

# Poster: Interactive Coverage Effectiveness Multiplots for Evaluating Prioritized Regression Test Suites

Adam M. Smith<sup>†</sup> \* Joshua J. Geiger<sup>†</sup> Gregory M. Kapfhammer<sup>‡</sup> Manos Renieris<sup>°</sup> G. Elisabeta Marai<sup>†</sup>

<sup>†</sup>Department of Computer Science  
University of Pittsburgh

<sup>‡</sup>Department of Computer Science  
Allegheny College

<sup>°</sup>Google

## ABSTRACT

Software testing increases confidence in the correctness of an application’s source code. Altering a test suite’s execution order enables earlier detection of defects and allows developers to fix errors sooner. The many existing prioritization methods produce different possible test suite orders from which to choose. We propose, implement in a free and open source system, and informally evaluate Interactive Coverage Effectiveness Multiplots, an interactive visualization technique that allows software testers to quickly filter, appraise and compare the effectiveness of many test suite orders. Preliminary results show that researchers, students, and practitioners in the field of software testing find the system useful.

## 1 INTRODUCTION

Developers may introduce errors while implementing software systems. In an attempt to isolate defects and gain confidence in the correctness of a program, developers often run a test suite  $T = \langle t_1, t_2, t_3, \dots, t_n \rangle$ . If a test fails, then it is likely that a defect is present in the source code executed by the test. As the program grows in size and number of features, engineers write new tests. In an effort to ensure that the new features do not negatively impact correctness, developers perform *regression testing* by re-running a suite containing both the existing and newly added tests.

The inclusion of new tests gradually increases the size of the test suite until its execution time may become prohibitively expensive. Test suite prioritization methods create an order of the tests that is more likely to locate defects earlier in the test execution process [6, 7]. Table 1 shows an example of a test suite with 4 tests and 5 requirements where a checkmark in a cell  $(t_i, r_j)$  means that test  $t_i$  covers the requirement  $r_j$ . If we execute the test suite in the order  $T = \langle t_1, t_2, t_3, t_4 \rangle$ , then it does not cover all of the requirements until 8 time units have passed. Yet, if the test suite runs in the reverse order,  $T = \langle t_4, t_3, t_2, t_1 \rangle$ , it covers all of the requirements in 4 time units. Test orders that cover all of the requirements sooner often support earlier fault detection, and are thus of particular interest to software developers.

Normally leveraging static visualizations and tables of numerical scores, testers use metrics like *coverage effectiveness* (CE) to rate a test suite based on how fast it covers each requirement  $r_j$  [4]. The cumulative coverage step function, denoted  $C(T, l)$ , allows testers to determine how many requirements  $T$  covers after  $l$  time units (Figures 1 and 2). The CE score is the area under  $C(T, l)$  divided by the area under the ideal test suite function shown by a dashed line in Figure 1 (i.e., an ideal suite immediately covers all requirements). Falling exclusively between 0 and 1, the “higher is better” CE metric enables testers to compare different orders of  $T$ .

Since finding the optimal test suite by generating and evaluating all  $n!$  possible orders is too expensive, multiple prioritization schemes have been proposed for efficiently constructing new test

	$r_1$	$r_2$	$r_3$	$r_4$	$r_5$	Execution Time
$t_1$	✓	✓	✓	✓		4
$t_2$			✓	✓		1
$t_3$		✓				1
$t_4$	✓				✓	2

Table 1: Example of a Test Suite. Test orderings cover the requirements at different rates, leading to variations in fault detection.

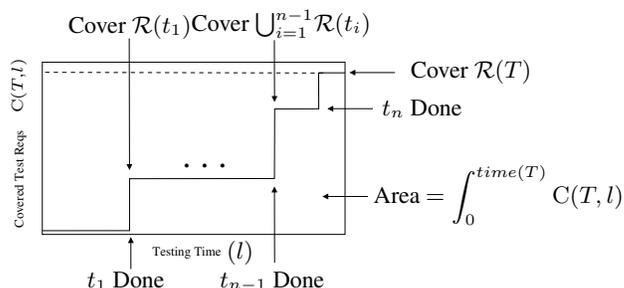


Figure 1: Calculating Coverage Effectiveness (CE). The CE score is the area under  $C(T, l)$  divided by the area under the ideal test suite function (represented by a dashed line).  $R(t_i)$  denotes the set of requirements covered by a test case  $t_i$ .

orders [7]. Yet, it is challenging for testers to pick the best prioritizer for a given test suite and set of requirements since these methods have many configurations (e.g., greedy choice metrics pick the next test according to either test cost, coverage, or the cost to coverage ratio). Testers often become overwhelmed when they solely rely upon static cumulative coverage multiplots and/or large tables of CE scores and test orders. Since the existing approaches to visualization assist during different development processes [2, 3, 5], we introduce an interactive visualization system that aids testers in evaluating and selecting a prioritized regression test suite.

## 2 VISUALIZATION AND INTERACTION

Figure 3 shows a screenshot of the visualization interface that uses interactive CE multiplots to help testers to evaluate different orders of a test suite. Drawing inspiration from features demonstrated by Becker et al. [1] and a NY Times interactive visualization of market statistics<sup>1</sup>, our tool allows users to interactively pick prioritizers and compare the CE values and the actual order of the resulting test suites. The visualization provides details on demand, thus obviating the need for large and confusing legends and data tables. In an effort to both (i) encourage empirical study on the use of visualization during test suite prioritization and (ii) enable software testing practitioners to quickly find the best test suite order for their own applications, we have made the free and open source Reduce And Prioritize Suites (RAISE) system available for download at <http://raise.googlecode.com/>.

\*e-mail: ams292@cs.pitt.edu

<sup>1</sup>[http://www.nytimes.com/interactive/2008/10/11/business/20081011\\_BEARMARKETS.html](http://www.nytimes.com/interactive/2008/10/11/business/20081011_BEARMARKETS.html)

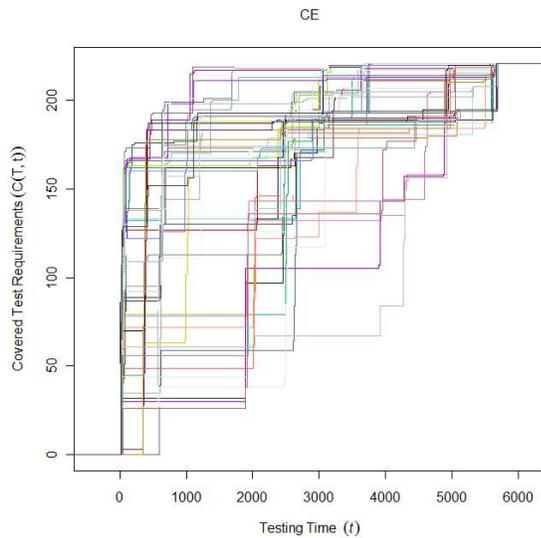


Figure 2: **Static Coverage Effectiveness Multiplot.** Multiple lines severely clutter the visualization, making evaluation and comparison of the prioritized test suites nearly impossible.

The visualization interface uses two panels (Figure 3). The left panel provides information about the test suite and lets the user select which prioritizer's results will be displayed in the multiplot. Clicking on a toggle button in the cell table enables or disables the display of information about the test suite order resulting from the use of a specific greedy choice metric (organized horizontally) and prioritization method (shown vertically). To support rapid identification of details about the test order, each toggle button in the cell table is color coded to match its cumulative coverage step function in the multiplot. Below the table, the system contains a slider bar that allows a tester to choose a number of random prioritizations that appear as thin gray lines in the multiplot. The region below the slider bar gives the average CE value and standard deviation of CE scores for the current random sample. The user interface accesses CE values from all of the previously generated test suites in order to give the running average and standard deviation.

The right panel provides a multiplot of cumulative coverage step functions for all of the currently chosen methods. As in Figures 1 and 2, the multiplot uses the vertical axis to display the number of covered requirements and the horizontal axis to show the test suite execution time. Since all of the toggle buttons in the left panel matrix are currently filled in Figure 3, the multiplot contains coverage functions for all greedy choice metrics and prioritization techniques. Since a multiplot of too many functions severely clutters the visualization, RAISE highlights a line and shades the area under it when a user performs a mouse-over on a function curve. Mouse-over events also reveal the chosen prioritization method, greedy choice metric, and final coverage effectiveness score.

### 3 EVALUATION

We conducted two informal studies to gather preliminary evidence about the benefits and drawbacks associated with the use of interactive visualization during regression testing. In the first study, a senior researcher in regression testing was asked to use the tool and answer a series of questions. The researcher correctly answered questions such as “How does the use of different greedy choice metrics impact the CE score of orderings produced by the four prioritizers?” Feedback gathered during this study included:

“It was challenging for me to analyze the raw data set and the large collection of static plots. RAISE helped me to quickly

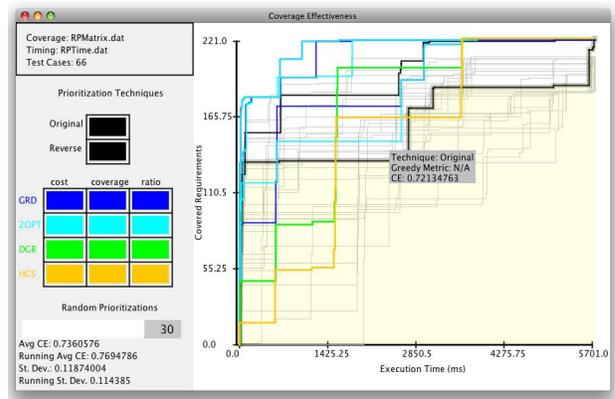


Figure 3: **Interactive Coverage Effectiveness Multiplot in RAISE.** Visualization using interactive multiplots and details-on-demand allows the user to quickly filter, evaluate and compare prioritized test suites.

identify the prioritizer that produced the test suite with the highest CE score. I think that my students and industrial colleagues would benefit from applying this tool to their test suites.”

During the second study, we asked two master's level students doing research in software testing to independently download, install, and use RAISE. After learning how to use the interactive visualization, the students abandoned their static graphs and data tables and used RAISE until the completion of their master's thesis. The students often employed the interactive visualization to determine the best configuration of new regression testing methods for programs that process eXtensible Markup Language (XML) files.

### 4 CONCLUSION AND FUTURE WORK

This paper presents an interactive visualization that assists software developers during the evaluation of a prioritized regression test suite. We proposed, implemented in a system, and informally evaluated Interactive Coverage Effectiveness Multiplots, a visualization technique that allows software developers to quickly filter, appraise and compare prioritized test suites. Available as a free and open source tool, the system supports the activities of researchers, students, and practitioners in the field of software testing. Encouraged by the anecdotal evidence demonstrating that users find RAISE to be helpful, we intend to add new features and conduct more experimental studies (e.g., integrating and studying the use of test metrics besides CE). Ultimately, we anticipate that RAISE will serve as a simple and valuable tool in a comprehensive framework supporting all of the phases in the regression testing process.

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