Review of Automated Assessment Tools for grading student SQL queries

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Abstract— The Structured Query Language (SQL) is the most widely used language for querying relational databases and it is taught in all basic programming classes in higher education. Even though SQL is the most basic, simple, and most wellstructured language, it is hard to learn due to traditional approaches adopted by learners. In recent years, several online tools have been developed to learn and assess the SQL query. The automated grading of SQL queries will also be useful for the instructors who compile grades manually. In this paper, we have discussed different types of errors students may encounter while writing SQL queries and how correct evaluation and timely feedback can help students to improve their SQL knowledge. In this paper, we also have reviewed and discussed the strength and weaknesses of the existing semi and fully automated assessment tools evolved over several years for the automatic assessment of SQL queries submitted by students and the need for a new fully automated system for the assessment of student SQL queries which can overcome the weaknesses of the existing tools.

Keywords- SQL; Automated Assessment Tools; Query Formulation Tools;

I. INTRODUCTION

The introductory database courses are the most elemental part of the software development/computer engineering courses at higher education. The objective of the databases course is to learn how to create a physical database, how to conceptually design the database, and how the user views the data from the database [1]. The Structured Query Language (SQL) is the language that construct, manipulate, retrieve and also manage data in the database. It is an open-source language and easier to learn than any other existing programming [2]. It is essential for the students at introductory programming courses to learn good relational database concepts including how to organize the data, removing inconsistency and redundancy. This can be applied to most application development that is focused on data-driven applications. So, SQL is an essential and valuable programming language students should acquire and be taught at the university level [3]. Assessment and feedback are two important parameters of the learning [4]. Assessment helps in the improving the query writing skill in student [5]. The SQL instructors require Automated Assessment Tools (AAT) to teach query construction techniques and maintain uniformity in grading and reduce the manual load [6].

II. ASSESSMENT OF SQL QUERIES

A. Error categorization in SQL

SQL query gives the correct output if the query is constructed logically and written with proper syntax, otherwise it produces syntax errors or incorrect output. The basic operations students performed are defining the data, manipulating the data, controlling the data and transaction. SQL queries we write are CREATE, INSERT, SELECT, UPDATE, and DELETE. The SELECT statement is used to retrieve the data which includes restriction condition through WHERE, grouping of rows through the GROUP BY clause, restrict the group result by HAVING, and sort the records by the ORDER BY clauses. The SQL queries can be written in seven different types including group by, having, different types of joins etc. [7,8].

Students write SQL queries for the assignment given by the instructor as part of the learning process. Then the student's solutions are thoroughly evaluated, and grading is done. The students are provided with feedback to improve their overall learning approach. The SQL statement written by students should be assessed properly to find their errors and categorize their errors. The common SQL errors are categorized as synonyms errors, syntax errors, and semantic errors [18,19].

The Synonyms Errors in SQL occur in students' SQL queries because errors such as replacing where with if as they sound similar [20,21]. The syntactic error we may encounter during query execution are, undefined column, Grouping error, undefined table, Ambiguous column, Undefined function, Data type mismatch, invalid date-time format, Invalid schema name, Undefined object, Duplicate alias, Invalid column reference, ambiguous function, etc. [22,23]. But semantic error comes when student's do not get logically correct results, but the query is syntactically correct. The different error categories were defined based on the above three types of errors.

B. Assessment SQL Queries

Manual assessment of a student's SQL statement is timeconsuming and a difficult task to assess the logical errors and check if the query returns the correct set of results. Proper immediate feedback is not possible in manual assessment

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process. The correct query formulation skill involves conceptualizing, constructing the query, executing them, visualizing the result, editing the query till it produces the correct result. The student learning approach id directly proportional to correct grading system, and hence should be carefully designed and implemented. Hence an Automated Assessment Tool is required to assess the SQL queries written by students, generating feedback and grades them.

The objective of this paper is to review the common syntactic and semantic mistakes in student's SQL answers. This paper is going to recite the flaws with the existing SQL learning and grading systems [24]. This paper states the cons of manual marking system, as well as reviewing the current Automated Assessment tools for SQL and analyzing how they work and what methodologies they have followed to evaluate SQL statements and followed by a comparative analysis. This paper outlines the need for creating a new paradigm for automatically assessing SQL statements and providing rapid feedback. [25].

III. RELATED WORK

In this paper, we have discussed various automated assessment tools for learning, formulation of SQL queries and automatic grading of student's submissions and generating feedback. This review outlines the automated assessment tools used for assessing the SQL statement submitted by the student and improves the overall learning of the SQL in introductory programming courses. Kleiner, Tebbe, Heine [7] have discussed the reviews of students after using automated assessment tools in SQL learning and the assessment process. Some students find it beneficial while some find it difficult based on certain parameters. The negative and positive aspects of using automated assessment systems are discussed in figure: 1.

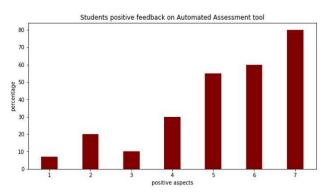


Figure 1: Positive aspect of Automated Assessment tool

TABLE I. POSITIVE ASPECTS

| Positive Aspects | Description | | | | |
|---------------------|-------------------------|--|--|--|--|
| 1 | Not Helpful | | | | |
| 2 | Time Management | | | | |
| 3 | Remote Submission | | | | |
| 4 | Creative Thinking | | | | |
| 5 | No Personal Instruction | | | | |

| (| C |
|---|--------------------|
| 0 | Correct Grading |
| 7 | Immidiate Feedback |

Table 1 describes the positive aspects considered in the above figure.

A. Automated Assessment Tools

The Automated Assessment Tools for SQL focus on the student's common syntactic and semantic mistakes in the SQL queries they have submitted. We are going to discuss some of the assessment tools which uses both summative and formative assessment.

- 1. SQL Tester [2] is an automated assessment tool for grading SQL queries, which is based on simpler questions. It does not include complex queries like correlated subqueries or self-joins and complex group by queries. The test time is generally 50 minutes which can be extended based on the student's level. This uses simple schemas and simple ER Diagrams. SQL Tester matches the student's submission with the desired output and marks it as correct if it matches the model output. The student's statement must be identical to the model answer, for example, in the same order and in the same case.
- 2. SQL-Statement Grader automatically assesses SQL statements in any introductory database course [7]. This grades the student's solution to different questions. Students can resubmit their solutions for improvement. A report is generated after each evaluation in XML format.
- 3. SQL Knowledge Tester [27,28] uses new question generation and answers assessment. It formulates questions on a sample database, the student write queries and the Knowledge Tester evaluates the queries and generates feedback. It compares the similarity between student solution and the model solution. The student's submission is graded as correct only it is 100 % like the model solution. Students could debug previous solutions if they failed the question formulated by the knowledge tester. The SQL-Lab helps students to compose as well as run queries, compare the results, and check the how efficient is the student's SQL query.
- 4. SQLify delivers automatic grading and reduces instructor's marking load [14]. The SQLify system provides semantic feedback and improves query put up skills. Students may update their solutions indefinitely for a better solution and submit their work. The student's work then reviewed by peers and finally the SQLify grades and generates feedback.
- 5. Active SQL is an integrated learning platform for learning and online assessment and provides feedback after analyzing results of the SQL query [9]. The grading system gives marks in percentage. The percentage ranges from 0-100%. The student's submission is compared with the model output.
- 6. SQLator is an interactive tool, which analyze the SQL syntax and grade them as correct query or incorrect query [10]. The student attempts multiple trials before the final

submissions. It decreases the marking time, efficient and provides prompt feedback.

7. AsseSQL had seven categories of questions. AsseSQL uses complex schemas, students face difficulties in remembering the database structure and therefore commit errors in writing the relation names and attribute names. Students may undergo multiple attempts.

Table 2 demonstrates the overview of SQL automated assessment developed so far and feedback generation tools developed from 2003 to 2018

TABLE II. COMPARISION OF VARIOUS SQL ASSEMENT TOOLS

| Tools | Author | Year | Syntax error | Model Solution | Semantic Error | Grading | Feedback to students |
|---------------|--------------------------------|------|-----------------|-------------------|-------------------|-----------------------|-------------------------|
| SQL Tester | Kleerekoper, Schofield | 2018 | Yes | Yes | Yes | Correct/ Incorrect | No Feedback |
| SQLg | Kleiner,Tebbe , Heine | 2013 | Yes | Yes | No | Score | No Feedback |
| SQL- KNOT | Brusilovsky et al | 2010 | No | Yes | Yes | Correct/ Incorrect | No Feedback |
| SQLify | Raadt, Dekeyser and Lee, | 2006 | Yes | No | Yes | Conjunctive | Yes |
| Active SQL | Cumming and Russell | 2005 | Yes | Yes | Yes | Percentage | Not proper Feedback |
| SQlator | Sadiq et al. | 2004 | No | No | Yes | Correct/ Incorrect | Not proper Feedback |
| AsseSQL | Prior | 2003 | No | No | yes | Correct/ Incorrect | No Feedback |

IV. COMPARISION

According to prior SQL tool research, SQL-KnoT, AsseSQL, and SQLator all have one thing in common: a student's solution must always produce the same result as the model solution. This feature is part of the grading process and allows students' answers to be labelled as correct or incorrect. Both ActiveSQL and SQLator are unable to validate SQL syntax. Student queries are solely given binary marks by SQLator and AsseSQL, with no comments or suggestions for improvement. They just use the system to create a single communication channel between the learner and the instructor. More professional features, such as better grading and feedback, are included in SQLg, SQLify, and ActiveSQL. SQLg has more functionality and is of higher quality. Additionally, after finishing the grading process, SQLator does a thorough check to verify consistency. Although SQLify and ActiveSQL are similar in certain aspects, SQLify evaluates semantic SQL statements to a higher level before comparing them to the reference model. The systems mentioned above, on the other hand, concentrate on the final responses supplied without offering any detailed feedback on why a response is erroneous. SQL Tester allows students to answer questions in any order they choose and make as many attempts as they want within the time limit; as a result, students frequently make many attempts until they find out what faults they're making. SQL Tester allows you to choose from a variety of SQL question categories, as well as the number of trials and whether to assess students' answers as correct or incorrect. The AsseSQL does not appear to present the schema of the relevant database with questions and model answer output, like the SQL Tester does. One of the

difficulties with AsseSQL is that test marking is binary, suggesting that answers are either correct or incorrect. No marks are given if a student's answer is just partially right. As a result of the system's uneven distribution of marks among learners, AsseSQL may have an impact on the evaluation process.

Table 3 summarizes current SQL assessment and learning tools, as well as their drawbacks. According to the data, none of the current systems provide sufficient feedback, which is a vital part of the learning and grading process for both instructors and students.

TABLE.III. LIMITATION OF AUTOMATED ASSESSMENT TOOL

| SQL | Match student's submission with the model answer. case | | | |
|--------------|---|--|--|--|
| Tester | sensitivity is not handled. No feedback. | | | |
| SQLg | Candidates can practice before the assessment provide more details of manual grading. | | | |
| SQL- KnoT | Minimized grading system | | | |
| SQLify | Reviews by given by multiple reviewers. No proper explanation of errors | | | |
| ActiveS | Grading in percentage. No explanation of mistakes. | | | |
| QL | Limited feedback system | | | |
| SQLator | Grading as correct/incorrect. No exact explanation | | | |
| AsseSQL | Grading as correct/incorrect. No description of errors | | | |

V. CONCLUSION

This review paper states various aspects of Automated Assessment systems to improve SQL learning for students as well as instructors. Different review of existing SQL assessment systems was specified and corelated to discuss the advantages and disadvantages. This paper examined the general methodologies for formative assessment of SQL queries. The agenda of this review paper is to point out current SQL learning and grading solutions have flaws and hence needs to be corrected. Most papers followed the partial assessment of student SQL queries and offer limited feedback and are not personalized. This paper highlights the limitations of each tool and discusses the need for a new assessment tool that can overcome the limitations and help students learn SQL efficiently.

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