

validation of this long list of refactorings is time consuming. Thus, they appreciate that DINAR suggests refactoring one by one and updates the list based on developer feedback.

4. THREATS TO VALIDITY

Some threats need to be considered when interpreting our study results.

The first threat is the limited number of subjects and evaluated systems (11 participants and 5 systems), which externally threatens the generalizability of our results. In addition, we cannot conclude that DINAR can perform very well also when helping developers since our study was limited to the use of 23 types of refactorings and evaluating 8 types of code smells. Future replications of this study are necessary to confirm our findings.

The second threat is related to the variation of correctness and speed between the different groups when using DINAR and other tools such as JDeodorant. In fact, DINAR may not be the only reason for the improved performance because the subjects have different programming skills and familiarity with refactoring tools. However, developers were not assigned to groups randomly but according to their programming experience to reduce the gap between the different groups. Another threat concerns the data about the actual refactorings of the studied systems. In addition to the documented refactorings, we used Ref-Finder, which is known to be efficient. Indeed, Ref-Finder was able to detect refactoring operations with an average recall of 95% and an average precision of 79% [11]. To ensure the precision, we manually inspect the refactorings found by Ref-Finder by randomly selecting a set of detected changes and evaluate them by the participants of our experiments.

5. CONCLUSION AND FUTURE WORK

We proposed, in this paper a novel interactive recommendation tool, called DINAR, for software refactoring that dynamically adapts and suggests refactorings to developers based on their feedback and introduced code changes. To evaluate the effectiveness of DINAR, we conducted a human study with 11 software developers who evaluated the tool and compared it with the state-of-the-art refactoring techniques. Our evaluation results provide strong evidence that DINAR improves the applicability of software refactoring and proposes a novel way for software developers to refactor their systems.

Future work should validate DINAR with additional refactoring types, new systems and code smell types in order to draw conclusions about the general applicability of our methodology. We will also compare DINAR with other refactoring techniques [14][15]. Furthermore, in this paper, we only focused on the recommendation of refactorings. We are planning to extend the approach by automating the test and verification of applied refactorings. In addition, we will consider the importance of code smells during the correction step using previous code changes, class complexity, etc. Another future research direction related to our work is to adapt our interactive refactoring recommendation tool to several other software engineering problems such as software modularization, change detection and the next release problem.

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