

# PLEDGE: A Product Line Editor and Test Generation Tool

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## ABSTRACT

Specific requirements of clients lead to the development of variants of the same software. These variants form a Software Product Line (SPL). Ideally, testing a SPL involves testing all the software products that can be configured through the combination of features. This, however, is intractable in practice since a) large SPLs can lead to millions of possible software variants and b) the testing process is usually limited by budget and time constraints. To overcome this problem, this paper introduces PLEDGE, an open source tool that selects and prioritizes the product configurations maximizing the feature interactions covered. The uniqueness of PLEDGE is that it bypasses the computation of the feature interactions, allowing to scale to large SPLs.

## Categories and Subject Descriptors

D.2.5 [Software Engineering]: Testing and Debugging

## General Terms

Algorithms, Design, Experimentation

## Keywords

Software Product Lines, Combinatorial Interaction Testing, Scalability, Search-based Approaches, Prioritization, T-wise

## 1. INTRODUCTION

Specific needs of particular clients lead to the development of several variants of the same software. These variants, which share a common set of features while having distinct functionalities form a Software Product Line (SPL). SPLs rely on variability modeling which uses Feature Models (FMs) as the standard and compact representation [6] of

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all the possible products of a SPL. By representing the combination of features and expressing constraints, FMs allow configuring tailored software products.

Testing a SPL can lead to millions of possible variants to test, (it can be shown that 270 independent and optional features can cover more products than there are atoms in the universe). It results in a situation which is inconceivable in an industrial context subjected to time and budget constraints. As a consequence, it is necessary to reduce that testing effort by selecting the relevant variants to test.

Combinatorial Interaction Testing [2, 8] (CIT) focuses on the interactions between  $t$  features ( $t$ -wise). It has been identified as a relevant approach to reduce the number of products for SPLs [5, 11]. However, existing applications of CIT rely on the expensive computation of all the  $t$ -wise interactions, while considering the FM constraints. Although relying on efficient satisfiability (SAT) solvers, this problem is known to be NP-complete in the general case [5], limiting existing approaches to small features interactions, e.g.  $t = 2$  or  $t = 3$  for large SPLs.

This paper introduces PLEDGE, an open source Java tool that selects and prioritizes product configurations maximizing the number of  $t$ -wise interactions covered. The novelty of the tool is that it does not require to compute any feature interaction, thus allowing to scale to large SPLs and to any value of  $t$  [3]. It also allows specifying the desired number of product configurations to test.

The remainder of this paper is organized as follows. Section 2 present the research challenges underlying PLEDGE. Section 3 describes the approaches implemented by the tool and presents its features and architecture before giving a discussion. Finally, Section 4 concludes the paper.

## 2. RESEARCH CHALLENGES

The first research challenge is the *combinatorial explosion* of the number of products to consider. For instance, the FM of a video player [10] allows configuring more than  $4.5 \times 10^{13}$  different variants of this player. In that context, *how to test the SPL?* Testing all the possible products is intractable, leading to the necessity to reduce the number of products to test to a reasonable value while trying to maximize the level of confidence in the products that are tested.

The second challenge is the *scalability*. Existing techniques like [4, 5] are constraint-based, which makes the problem difficult to handle for large FMs, i.e. heavily-constrained FMs with more than 1,000 features. They also depend on

the value of  $t$  and are thus limited to small feature interactions. The tool presented in this paper aims at providing solutions using heuristic instead of constraints and does not depend on the value of  $t$ , allowing to scale to large SPLs.

The last challenge concerns the *order in which the products should be tested*. Suppose we know the software products that have to be tested, e.g. the products that will be sold. If the testing budget allows testing only some of these products, *which products should be tested first? What are the most important products?*

### 3. THE PLEDGE TOOL

PLEDGE - a Product Line Editor and tests Generation tool is an open source<sup>1</sup> Java application of around 4,000 lines of code in its current version. It aims at solving the above-mentioned challenges by both prioritizing and generating the product configurations to test.

#### 3.1 Approach To Products Prioritization and Generation

PLEDGE implements approaches [3] that make use of a similarity heuristic (see Section 3.1.2) to both generate and prioritize product configurations derived from a FM of a SPL with respect to  $t$ -wise testing. The advantage of the heuristic is that it avoids computing any  $t$ -wise interaction.

##### 3.1.1 $T$ -wise Testing

$T$ -wise testing focuses on the interactions between  $t$  features. At the FM level, we consider all the possible interactions between the features. Indeed, the FM describes the dependencies between all the features of the SPL, thus modeling all the possible variants that can be configured. It thus allows combining any  $t$  features together in a product variant.

With reference to the FM of Figure 1, a 2-wise combination of features is for instance  $(Calls, GPS)$ . The absence of a feature is also considered in a feature interaction. Thus, another example of such a 2-wise interaction might be  $(Calls, -GPS)$ . The  $t$ -wise interactions of a FM represents all the interactions between  $t$  features that are valid (i.e. which fulfill the constraints of the FM). For instance, the 3-wise interaction  $(Calls, GPS, -GPS)$  is invalid since the  $GPS$  feature is both selected and unselected. The validity of a given combination can be checked with a SAT solver.

A product configuration, i.e. a test case is a configuration of the FM. It can be seen as a list of selected and unselected features. The selected features are supported by the software variant while the unselected features are not. To simplify, we will refer to product configurations as products.

Considering the  $t$ -combinations between selected and unselected features of a product, it is possible to know the interactions covered by this specific product. By knowing the  $t$ -wise interactions covered by products, i.e. the test suite, it is possible to evaluate the  $t$ -wise coverage of these products with respect to all the valid  $t$ -wise interactions of the FM. For instance, the following product  $P$  is a valid configuration of the FM and corresponds to a test that is selected or prioritized by the tool. Selected features are preceded with + while unselected ones are preceded with the - symbol.

$$P = \{+Mobile\ Phone, +Calls, -GPS, +Screen, +Basic, -Colour, -High\ Resolution, -Media, -Camera, -MP3\}.$$

<sup>1</sup><https://github.com/christopherhenard/pledge>.

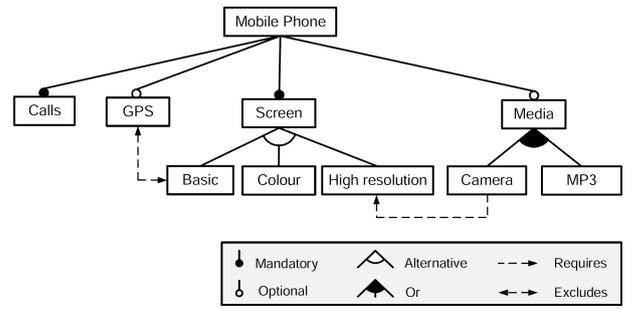


Figure 1: A simple feature model of a mobile phone product line [1], representing the features and their dependencies.

##### 3.1.2 $T$ -wise Products' Generation and Prioritization

The objective of the products' generation is to maximize the amount of  $t$ -wise combinations covered by the selected products. The prioritization aims at ordering products according to their ability to cover  $t$ -wise interactions.

Computing the  $t$ -wise combinations of features is computationally expensive. To overcome this problem, the prioritization and generation techniques [3] implemented by the tool bypass this problem. To this end, they consider products represented as a set of selected and unselected features. Based on this representation, a distance measure between two products has been introduced and serves as a similarity heuristic to compare the products. Experimental results [3] demonstrated the benefit of the similarity heuristic to mimic  $t$ -wise coverage.

To generate the products to test, the similarity heuristic was introduced as a fitness function to evaluate a set of products and to guide a search process. To this end, a SAT solver [9] was used to generate valid configurations of the FM forming the search space. Then, a search-based approach guided by the fitness function performed the selection of the products to test, replacing the worst product in terms of fitness by another product from the search space. The approach is executed during a user-specified amount of time and return the user-specified number of products required to test, which are prioritized on the fly. To prioritize a given set of products, two approaches called *Greedy* and *Near Optimal* were proposed [3]. They make use of the distance between the products to order them.

An experimental study conducted on 124 FMs from 11 features to  $\approx 7,000$  features demonstrated the benefit and scalability of these approaches [3]. For instance, Table 1 presents the  $t$ -wise coverage for  $t = 2, \dots, 6$  reached with 50 and 100 products generated for the Linux Kernel 2.6.28.6 FM (6,888 features) in 30 minutes on 10 independent executions. Regarding the prioritization, Figure 2 depicts the  $t$ -wise coverage difference between our approach and a random one on a set of 500 products, averaged on the 124 FMs studied on 10 independent executions. For instance, 14% of difference is observed with 100 products for  $t = 6$ .

In addition, the conducted experiments demonstrated that the test generation approach competes with existing  $t$ -wise tools, e.g. [4, 5] that are generally limited to small values of  $t$  (i.e.  $t = 2$  or  $t = 3$ ) while allowing to mimic  $t$ -wise for greater value of  $t$ . The proposed approaches are designed to handle large scale SPLs since they do not compute any

**Table 1: T-wise coverage (%) achieved for the Linux Kernel 2.6.28.6 feature model (6,888 features) with 50 and 100 products generated in 30 minutes for 10 independent executions.**

	50 products	100 products
2-wise	96.92%	97.71%
3-wise	91.96%	94.60%
4-wise	81.37%	88.53%
5-wise	64.42%	77.38%
6-wise	45.24%	61.13%

combination of features and do not depend on the value of  $t$ . Further experimental results are available in [3].

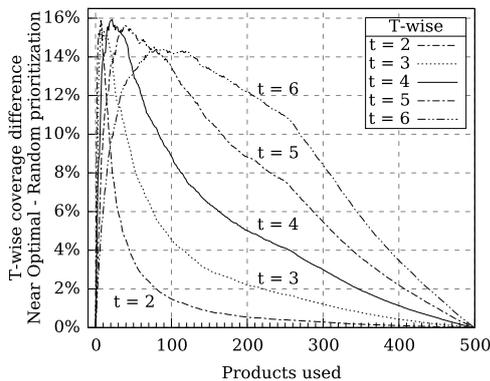
### 3.2 Fonctionnalités and Usage

The current version of PLEDGE allows performing the following actions:

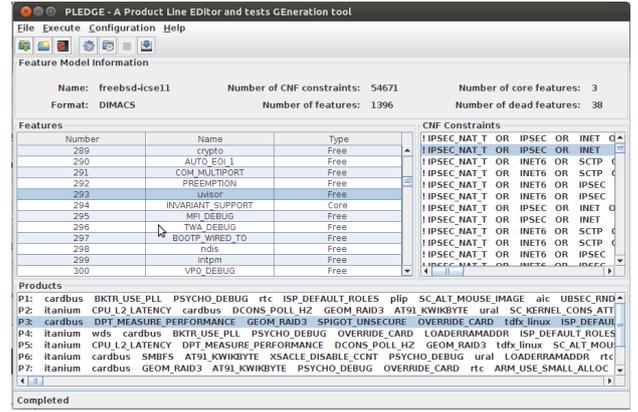
- Loading a FM from a file. PLEDGE supports the SPLOT [10] and DIMACS (Conjunctive Normal Form) formats,
- Visualizing the FM information, like its constraints and features,
- Editing the FM, by adding or removing constraints,
- Generating the products to test from the FM, by specifying the number of products desired and the time allowed for generating them,
- Loading an arbitrary<sup>2</sup> list of products and prioritize them according to one of the two prioritization techniques proposed,
- Saving the generated or prioritized products to a file.

The tool can be used with both a command line and graphical user interface (GUI). Figure 3 show the GUI of PLEDGE. The command line interface eases the use of the tool in a scripting or automated context while the GUI is more user-friendly. In terms of usage, an HTML user guide is

<sup>2</sup>Whatever the way the have been generated.



**Figure 2: T-wise coverage difference with a random prioritization for 10 independent executions. The results are averaged on 124 feature models.**



**Figure 3: PLEDGE’s graphical user interface.**

embedded in the application to help the user using the tool. In terms of development, the source code and the Javadoc documentation are available. Since the tool is open source, it can be used as a library as well.

### 3.3 Architecture

PLEDGE is built upon the Model-View-Controller (MVC) architecture [7]. This architecture allows separating the internal logic (the model) from the graphical representation (the view) and the user’s interaction with it (the controller(s)). Concretely, the model is observed by the view, which graphically represents the model. When the user performs an action on the GUI, a controller acts on the model to change its internal representation which triggers the view to be refreshed. The main advantage of this architecture is the separation of concerns and the code reusability. The tool also makes use of common design patterns [12], like the *strategy* pattern to implement the products’ prioritization and generation techniques, the *adapter* pattern to map the model of complex graphical component to the tool’s model or the *observer* pattern to implement the MVC architecture.

The architecture of the products’ prioritizer and generator units are presented in Figure 4. The products prioritizer (see Figure 4(a)) takes as input the list of products to prioritize and the prioritization technique to use. The prioritization technique is specified using the *strategy* design pattern. The prioritization unit is using the similarity distances computed on the products and the ordering technique to output the prioritized list of products.

The products’ generator (see Figure 4(b)) takes as input the FM, the generation technique, the number of products to test and the time allowed for generating them. Internally, it uses a SAT solver to handle the FM constraints and to get valid products. The algorithm, specified by the generation technique via the *strategy* design pattern uses the allowed amount of time to generate the number of products specified.

### 3.4 Discussion

The products’ generation technique implemented by the tool requires the number of products to generate and the amount of time allowed to generate them to be manually specified by the user. These parameters aims at making the testing process flexible. Indeed, other approaches, e.g. [5] generate all the products required to achieve 100% of coverage of the  $t$ -wise interactions. The inconvenient of these

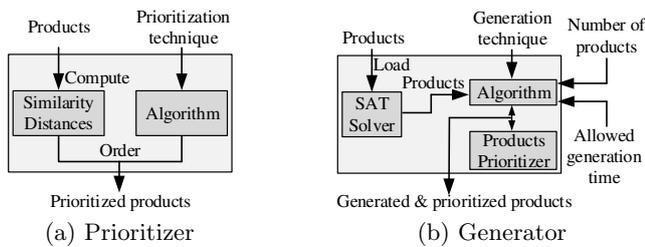


Figure 4: PLEDGE's architecture.

approaches is that they may take a large amount of time to perform this full coverage and they may generate too many products. To the authors' knowledge, the approach implemented by PLEDGE is a unique feature which aims at maximizing the  $t$ -wise coverage for the specified amount of products, using the specified amount of time. It thus gives a partial coverage but also makes the testing process more tractable with large SPLs. In addition, the prioritization of a given list of products is a unique feature of the tool.

Both the products' generation and prioritization methods scale to large FMs. While using constraints solver, we understood that solving constraints takes time and is an obstacle to scalability. We also found out that computing the  $t$ -wise coverage of products is not tractable for large FMs since all the  $t$ -wise combination of the products have to be considered. The products' generation approach makes use of a SAT solver only for generating valid products. Instead of using constraints, the proposed approaches are driven by a similarity heuristic. The benefit of this heuristic is that it mimics  $t$ -wise coverage and does not require to compute any combination of feature. It also does not depend on  $t$ . We show in [3], Section V.A the benefit of the heuristic in terms of computation.

Finally, while using a SAT solver to generate valid products, we found out that the generated products were predictable due to the fact that the constraints and the literal of the clauses are assigned values in a particular way. It means that one can guess the products that will be returned by the solver since it always assign values to the variable in same order. To overcome this problem, we randomized the way the solver assign values to its internal variables in order to get products from all the valid products' space.

#### 4. CONCLUSION AND FUTURE WORK

We presented PLEDGE, an open source and publicly available Java tool that allows generating and prioritizing product configurations of a SPL. It solves the challenge of testing a SPL in the context of Combinatorial Interaction Testing by selecting the products which maximize the  $t$ -wise interactions between features. By drastically reducing the number of products to test and ordering them while avoiding the combinatorial explosion induced by the computation of the  $t$ -wise interactions, it provides both a great level of flexibility and usability in a real and industrial testing process.

The current version of PLEDGE is the first release. The tool will be extended with additional features, including:

- The ability to draw a feature diagram and generating its boolean formula,
- The implementation of other prioritization and gener-

ation techniques via a plug-in system,

- The implementation of  $t$ -wise coverage computation and results visualizer,
- Integration as an Eclipse plug-in,
- Support of additional feature models format,
- Implementation of FM re-engineering techniques.

Finally, we invite researchers, developers and students to use our tool and/or to contribute to its development:

<http://research.henard.net/SPL/PLEDGE/>.

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## APPENDIX

This appendix presents the plan for the live demonstration of the tool. The presentation will be divided into four parts and will mainly focus at presenting the usage of the tool via the graphical user interface. The command line interface of the tool will be briefly described at the end to demonstrate the different way to use the tool. It should be noted that additional features may be integrated to PLEDGE and exhibited the day of the demo, depending on what will be added to the tool by the day of the presentation (see Section 4).

### A. INTRODUCTION AND GENERAL PRESENTATION OF THE TOOL

The first part of the presentation will aim at presenting the challenges and objective of the tool. To this end, the notion of feature model and software product line testing will first be introduced. Then, a general overview of the techniques to solve the challenge of software product line testing will be described. Finally, the main features as long as the architecture and usage of the tool will be presented.

### B. GENERATING PRODUCTS

Here, we will describe the use of PLEDGE to generate valid products from a feature model. To this end, we will first show how to load a feature model into PLEDGE. Details about the SPLOT and DIMACS feature model formats will also be given. Then, we will present the part of the graphical user interface displaying the feature model information and we will demonstrate the products' generation.

We will show how to specify the generation technique to use how to launch the products' generation. The products' generation parameters that have to be specified will be explained (see Figure 5). Finally, after the generation of the products, we will present how to save them to a file. Figure 6 presents the results of the products' generation. The generated products are displayed on the lower part of the application's window.

### C. PRIORITIZING PRODUCTS

This part of the presentation will aim at introducing the products' prioritization with PLEDGE. To this end, we will first describe the file format representing the products. Then, we will show how to launch an arbitrary list of products into PLEDGE and how to starts the prioritization.

We will also present how to specify the prioritization technique and what are the difference between each technique. Figure 8 shows the specification of the prioritization tech-

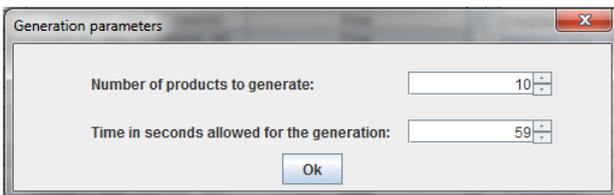


Figure 5: Configuration of the products' generation. The number of products to generate and the time allowed for generating them are input parameters.

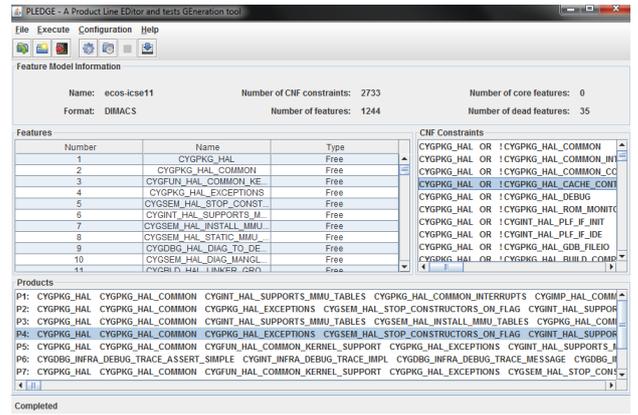


Figure 6: Results of the products' generation. The selected features of each of them are listed in the application.

nique. Finally, we will demonstrate how to save the resulting prioritized products to a file.

### D. COMMAND LINE INTERFACE, DOCUMENTATION AND FUTURE IMPROVEMENTS

The last part of the presentation will first briefly demonstrate the command line interface of the tool. Then, the embedded and online documentation<sup>3</sup> of PLEDGE will be presented. Figure 7 illustrates a screenshot of this documentation embedded in the application.

Finally, the forthcoming features to be added to the tool will be presented. The presentation will end with a questions/answers session. The objective of this session is to get a first feedback on the tool.

<sup>3</sup><http://research.henard.net/SPL/PLEDGE/doc/>

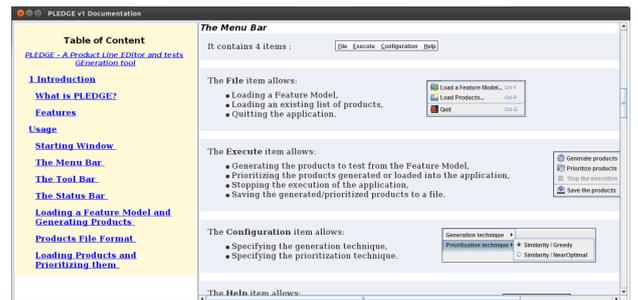


Figure 7: Embedded HTML user guide. It presents the features of the tool and how to use them.

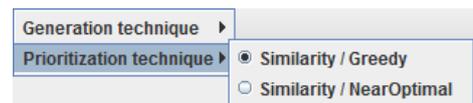


Figure 8: Setting the prioritization technique.