

# MUTATION TESTING STRATEGIES

## *A Collateral Approach*

Mike Papadakis, Nicos Malevris and Marinos Kintis

*Department of Informatics Athens University of Economics and Business, Patission Street 76, 10434, Athens, Greece*

Keywords: Mutation testing, Weak mutation, Higher order mutation, Collateral coverage.

Abstract: Mutation Testing is considered to be one of the most powerful techniques for unit testing and at the same time one of the most expensive. The principal expense of mutation is the vast number of imposed test requirements, many of which cannot be satisfied. In order to overcome these limitations, researchers have proposed many cost reduction techniques, such as selective mutation, weak mutation and a novel approach based on mutant combination, which combines first order mutants to generate second order ones. An experimental comparison involving weak mutation, strong mutation and various proposed strategies was conducted. The experiment shows that all proposed approaches are quite effective in general as they result in high collateral coverage of strong mutation (approximately 95%), while recording remarkable effort savings. Additionally, the results suggest that some of the proposed approaches are more effective than others making it possible to reduce the mutation testing application cost with only a limited impact on its effectiveness.

## 1 INTRODUCTION

The software testing activity forms one of the most widely used methods for both revealing software faults and establishing confidence about the normal behaviour of the software products. This activity requires the generation and execution of the software under test with actual test data. Their quality is measured by their ability to exercise certain program features. Based on the necessity and importance of exercising specific program features various test adequacy measures have been proposed. Measures of this kind give rise to the definition of various testing criteria usually referred to as coverage criteria. Given one such criterion say branch coverage the tester is required to produce test cases until they satisfy-cover all the test elements defined by the criterion i.e. all program branches.

Mutation testing is a fault based technique used for producing high quality test cases. It injects specific faults into the software under test and requires from the tester to produce test cases able to reveal them. By requiring the production of mutation adequate test cases it is believed that a high level of testing thoroughness can be achieved. This is supported by the recent experiments of (Andrews et al., 2006) which provide evidence that the mutation

technique can produce faults similar to real ones and can thus provide a good estimate of the fault revealing ability of the candidate test case sets.

Despite its effectiveness, mutation often requires unacceptable (unlimited) computational resources. This is a direct consequence of the vast number of faulty program versions that it introduces. To bypass these shortcomings researchers have proposed a number of techniques aiming at reducing the cost involved (Offutt and Untch, 2001) while keeping its effectiveness at a high level. Recently, a new mutation testing alternative approach has been suggested, based on the notion of higher order mutants (Polo et al., 2009), which consists of combining pairs of first-order mutants to obtain a set of second-order ones.

In this study various second order mutation testing strategies are proposed and their behaviour in providing collateral coverage (Malevris and Yates, 2006) with respect to strong mutation is investigated. Additionally a comparison with another mutation alternative technique namely weak mutation was also undertaken. The results indicate that second order mutation testing strategies form a viable alternative of mutation as they can achieve considerable effort savings, without significant loss of test effectiveness.

## 2 BACKGROUND

Mutation testing is a well known fault-based technique which was established and introduced by (Hamlet, 1977) and (DeMillo et al., 1978). Mutation induces syntactic faults into the software's under test code by creating many versions of the original program (*mutants*). Test cases are used to execute the generated mutants with the goal of distinguishing (*killing*) them from the original one, by causing them to result in incorrect output. A mutant is called *equivalent* if the inexistence of such test cases holds. Measuring the testing quality based on the ratio of killed mutants results in a mutation based metric. This metric is usually called mutation score and it is defined as the ratio of killed mutants over the total number of non-equivalent mutants.

Various approaches have been proposed in order to make mutation testing more practical. Weak mutation (Howden, 1982) reduces the computational expense of mutation by avoiding the complete execution of the generated mutants. It suggests stopping the program execution immediately after the execution of the mutated statements. Based on this, execution savings rely on the reduced execution traces. In the present study it was decided to use weak mutation for comparison between the methods, since it has proved to be more cost-effective than strong mutation e.g. (Offutt and Lee, 1994).

Recently a new mutation testing alternative approach has been proposed (Polo et al., 2009), based on the notion of second order mutants. According to this, based on a set of candidate mutants, a reduced set of second order mutants is formed by combining them into pairs. Various strategies of how and which mutant statements should be combined can be conducted. In the study of (Polo et al., 2009) three strategies were proposed and their experimental results showed high reduction on the number of generated and equivalent mutants. Additionally, evidence about the cost-effectiveness of the use of second order strategies was provided by (Papadakis and Malevris, 2010). It is this conclusion that is investigated in the present study by using partly some of the originally proposed and partly some newly proposed strategies. This is done in order to determine the impact on the testing quality of the second order mutation strategies in comparison to that of strong and weak mutation.

## 3 SECOND ORDER MUTATION

Besides the investigation of the cost and benefits of using second order mutation an additional goal was to propose new strategies able to provide better results than the initially ones. To achieve this, a set of six new strategies was developed. Due to lack of space only a brief description of these strategies is given. Their full details can be found in (Kintis, 2010).

The proposed strategies fall into three general categories: a) The Dominator category denoted as Dom, b) the Relaxed Dominator denoted as RDom and c) the Strict Dominator denoted as SDom. These three categories are based on the dominator analysis (Agrawal, 1994) of the programs under test. The idea behind their use was to increase the coupling chances between the introduced mutants. To achieve this, the mutant pairs were forced to be selected from node pairs that were found to have a domination relation.

The Dominator strategy category starts by constructing the sets of pre and post dominating nodes say *pre-n* and *post-n* for each node, say *n*, of the program's control flow graph. Then it selects mutants from node *n* and combines them with those from *pre-n* and *post-n* nodes by selecting at least one mutant from either of the two. It must be noted that this category guarantees the equal contribution of the pre and post dominating nodes at the second order mutant generation process. Figure 1 illustrates the sequence of node pairs, generated for node 4, from which the second order mutants will be created. The sequence shown will be repeated until all mutants of node 4 are combined.

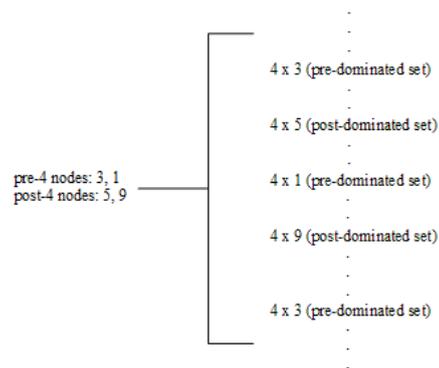


Figure 1: The sequence of node pairs, for node 4, from which the first order mutants will be combined.

The way of combining the *pre-n* and *post-n* mutants defines the two strategies under this category. The DomF strategy combines the first mutant of node *n*

with the first unselected mutant of the first *post-n* node, the second with the first unselected of the first of the *pre-n* node etc. The process continues until all mutants of node *n* have been used at least once and one mutant from every *pre-n* and *post-n* nodes has also been selected. The strategy DomDiff selects the mutants in a similar fashion with an additional restriction of selecting mutants produced by different mutation operators only.

The Relaxed Dominator category selects mutant pairs with the same scheme with the Dominator strategy but in a relaxed way. That is, without requiring the selection of at least one mutant from every *pre-n* and *post-n* nodes. Thus, the strategies of this category select one mutant pair for each mutant belonging to node *n* and use each mutant as few times as possible. This means that node pairs shown in Figure 1, will be generated only if both their nodes have unused mutants. In a different case the next available pair that meets the above requirement will be used.

The strategies RDomF and RDomDiff are the relaxed versions of the DomF and DomDiff strategies respectively.

The Strict Dominator category restricts the selection of mutants among dominated node pairs. That way it is expected that both or none of the mutants will be executed by the test cases. The developed strategies SDomF, SDomDiff use the same selection approach applied only on the dominated node sets as described above. It has been found that by using such a technique many mutants remain unused as they refer to nodes not being dominated. For these mutants the appropriate relaxed dominator strategy has also been used, i.e. if the SDomF strategy is applied then the unused mutants will be combined with the RDomF strategy.

## 4 EXPERIMENT

In the present study we investigated the effectiveness of various second order strategies and weak mutation as opposed to strong mutation. Furthermore the ability of fulfilling strong mutation while aiming at second order on the one hand and also similarly when aiming at weak mutation on the other is analysed.

For the purposes of the experiment a set of 15 Java program test units was used, which were chosen from those used in (Papadakis et al., 2010) and (Polo et al., 2009) and an automated framework was implemented for producing second order and weak mutation mutants for java. The framework

uses the mujava mutation testing tool (Ma et al., 2005) for the generation of first order mutants. The experiment was initiated by independently applying each one of the second order and weak mutation testing strategies on all test subjects. Then a comparison was made based on strong mutation, which was done by recording the collateral strong mutation score achieved by the constructed test sets per each strategy. To eliminate any bias introduced by a particular test case set, we generated 10 separate test sets for each unit and for each variant.

## 5 RESULTS

The conducted study tries to unveil details about the benefits of either using second order mutation testing strategies or weak mutation instead of strong mutation.

Table 1 summarizes the achieved equivalent mutant reduction for all considered strategies (table columns) and selected units with respect to strong mutation. The most interesting aspect of this table is that both second order and weak mutation testing strategies produce by far less equivalent mutants than what strong mutation does. The strong mutation collateral scores for the produced tests of the considered strategies are shown in Figure 2. It is obvious that strict category strategies are more effective than the Dom and RDom strategies. Additionally, it can be observed that strategies based on different operators are less effective but as they produce less equivalent mutants (Table 1) they may be a good choice.

Conclusively, the experiment suggests that considerable savings can be achieved by both second order and weak mutation strategies as opposed to strong mutation. Weak mutation achieves on average a score of 97.05% thus, recording approximately an effectiveness loss of 3% with an achieved reduction of 27.03% of equivalent mutants (reducing their number by 73%). This being a very important observation as it indicates that a 73% less manual effort (equivalent mutant identification) can be gained. According to the SDomF strategy a similar conclusion can be argued as 3.5% of effectiveness loss, the gain of less equivalent mutants rises to 87%. These results suggest that it is possible to perform mutation with reasonable resources.

Table 1: Achieved equivalent mutant reduction per strategy with respect to strong mutation.

Unit	Weak	First2Last	DiffOp	DomF	DomDiff	RDomF	RDomDiff	SDomF	SDomDiff
Total	72,97%	91,22%	92,91%	83,78%	92,23%	85,47%	91,89%	86,82%	94,93%

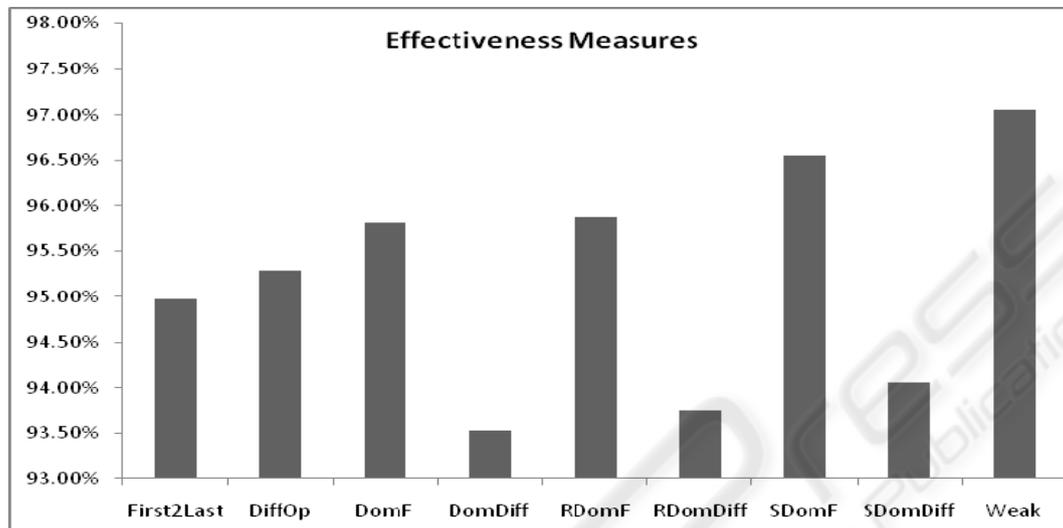


Figure 2: Achieved collateral strong mutation scores of the considered strategies.

## 6 CONCLUSIONS

This paper presents an experiment on mutation testing strategies. The conducted experiment tried to empirically examine the advantages and disadvantages of using second order and weak mutation testing strategies. The results indicate that second order mutation testing strategies form a viable alternative to strong mutation as they can achieve considerable effort savings, without a significant loss on their collateral coverage.

## REFERENCES

Agrawal, H. 1994. Dominators, super blocks, and program coverage. *Proceedings of the 21st ACM SIGPLAN-SIGACT symposium on Principles of programming languages*. Portland, Oregon, United States: ACM.

Andrews, J. H., Briand, L. C., Labiche, Y. & Namin, A. S. 2006. Using Mutation Analysis for Assessing and Comparing Testing Coverage Criteria. *IEEE Trans. Softw. Eng.*, 32, 608-624.

Demillo, R. A., Lipton, R. J. & Sayward, F. G. 1978. Hints on Test Data Selection: Help for the Practicing Programmer. *Computer*, 11, 34-41.

Hamlet, R. G. 1977. Testing Programs with the Aid of a Compiler. *IEEE Trans. Softw. Eng.*, 3, 279-290.

Howden, W. E. 1982. Weak Mutation Testing and Completeness of Test Sets. *IEEE Trans. Softw. Eng.*, 8, 371-379.

Kintis, M. 2010. Mutation testing and its approximations. Master Thesis (in Greek), Athens University of Economics and Business.

MA, Y.-S., Offutt, J. & Kwon, Y. R. 2005. MuJava: an automated class mutation system: Research Articles. *Softw. Test. Verif. Reliab.*, 15, 97-133.

Malevris, N. & Yates, D. F. 2006. The collateral coverage of data flow criteria when branch testing. *Information and Software Technology*, 48, 676-686.

Offutt, A. J. & Lee, S. D. 1994. An Empirical Evaluation of Weak Mutation. *IEEE Trans. Softw. Eng.*, 20, 337-344.

Offutt, A. J. & Untch, R. H. 2001. Mutation 2000: uniting the orthogonal. Mutation testing for the new century. Kluwer Academic Publishers.

Papadakis, M. & Malevris, N. 2010. An Empirical Evaluation of the First and Second Order Mutation Testing Strategies. *Proceedings of the 5th International Workshop on Mutation Analysis (MUTATION'10)*. Paris, France.

Papadakis, M., Malevris, N. & Kallia, M. 2010. Towards Automating the Generation of Mutation Tests. AST 2010. Cape Town.

Polo, M., Piattini, M. & García-Rodríguez, I. 2009. Decreasing the cost of mutation testing with second-order mutants. *Software Testing, Verification and Reliability*, 19, 111-131.