand, the original of GAME simply identified a comment or non-comment and could not provide result in a meaningful way.

4.2 C Programming Assignments

The second major experiment devised to test GAME-2+ involved assignments from a first year C programming course. Twenty five student assessments of IT Master students were selected for marking by the GAME-2+. The results obtained were similar to that of the O-O, Delphi and PHP assignments in both meaningful comment and algorithm analysis. In meaningful comments, the human marker agreed with GAME-2+ in (82%) and GAME-2
(78%) of the cases and for algorithm analysis agreed with GAME-2+ in (90%) and GAM-2 in (88%) of cases.

4.3 Compiling and Amending Errors

All the student assignments including the O-O, Delphi, and PHP and C courses assessment were examined by GAME-2+ for correctness in terms of correcting limited compilation errors. The amending component was to modify the missing semicolons and parentheses. The results obtained from GAME-2+ show that the system can detect and add the missing elements in a separate file without any errors. However, the original version of GAME could not correct these compilation errors.

5. Discussion

5.1 Java, C++, Delphi and PHP Programming

GAME-2+ disagreed with the human marker 24% of the time in terms of algorithm analysis. The main reason for the disagreements is that GAME-2+ is only able to assess limited types of functions in student assignments. However, there is no limited ability with a human marker. Hence, there are some functions, which are not assessed by GAME-2+. So, the human marker gives partial or full marks based on the algorithms present, but GAME-2+ gives a mark of zero.

The largest discrepancy for analysing comments was obtained for the marking of parameter explanations. Four out of forty assessments showed that the human marker disagreed with GAME-2+ in terms of the explanation of parameters in comments. The main reason is that the GAME-2+ system could not identify that the comments were describing the function parameters. Therefore, GAME-2+ provided full or partial marks in this situation based on what it thought were meaningful comments. However, the human marker gave lower marks because the comment was not an exact explanation of the parameters.

5.2 C Programming Assignments

The largest percentage of disagreement for marking C assignments was for the commenting mark, where the human marker differed from GAME-2+ in 18 percent of assessments. The human marker in 68% of disagreement gave fewer marks than the GAME-2+ system. The main reason is that that the GAME-2+ could not tell that the comment is related to the function. In these cases the comments were meaningful but the explanation was different to the function/method purpose application. So, after GAME-2+ recognized that the comment is meaningful, it provided corresponding marks. However, the human marker provided lower marks because the comment was not describing the function/method operation.

The next component of the structure mark was the programming (algorithm) analysis. In this section, the human marker disagreed with the GAME-2+ system 10% of the time. The main reason that the human marker provided higher marks on these occasions was that the human marker examined the algorithm according to the function operation. However, GAME-2+ could only identify function operation based on its name. In two assignments, the function name was not related to the function operation. Hence, GAME-2+ provided lower marks as compared to the human marker.
6. Conclusions and Future Work

A Generic Automated Marking Environment (GAME-2+) for marking programming assessment in university level courses has been designed and investigated. The generic and fuzzy nature of the system makes it a powerful tool for marking different assessment items of varying criteria and languages. The results obtained for a variety of assessments and programming languages, comparing GAME-2+'s performance to a human marker, GMAE-2 and GAME, are very encouraging. In the future, there are many areas to examine in order to reduce the discrepancy between the human marker and GAME-2+. Firstly, a more appropriate metric for modifying errors in source code will be used. Secondly, to improve GAME-2+'s ability to mark the meaning of variables, a schema will be considered which more accurately captures the meaning. Thirdly, a greater number of metrics for algorithm analysis will be investigated to provide adequate feedback to students in order to enhance their programming skills.

Appendix A

This appendix explains, by example, how “fuzzy grading principles” have been applied in meaningful comments. If the number of functions in the project is two, the fuzzy membership function is applied [8] in the following manner. In terms of the number of words, full (10/3) marks is applied when the number of words is in the range of 15 to 20; whereas, a student receives partial marks (50%) in the range of 7 and 25. For less than 2 and more than 30 words a student receives no marks. In the noun and preposition articles component, if the number of nouns and prepositions in a comment makes up 18 to 22% of all words, it was allocated a full mark (10/4). Otherwise, a student receives a partial (50%) mark in the case where 14 to 31% of comment words are noun and preposition articles. For less than 10 and more than 40% of noun and preposition articles out of the total number of words, the mark will be zero.

If the comment includes 15 to 20% of conjunction words, it receives (10/12) of the full marks by the system and partial (50%) marks (10/24) for the range of 10 to 28%, and zero marks for greater than 35% of the total number of comment words.

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