Challenges to integrate software testing into introductory programming courses

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Abstract—Several studies suggest that the teaching of software testing should begin as early as possible, since introductory programming courses. In this way, the teaching of both subjects, programming and testing, becomes an integrated teaching approach. Testing practices in this context can provide a timely feedback to students while they are still working on programming assignments and, as a result, increase the quality of their code. Besides, developing students' testing skills earlier is useful to improve their programming skills as well, since both kinds of skills are complementary. However, this integration is not straightforward, because lecture hours and the coverage of programming topics must remain the same, while testing concepts and practices are introduced. For this reason, when designing an educational approach to introduce testing practices to novice programmers, there is also the need to address potential difficulties faced by both students and instructors. Considering this scenario, this paper aims at identifying the challenges raised due to the integration of software testing into introductory programming courses. The goal is to provide support for instructors who intend to adopt the integrated approach. The challenges have been identified from the results of a systematic mapping we conducted of the literature in this domain. The main contribution of this paper refers to the establishment of a catalog of challenges faced to integrate software testing into introductory programming courses. We also discuss possible solutions to design courses using the integrated approach and point out challenges that have been scarcely addressed in the literature. Finally, we indicate directions that can be explored in future educational empirical studies in this context.

I. Introduction

Despite software testing being very important in industry, students are majoring in computing programs with deficiencies in their testing skills [21, 66]. This issue leads to rethinking how software testing education is done in the Computer Science curriculum.

Traditionally, software testing has been taught in upper level computing courses, such as Software Engineering or even elective courses on this subject [23]. However, by using this approach, students are missing the opportunity to apply software testing in their own programs written across previous computing courses. Also, they are not being able to further develop testing habits and skills [55].

There is a lot of effort in teaching students how to write code in computing courses. However, there is not as much effort in teaching them how to validate their own code, when in fact this could lead them to think more critically while writing the code. Therefore, in order to address this issue, the computing curriculum should give support to develop students' testing skills in parallel with their programming skills.

In this direction, it is widely recognized that, instead of being an isolated topic, software testing should permeate all computing curriculum in practical programming activities, aiming to emphasize the importance of producing high quality software [23, 55]. This curricular restructuring would imply teaching software testing earlier, beginning from introductory programming courses.

Firstly, factors related to how programming courses are designed should be considered to determine how this integration should be done. For instance, the programming language and platform chosen to present programming concepts to students define the supporting tools that can be used to conduct testing practices.

Nevertheless, the focus of introductory courses is to teach programming and it is not simple to add a new subject in already packed courses [40]. The integration of software testing into this context should be designed aiming to aggregate value, in such a way that it does not jeopardize the content and the flow of programming courses [56]. Instructors face several challenges to design and conduct such courses with testing practices. There are also challenges faced by students to keep up with this integrated approach.

Considering this scenario, in this paper we present a catalog of challenges raised by the integration of software testing into introductory programming courses. We intend to help instructors in the designing of such courses so that students can take as much benefits as possible from this integrated approach in terms of learning both programming and testing. The challenges were identified from the results of a systematic mapping we conducted in this domain.

The remainder of the paper is organized as follows. Section II points out aspects that should be considered to design the introductory sequence of programming courses. Section III presents the systematic mapping we conducted and whose results allowed to identify several difficulties reported by other researchers/instructors. In Section IV we describe these identified difficulties in the format of challenges that must be considered to design programming courses with software testing. Finally, Section V summarizes conclusions and future work directions.

II. BACKGROUND

Programming skills are required in many technology areas and, therefore, courses on this subject compose several undergraduate programs, especially those related to computing, such as Computer Science, Computer Engineering and Information Systems [2, 45]. Given the relevance of this subject, there is the need to explore different ways to design introductory courses with the goal of providing a learning environment as effective as possible to students.

The introductory sequence of computing courses involves the teaching of fundamental programming concepts that are supposed to support other following computing courses. However, there is not a consensus of how many courses should compose this sequence, neither of how the content should be distributed over them [16, 46, 70].

ACM/IEEE curricular guidelines also point out this existing diversity in the introductory sequence and identify some aspects that can vary in the design of these courses [4]:

- **Context:** The introductory courses differ greatly among institutions. An important aspect to consider is whether students are computing majors or not, since their needs as well as their motivation to learn programming may vary.
- **Programming focus:** The ultimate goal of introductory courses is that students learn basic computing concepts, such as abstraction and decomposition. In general, these concepts are taught by means of a programming language and the construction of programs. However, these general concepts can be taught without being tied to learning a programming language syntax.
- **Paradigm and programming language:** The programming paradigm choice is a decisive factor in the design of a introductory course, since it can influence greatly on the sequence that concepts are taught. Also, this choice can determine the whole underlying model of the introductory sequence (*imperative-first*, *objects-first* and *functional-first* [3]). Naturally, the choice of programming language is also related to the chosen paradigm. There are other important factors, such as language popularity, industry adoption (such as C, C++ and Java) or the simplicity of the syntax (like Python) [28].
- **Software development practices:** Considering the larger context of the software development process, programming is just one of its composing activities. In this sense, it is possible to include development practices that support programming, such as unit testing, refactoring and version control. The inclusion of such practices can help students in programming assignments and improve their notion of the development process.
- **Parallel processing:** The shift in computer hardware to multi-core processors has been influencing changes in Computer Science Education. There are initiatives to introduce notions of concurrency even in introductory courses [17, 44]. Still, it is more common that this subject is postponed to more advanced courses, given its difficulty.

- **Platform:** The diversity of platforms adopted during introductory courses has grown beyond traditional computers. For instance, there are initiatives to teach programming using mobile devices and robots [26, 34, 60]. The use of these alternative platforms can increase students' motivation, and, depending on the needs of the target audience, it can be very helpful. On the other hand, it is important to analyze if the programming concepts learned by means of such platforms are sufficient to establish the foundation for other advanced computing courses.

Instructors need to evaluate the tradeoffs involved in each one of these aspects to determine an appropriate design of introductory programming course for a given context [4]. There is not a "silver bullet", but being aware of these aspects and their implications while making design course choices can improve significantly the teaching of programming [83].

In particular, the use of testing practices stand out in the context of Computer Science introductory courses. Software testing is related to the aforementioned aspect of software development practices. Comparing ACM/IEEE curricular guidelines from 2001 and 2013 [3, 4], it is possible to notice the increase in the adoption of Software Engineering practices for novice programmers.

Furthermore, the teaching of software testing in this context not only is a supporting practice, but also composes the recommended content for the introductory sequence of computing courses, still according to ACM/IEEE curricular guidelines. More specifically, the recommended topics are *testing fundamentals and test case generation* and *unit testing* [4]. These topics should be taught aiming to provide to students a basic notion of how to validate their own code.

III. SYSTEMATIC MAPPING

Systematic mapping is a well-defined method to perform a literature review about a given research topic [63]. This kind of study supports gathering information from the literature in an organized and repeatable way, allowing to form a non-biased overview of the investigated topic.

We conducted this systematic mapping based on the guidelines from Petersen et al. [63]. Firstly, we defined the protocol, which is the plan to conduct the review and establishes the scope of the investigated research topic. The protocol is composed by research questions, the search strategy and the criteria to select relevant studies among the returned ones.

The goal of this study is to review the literature about software testing in the teaching of programming fundamentals. More specifically, the study was directed towards answering the research question:

- *What are the challenges faced to integrate testing practices into introductory programming courses?*

Next, we performed an automatic search in the following databases: ACM Digital Library[1], IEEE Xplore[2], Springer

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[1]http://dl.acm.org
[2]http://ieeexplore.ieee.org

Link[3], Scopus[4] and Science Direct[5]. We selected these databases because they are among the most used ones by previous systematic literature reviews [87].

The search string was defined considering that the investigated research theme can be defined as the intersection of three aspects: programming, testing and teaching/learning. So, considering these aspects and after piloting, analyzing and refining it, we organized representative terms from this research theme as follows:

("*programming*" **OR** "*program*" **OR** "*code*" **OR** "*software*")
AND
("*testing*" **OR** "*test*")
AND
("*student*" **OR** "*course*" **OR** "*teaching*" **OR** "*learning*")

The **inclusion criterion** reflects the scope established by the research question: included papers should discuss or investigate software testing in the context of teaching programming fundamentals in higher education. The **exclusion criteria** were the following: duplicated studies, papers not written in English, research about software testing outside the context of higher education or that only address software testing in advanced computing courses, such as Software Engineering.

The search returned 16496 papers in total, 158 of which were selected. The low percentage of selected papers is due to the difficulty we had to determine more specific terms that aggregate more precision to the string. The selected studies were analyzed with the objective of determining the answer to the research question, which is presented in the next section.

IV. CHALLENGES

The analysis of the selected studies from the systematic mapping allowed to identify difficulties and concerns reported in the literature. These identified elements expose the experience and evidence obtained by instructors/researchers that investigated and/or applied the integration of software testing into introductory courses. Next, we organized the results of this analysis in the format of challenges that instructors face to design programming courses with the integration of software testing.

A. Determine how and when software testing should be introduced in the curriculum

The first challenge refers to determine how the subjects of programming and testing should be connected and delivered in this context. This connection is not straightforward since programming courses are already packed [33, 40]. Jones [55, 56] suggests that this integration should be done in a holistic approach, with different kinds of testing practices that increase in terms of difficulty as students progress in the introductory courses.

If this integration is not carefully analyzed, the addition of software testing can greatly increase the effort required by both students and instructors. With regard to students, there is

the risk of leading them to a cognitive overload. Students can learn only so many things at the same time, and the design of programming courses should ensure that they are being able to follow and apply the proposed practices. Otherwise, they would not be able to perceive software testing as a helpful practice (see Section IV-B).

Concerning the additional effort required by instructors, there may be a large increase in terms of work overload. Firstly, there is extra effort to prepare course materials and assignments [31, 85]. Assignments must be testable and, if test cases are provided to students, instructors also need to prepare those too. On the other hand, if students are required to write test cases, instructors have the additional responsibility of assessing students' tests. Additionally, instructors would have to provide feedback somehow for students, if possible, while they are still working on programming assignments. In general, the use of supporting tools can help considerably to reduce instructors' workload (see Section IV-F).

B. Help students appreciate the value of software testing

There is a widespread agreement that novice programmers are reluctant to conduct software testing [18, 20, 47]. When it is not made compulsory by the instructor, students tend not to do it [11]. Usually, to force students to conduct testing, part of their grade depends on it. However, this imposition can be increasing even more students' resistance, because while they do not really appreciate the value of testing, they can continue see it only as an unnecessary burden [30].

Students should be able to perceive in practice the benefits of testing their own programs. However, in general, projects from introductory courses (such as CS1 and CS2) are too simple to justify the additional effort of creating and executing thorough tests [5]. Students tend to superficially test their programs. After the submission they are often surprised to receive a grade that they do not expect, since their superficial testing went well [21]. This kind of late feedback probably will not help students' to improve their code, since they already finished working on the code.

Overall, there is the need of ensuring quality in programming assignments [24, 32, 85], so students feel the need to conduct software testing. In this direction, an appropriate configuration of testing activity to be applied during programming assignments (Section IV-C), timely feedback (Section IV-D) and the use of supporting tools (Section IV-F) can help to design an approach that helps students to indeed benefit from software testing in this context.

C. Determine how the testing activity should be conducted in programming assignments

When considering the binding of programming and testing activities, one can notice the widespread adoption of TDD (test-driven development) [30]. It consists in one of the key practices of the agile development methodology eXtremme Programming. TDD is a recurrent approach in introductory programming courses and its influence can be recognized

in several other proposals of educational approaches in this context [9, 22, 30, 50, 52, 61, 62, 65, 67].

In TDD, there is a well-defined order for the activities of programming and testing. At first, the programmer develops test cases. This aspect is known as test-first programming. Next, he/she executes the test cases and finally writes the code to the ones that failed and apply refactoring as needed. This sequence of steps is repeated iteratively until the code unit is complete.

Still considering the order in which programming and testing activities should happen, the choice between test-first and test-last approaches is another important decision. According to the studies of Janzen and Saiedian [50, 53], early programmers are very reluctant to adopt a test-first approach, but their willingness increases as they move forward in programming courses.

From a general perspective, when considering the testing activity as a separate process, it can be composed by the following steps [29]:

- **planning**, where the testing strategy and needed resources are defined;
- **test cases design**, that consists in writing test cases, ideally based in established testing techniques and criteria;
- **program execution**, run the code along with the test cases; and
- **result analysis**, which consists in evaluating the results of test cases execution.

Instructors can ease this process considerably for students, so they do not need to be actively involved in all these steps. In the selected studies, students performed only the last three steps of the testing activity at most (test cases design, program execution and result analysis). It is implied in all papers that the instructor was responsible for the first step (planning the test activity).

The step of test case design brings an important issue: if students are going to be responsible for writing test cases or not. Test cases can be either required as a deliverable together with the solution code (student-written test cases) or provided to students as an scaffolding to develop the solution code (instructor-written test cases). Ultimately, instructors need to find a good balance between provided tests and tests students should write themselves [49].

Many factors can influence in this decision, such as instructor workload and students cognitive load, as discussed in Section IV-A. Nevertheless, it is important to consider that there may be a learning curve to learn how to write test cases [49].

The instructor conduct the test planning deciding which remaining steps students should be responsible for and how they will be conducted. Aiming to equip students to conduct the test activity, instructors can teach them basic testing concepts (Section IV-E) and stipulate the use supporting tools (Section IV-F). Moreover, students should be able to get feedback about their programming performance through the testing activity (Section IV-D).

D. Provide timely and useful feedback

In a typical programming assignment, students receive feedback only on the end result, preventing them from improving the quality of their solution [33]. Instead, students should receive constant feedback while working on their solutions in order to have the opportunity to improve their performance and learn from their mistakes [10, 33].

This challenge is related to the kind of assessment students will be subject to. Providing timely feedback is more related to formative assessment, where students will be able to improve their learning. If they only receive feedback after submitting the code, the assessment model gets more closer to summative assessment, and then students can miss the connection between thorough testing and a good programming performance or even the importance of developing high quality code [15, 43].

Therefore, the kind of feedback can also contribute to affect students' perceptions towards software testing, as discussed in Section IV-B. There are also studies that investigate how feedback can change students' testing behavior [19, 20].

Besides determining when and how often feedback is provided to students, other important aspect is the content of the feedback. Ideally, they should receive feedback on their performance in programming and, when they are supposed to write test cases, also in their testing performance.

The programming performance usually is calculated based on the *pass/fail rate* from test cases (either written by instructor or student). However, there is also the need to evaluate and provide feedback about students' test cases. More importantly, students should use this kind of feedback to improve their test suite (see Section IV-E).

E. Help students to become better testers

An analysis of students' test suites in [37] revealed that they were writing test cases to cover only common behavior rather than actually seeking to uncover errors on the solution code. The authors called this behavior as "happy path testing". These results show that, if students are supposed to write test cases, they should be instructed in how to write and improve a set of test cases, aiming to appropriately test a given program.

Aiming to help students improve their testing performance, we have identified the following important aspects to be considered: how their test cases should be assessed, whether students should receive instruction on fundamental testing concepts and what kind of feedback about their testing performance should be provided.

The most common way to assess quality in students' tests is through *code coverage*, that is, the percentage of code that has been exercised while running the tests. However, code coverage does not capture how much of expected behavior the test cases check.

Other metrics to assess test cases have been investigated, such as the ones based on *all-pairs testing* and *mutation analysis* [1, 38]. These metrics are better predictors of test quality than code coverage [36, 73], but they are more computationally expensive to obtain and raise some practical obstacles, mainly

related to scalability. There are also proposals towards dealing with such obstacles [71, 72].

Although most studies adopt an approach with student-written test cases, it is rare to observe instruction on how to select values for test cases, with testing techniques and criteria. There are a few exceptions, like the studies in [6, 9, 24, 25, 40, 41, 57, 80, 86], where students were instructed on fundamental testing concepts. Without being aware of testing concepts, students are not sufficiently equipped to improve their testing performance [21].

On the same direction, the feedback provided to students about their testing performance could also be tailored based on testing concepts [21]. Feedback based on testing coverage is useful, but it does not guarantee that students are actually learning how to test better their programs. Besides, it can mean that they are just relying on trial-and-error, dependent of the test coverage tool to indicate pieces of code that were not covered yet.

Students need to understand underlying testing concepts to make the most of feedback based on obtained code coverage [76]. This kind of feedback can be more useful to students (see Section IV-D) and can help them to perceive purposefulness in the testing activity (see Section IV-B).

F. Choose appropriate supporting tools

Supporting tools ease the integration of software testing into introductory courses. Tools can help both students, in terms of motivation and cognitive load, and instructors, in terms of workload (see Section IV-A).

There are several types of tools, which automate different aspects of testing practices. We have identified the following types: *automated assessment tools* [35, 64, 75, 77, 84], *online judges* [42, 69], *games* [12, 13, 81] and *tutoring systems* [40, 51].

There are also testing frameworks/libraries, which consist in supporting mechanisms to write and execute test cases. The most used one is JUnit, even in the educational context [30]. However, frameworks and libraries like JUnit are not specifically designed for novice programmers, and there is the risk that their use can insert more difficulties into the learning of programming, instead of reinforcing it.

So, it is possible to observe testing libraries developed specifically to ease the learning curve for novice programmers, such as in [8, 14, 74, 78, 79]. There are also libraries designed to ease novice testing for concurrent programming and in other platforms [7, 68].

Using testing frameworks to implement test cases allows to perform automated testing of students' programs. In general, automated assessment systems run student code against test cases, which can be student and/or instructor-written. There are some proposals towards automating also the *test data generation* in these systems [48, 58].

An important detail that should be checked is the *interface conformance* between the solution code and the test cases, so they can be linked properly [54, 82]. Additionally, some precautions can be taken for the execution, such as running student code isolated in a *sandbox* to ensure security [59] and having mechanisms to *identify infinite loops* [39].

V. CONCLUSIONS AND FUTURE WORK

In this paper we presented a catalog of challenges to integrate software testing in the context of introductory programming courses. This integrated approach can bring many benefits and help students to further improve their programming skills, but it also raises difficulties faced by both instructors and students. We aimed at presenting these difficulties from instructors' point of view, since they are responsible for decisions on how programming courses should be designed.

The goals of this integrated approach can be seen from two perspectives. From the perspective of teaching software testing, the idea is to teach this subject earlier and develop students' testing skills since the beginning of the Computer Science curriculum [27]. On the other hand, from the perspective of the teaching of programming, the idea is to apply testing practices to reinforce programming skills that would, otherwise, be left aside, such as comprehension and analysis skills [33].

So, in general, there is the need to consider the challenge of reconciling the goals from the teaching of both programming and software testing. Students' testing skills should be developed progressively over the introductory sequence and, at the same time, the introduction of software testing cannot disrupt programming courses' flow.

Students present a different level of programming skills in each programming course. Accordingly, it is possible to design testing practices of different levels of difficulty [56]. Therefore, there is the need to determine what kind of testing practice would be appropriate for each specific context of programming course.

The first step in this direction could be to address the challenges reported in this paper, since they summarize well-known difficulties to deliver this integrated teaching approach. Moreover, the conduction of empirical studies can help gathering evidence to investigate approaches configured according to different choices of course design. Ultimately, there is the need to understand how to achieve the best possible results for learning effectiveness of programming and testing.

In particular, we noticed some aspects that should be further investigated in the literature. The most widespread reported difficulty in the studies was the reluctance of students to conduct software testing, even when they recognize the importance of this practice in solving programming assignments. In parallel, the most popular configuration of testing activity is the TDD.

This combination arises the question if TDD is indeed the most adequate configuration to be adopted in every introductory programming course as it has been advocated [32]. Some studies report interesting results and discussions in this direction [5, 53], but it is still necessary to investigate the effect of isolated factors and help instructors in their design choices.

Other interesting aspect is the lack of instruction on fundamental testing concepts in this context [21]. It seems that the idea of adopting testing practices earlier in the curriculum is widely adopted, but the teaching of testing concepts, that would equip students to conduct the testing practices, is not. We are currently working in empirical studies to investigate both of these aspects.

As future work, we intend to investigate separate factors that influence this integrated approach, such as different configurations of the testing activity, testing concepts that must be taught, supporting tools that can be used etc. Also, we intend to investigate which results can be observed in order to assess learning effectiveness of programming and testing in this context.

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