

# **Lightweight Testing for Configurable Systems**

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# What is a Configurable System?

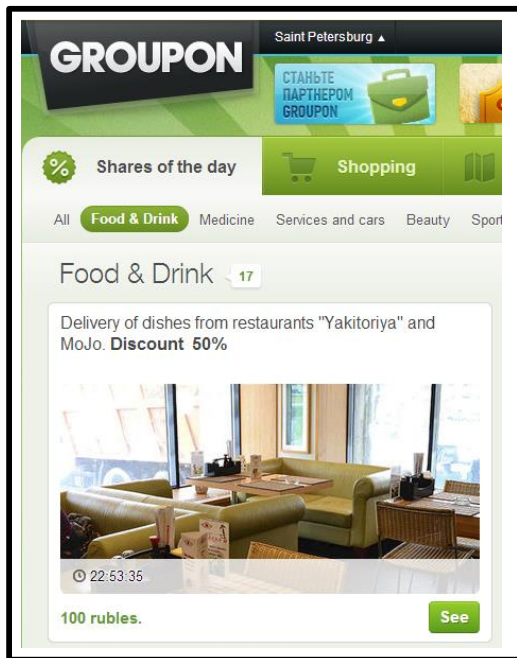
A system made up of several named parts, one of which is the base. Those parts often share functionality.

# Why Configurable Systems?

## Improve Productivity

Ability to add or remove features as new demands emerge.

# Used in practice



# Hot topic in research

- Several papers accepted in recent editions of ICSE, ASE, and FSE.
- Specialized venues. E.g.,
  - Modularity (previously AOSD)
  - Software Product Line Conference (SPLC)
  - Intl. Conference on Generative Programming (GPCE)

# Contents

- Background
- Testing Configurable Systems
  - What to test and what configurations to test?
  - Test adequacy
  - Interpreting test results
  - Debugging configurations
  - GCC

- Research

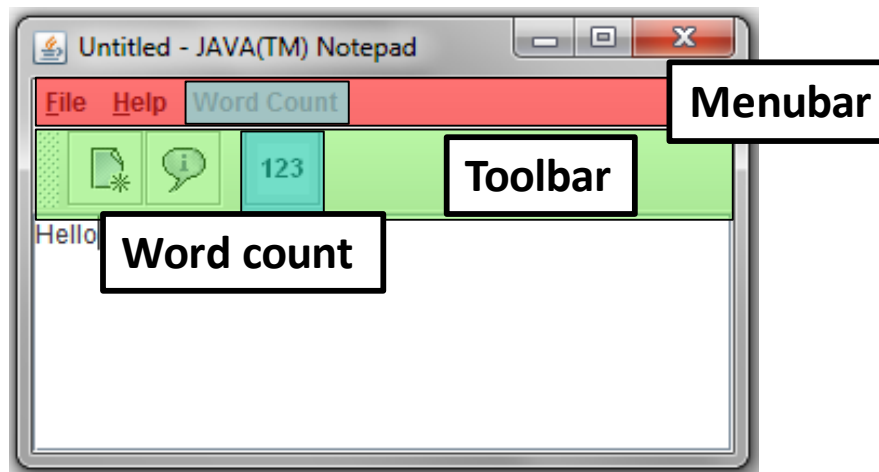
Material of this talk is available at  
<http://goo.gl/ctPcqe>

**BACKGROUND**

# Terminology

- **Feature**
  - Distinct system functionality
  - Example

Notepad





# Terminology

- **Feature Option**

- Features are controlled through input options
  - The value “true” indicates enable for boolean options
- Options need not to be boolean
  - In eCos (embedded OS), most options are non-boolean
    - ~54% of options are non-boolean (e.g., number and string)
    - “A Study of Non-Boolean Constraints in Variability Models of an Embedded Operating System”, Passos *et al.*, FOSD, 2011
  - In Apache Web Server, most options are boolean
    - ~92% (=158/172) of options are boolean
    - “Moving Forward with Combinatorial Interaction Testing”, Yilmaz *et al.*, *IEEE Software*, 2014

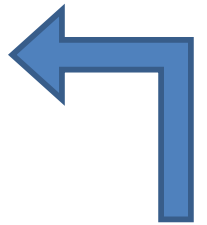
# Terminology

- **Configuration**

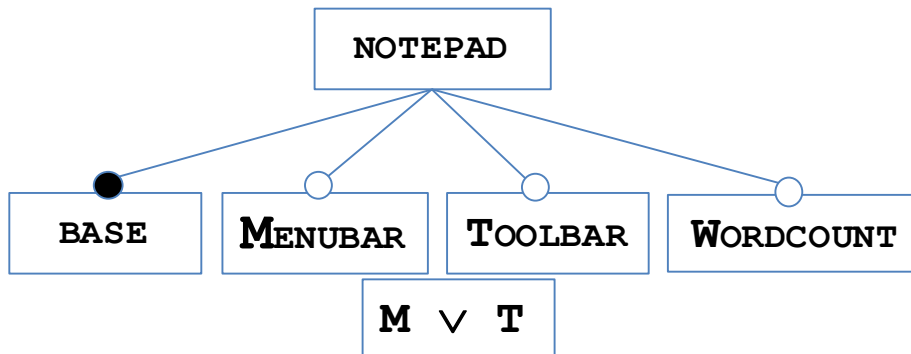
- A selection of features
- Features may not be all independent

- **Feature Model**

- Description of a set of acceptable configurations
- Important for understanding and for **testing**
- Unfortunately, often not documented



# Feature Model (FM)



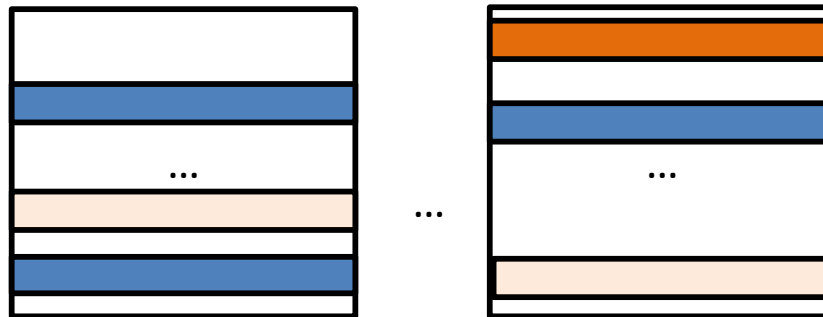
SMT-LIB encoding.  
Follow example.

- Encode different forms of constraints
  - Mandatory (BASE) and optional (others)
  - Cross-feature
  - Alternative, etc.

# Terminology

- **Variation**

- Manifestations of features in artifacts
- Scenario:
  - Feature is scattered across artifacts
  - Variations in artifacts collectively express feature



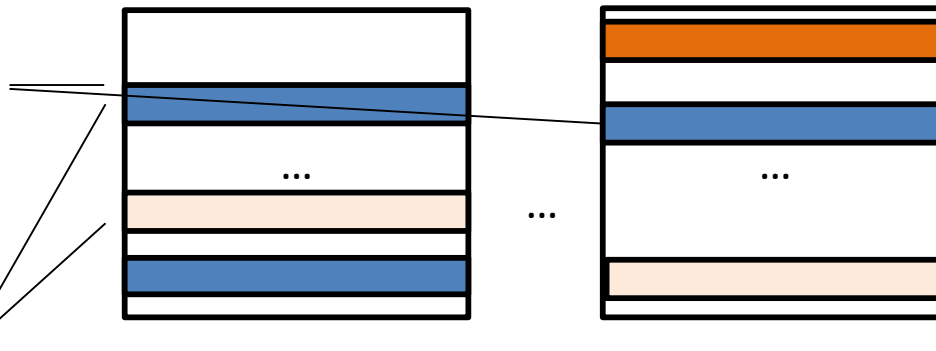
Artifacts

# Terminology

- **Variation**

- Manifestations of features in artifacts
- Scenario:
  - Feature is scattered across artifacts
  - Variations in artifacts collectively express feature

**Scattering** of the  
same concerns  
across artifacts



**Tangling** of different  
concerns in one artifact

Artifacts

# Terminology

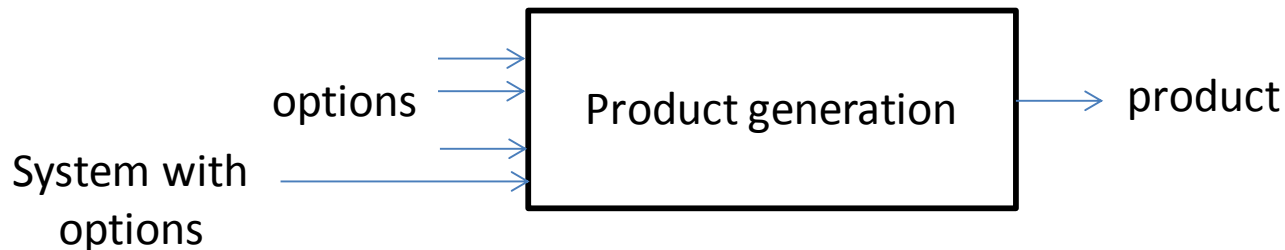
- **Product**

- Specialization of a configurable system for a particular configuration (set of features)

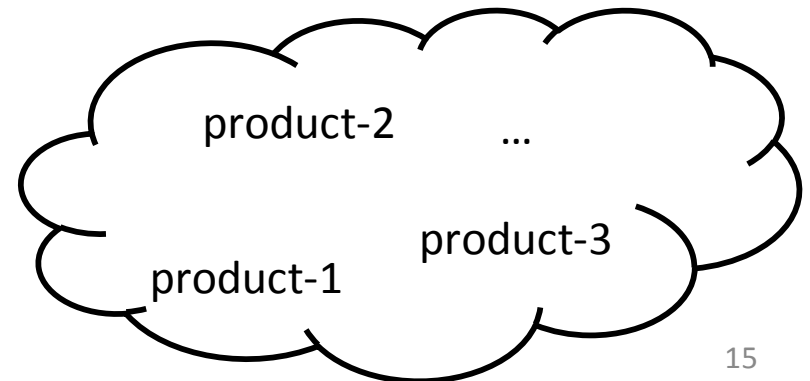
The term “configuration” is sometimes also used to denote the product that implements that configuration.

# Terminology

- **Generation of a product**
  - Process of generating a product
    - Input: Selection of features, system
    - Output: Product that implements features



A configurable system is often called a family of systems.



# Terminology

- Binding time of features
  - Static binding

Often called Software Product Lines

    - Annotative (e.g., #ifdefs)
      - Flexible but easy to introduce errors and hard to maintain
    - Compositional (e.g., AHEAD, AOP, etc.)
      - Easy to maintain but requires a new methodology for coding
  - Dynamic binding
    - Program state determines what features are enabled



# Static (Annotative)

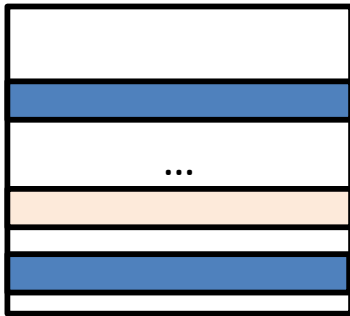
- Approach
  - Annotate program with preprocessor directives guarded by feature (boolean) expressions
    - E.g., `#ifdef FORMAT ... #endif`
  - At build time, decide/bind value of each variable

See TankWar game example.

# Static (Compositional)

Artifacts

Non compositional



...



Compositional



...



...



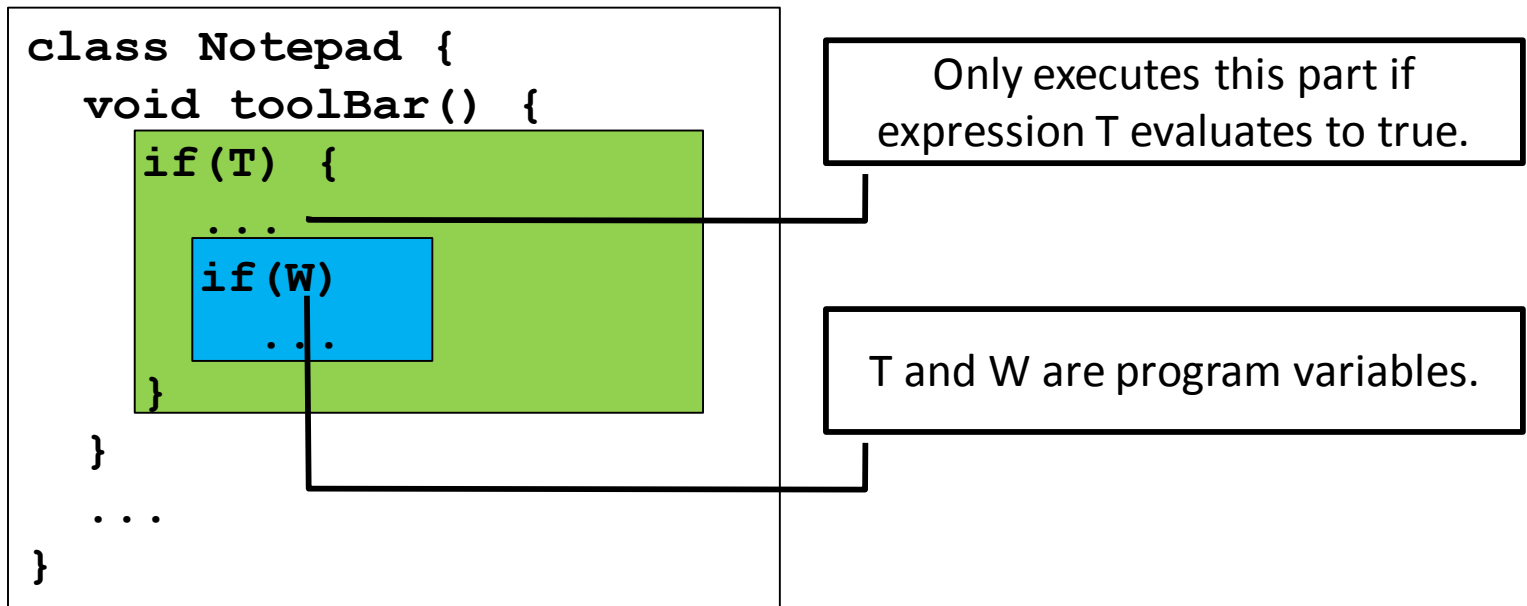
...



- Partitions code w.r.t. features
  - Avoid scattering and tangling of concerns
- Several supporting languages. E.g., AHEAD, HyperJ, AspectJ, etc.

# Dynamic

- Approach
  - Condition execution of code based on the evaluation of feature expressions



# TESTING

# What to test?

- Feature Testing
  - Analogous to Unit Testing
    - Example: Test the feature “Sound” in TankWar or the feature "Wordcount" in Notepad
- System Testing
  - As usual, but features are treated as inputs

# What configurations to test? (1/3)

- Default configuration
  - Run test on one special (default) configuration
    - For example, consider default a configuration with the most popular set of features
- Random
  - Run test on a selection of random configurations

# What configurations to test? (2/3)

- Exhaustive
  - Run test on all configurations
    - Potentially very expensive
    - Optimizations to address combinatorial explosion
      - Use feature model
      - Only consider reachable configurations from tests
    - SPLat (later discussed) builds on these optimizations

“SPLat: Lightweight Dynamic Analysis for Reducing Combinatorics in Testing Configurable Systems”, Kim *et al.*, *ESEC/FSE’13*.

# What configurations to test? (3/3)

- Combinatorial Interaction Testing (CIT)
  - Run test on a selection of configurations
  - Generate covering arrays (e.g., 2-way covering arrays) that satisfy FM constraints

Example\* of a traditional  
2-way covering arrays (no  
constraints added)

A	B	C	D	E
0	1	1	2	0
0	0	0	0	0
0	0	0	1	1
1	1	1	0	1
0	1	0	0	2
1	0	1	1	0
1	1	1	1	2
1	0	0	2	1
1	0	0	2	2

A, B, and C are binary feature  
variables while D and E are  
ternary. Overall, there are 72  
( $=2^3 \cdot 3^2$ ) combinations.



# TEST ADEQUACY

# Coverage

- Not well studied in this context
- Problem: Lack of mapping from features to code
  - See non-compositional impl. mechanisms
  - If mapping is available, it is possible to compute feature coverage
    - Related to the TAROT'14 talk of Breno Miranda on “Relative Coverage”

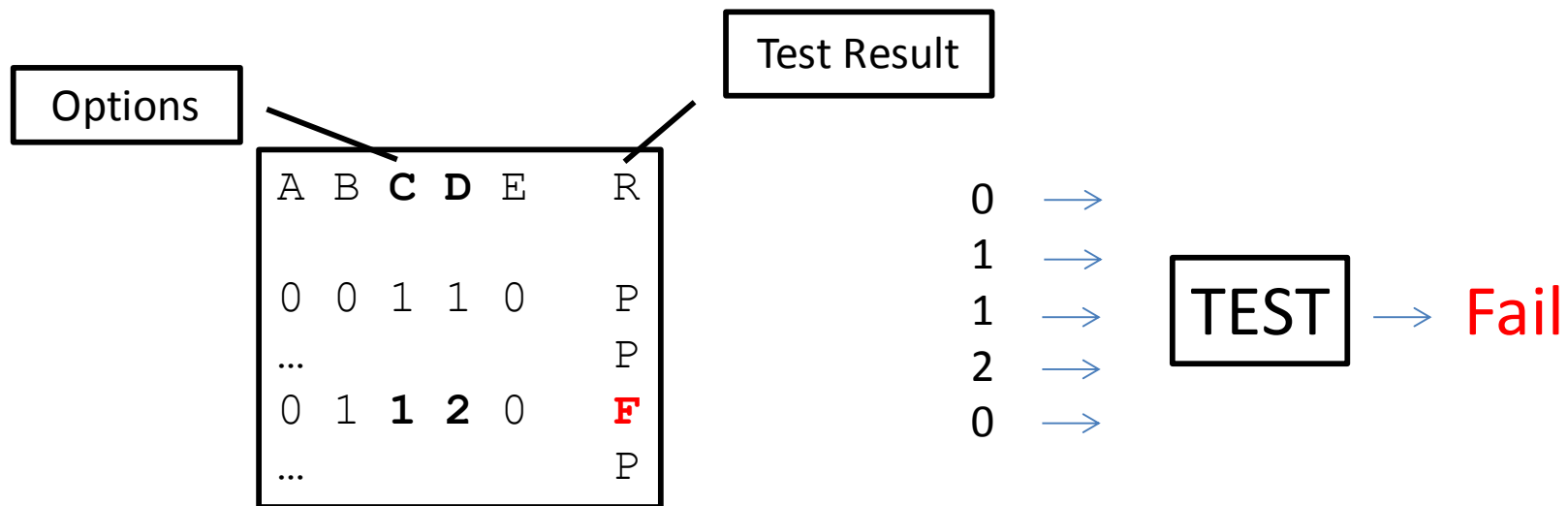
# Mutation analysis

- Not very well studied too
- What mutants to apply?
  - “Feature Interaction Faults Revisited: An Exploratory Study”, Garvin and Cohen, ISSRE’11.
    - E.g., modify feature expressions in `#ifdef` conditionals
- Problem: Even more expensive than mutation analysis on non-configurable systems
  - Tests x Configurations x Mutants

# **INTERPRETING TEST RESULTS**

# Feature Interaction

- Scenario: Used 2-way covering arrays and found exactly 1 failure



- Observation: Pair (C=1, D=2) is distinctly covered
- Hypothesis: Features C and D interact

# Masking Effect

- Scenario: Found multiple failing executions
- Conjecture: Failures are due to the combinations of distinct features

Distinct pairs  
covered

A	B	C	D	E	R
...					P
0	1	1	2	0	<b>F</b>
1	1	0	1	0	<b>F</b>
1	1	0	2	1	<b>F</b>
...					P

It can happen that  
this test will fail  
simply because B=1

# **DEBUGGING CONFIGURATIONS**

# Debugging Configurations

- Scenario
  - Test fails on a particular configuration (see below), which options are relevant and which are not?

A	B	C	D	E	R
0	1	1	2	0	F

0	→	<div>TEST</div>	→	Fail
1	→			
1	→			
2	→			
0	→			



# Debugging Configurations

- Scenario
  - Test fails on a particular configuration (see below), which options are relevant and which are not?

A	<b>B</b>	C	D	E	R
0	0	1	2	0	F

Pick one variable,  
alternate its value,  
observe results.

Refer to the discussion  
on the “Alternating  
Variable Method” from  
Gordon Fraser’s talk.

# Debugging Configurations

- Scenario
  - Test fails on a particular configuration (see below), which options are relevant and which are not?

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# Debugging Configurations

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1	0	1	2	0	F

Pick one variable,  
alternate its value,  
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# Debugging Configurations

- Scenario
  - Test fails on a particular configuration (see below), which options are relevant and which are not?

A	B	C	D	E	
1	0	1	2	1	P

Pick one variable,  
alternate its value,  
observe results.



# Debugging Configurations

- Scenario
  - Test fails on a particular configuration (see below), which options are relevant and which are not?

A	B	C	D	E	R
?	?	1	2	0	F

Options C, D, and E are relevant to induce failure.

Pick one variable, alternate its value, observe results.

# Further Reading

- Delta Debugging (DD). Zeller *et al.*
  - <https://www.st.cs.uni-saarland.de/dd/>
- “Locating errors using ELAs, covering arrays, and adaptive testing algorithms”, Martinez *et al.*, *SIAM Journal of Discrete Mathematics*, 23(4):1776–1799, 2009.
- “Spectrum-based Fault Localization in Embedded Software”, Rui Abreu, PhD thesis, Delft University, November 2009.

**GCC**

# GNU Compiler Collection (GCC)

- Supports several front-ends and back-ends
- Both static (annotative) and dynamic bindings
- Uses DejaGnu for Testing
  - DejaGnu is the testing framework of GNU
    - Git access:
      - `git clone git://git.sv.gnu.org/dejagnu.git`

# DejaGnu

- Important features
  - Supports testing of interactive systems
    - Think of testing a shell command like “ls”
  - Language independent
    - Black-box interaction
    - Assertions defined with string matching
- Written in Expect, which is written in Tcl
  - Expect acts as a programmable shell
  - See <http://www.nist.gov/el/msid/expect.cfm>

# DejaGnu

See Calc example

This example has no code variations. The purpose is to illustrate DejaGnu at use.

# GCC DejaGnu test

This test will only compile on GCC using the C compiler front-end.

ext-4.c

```
/* Test for scanf formats.  %a extensions. */
/* Origin: Joseph Myers <jsm28@cam.ac.uk> */
/* { dg-do compile } */
/* { dg-options "-std=gnu89 -Wformat" } */

#include "format.h"

void foo (char **sp, wchar_t **lsp) {
  /* ... */
  scanf ("%as", sp);
  scanf ("%aS", lsp);
  scanf ("%a[bcd]", sp);
}
```

Options passed to the compiler. Many other exist; default values used.

**RESEARCH**



# Research Problems

- Testing
  - High Dimensionality
  - Lack of Feature Models
- Design & Implementation
  - Safe Composition
  - (Safe) Decomposition

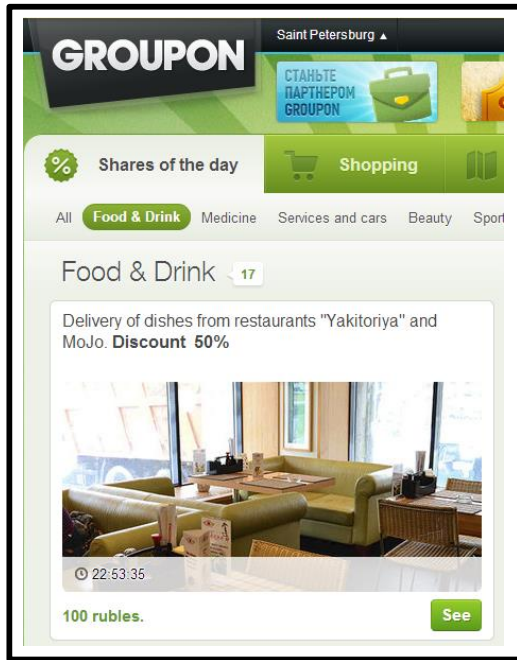
Work led by PhD student  
Sabrina Souto  
(sfs@cin.ufpe.br)

# High Dimensionality

## Our Solution

### -- SPLat --

# High Dimensionality



[www.groupon.com](http://www.groupon.com)

170+ boolean variables  
 $2^{170+}$  configurations

The same test needs to be run  
against many configurations

E.g. The same Ruby on Rails test for  
Groupon needs to be run against all  
configurations

# Existing Techniques

- **Sampling** [Cohen *et al.* ISSTA'07, Perrouin *et al.*, ICST'10, Garvin and Cohen ISSRE'11, Song *et al.* ICSE'12, Shi *et al.* FASE'12]
  - Heuristically sample the configuration space
    - Fast! But can miss errors or produce redundant tests
- **Exhaustive** [d'Amorim *et al.* ISSTA'07, Rhein *et al.* JPF'11, Kim *et al.* AOSD'11, Kastner *et al.* FOSD'12, Kim *et al.* ISSRE'12, Apel *et al.* ICSE'13]
  - Static/dynamic analysis for pruning redundant configurations
    - Safe! But slow and often doesn't scale

# Proposal: SPLat

- Observation
  - Each test exercises a small portion of code
- Assumption
  - Feature variables can be easily identified in code
- Proposal
  - Explore all combinations of features dynamically reachable from a test
  - Can be optimized to only consider configurations consistent with feature model

# SPLat in a Nutshell

1. Determine reachable configurations *during* execution
2. Set feature value when feature is encountered
3. Keep a stack of encountered features
4. Repeat until explore all legal combinations of encountered features

# SPLat on Notepad

- 1<sup>st</sup> run

Stack

T	false
---	-------

Configurations Executed

TWM= <false, ?, true>  
(M=true due to  $T \vee M$ )

- 2<sup>nd</sup> run

W	false
T	true

TWM=<true, false, ?>

- 3<sup>rd</sup> run

W	true
T	true

TWM=<true, true, ?>

- 4<sup>th</sup> run

W	true
T	true

Nothing to execute

```
class Notepad {
    void toolBar() {
        if(T) {
            ...
            if(W)
                ...
        }
    }

    ...

    void test() {
        toolBar();
    }
}
```

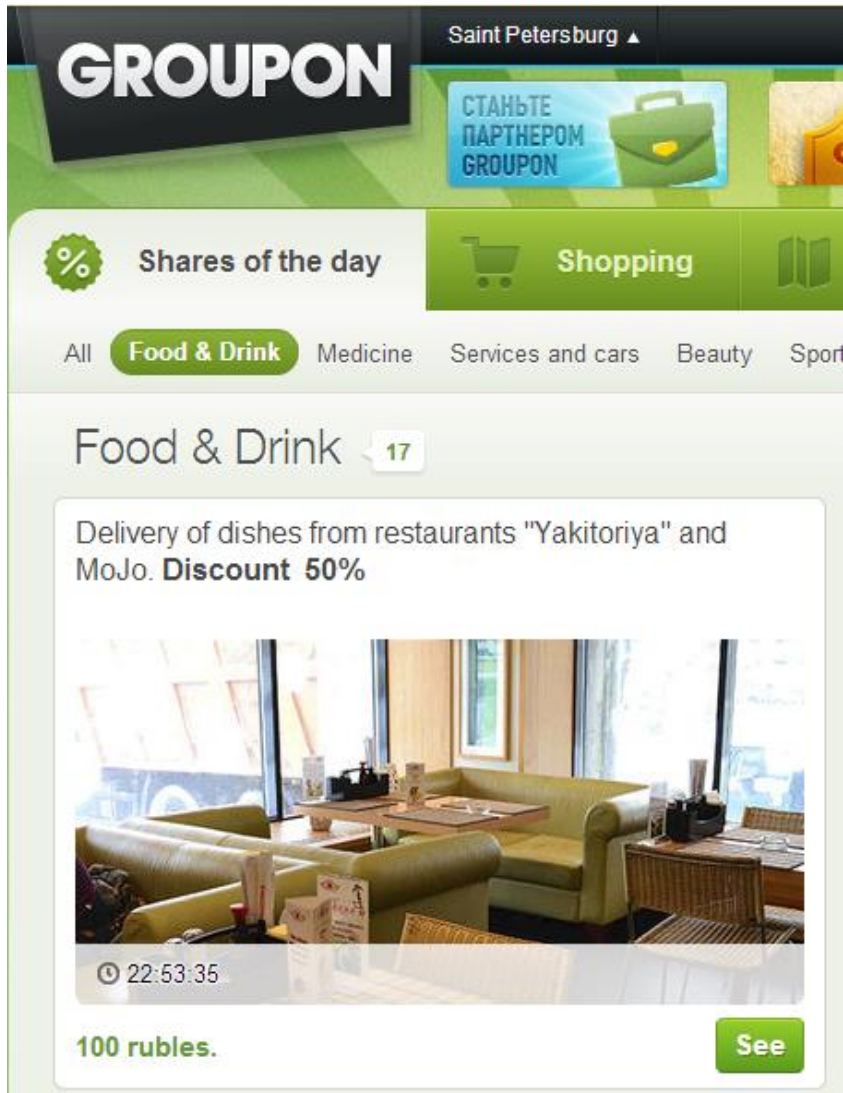
**Constraint:  $T \vee M$**

# Evaluation

- Run SPLat on 10 SPLs
- Baselines
  - Exhaustive (worst case)
  - Static Reachability
  - Ideal (best case)
- SPLat was better for almost all cases
  - Overhead was high for short-running executions



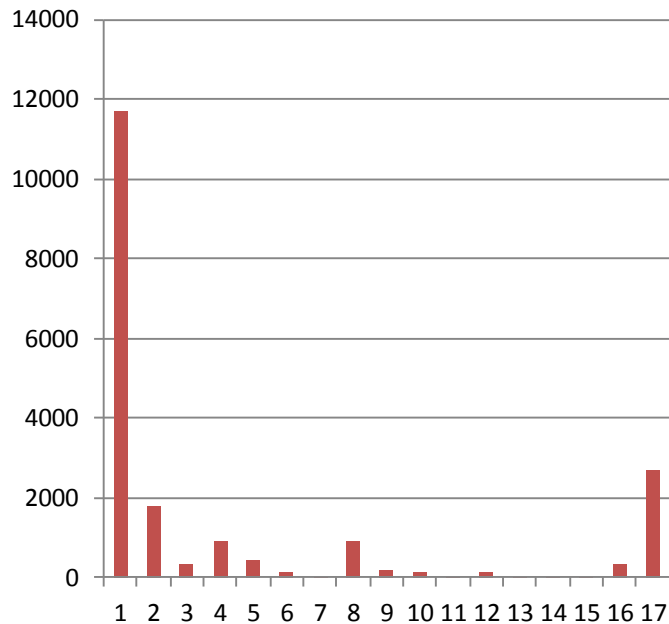
# Groupon Evaluation: Setup



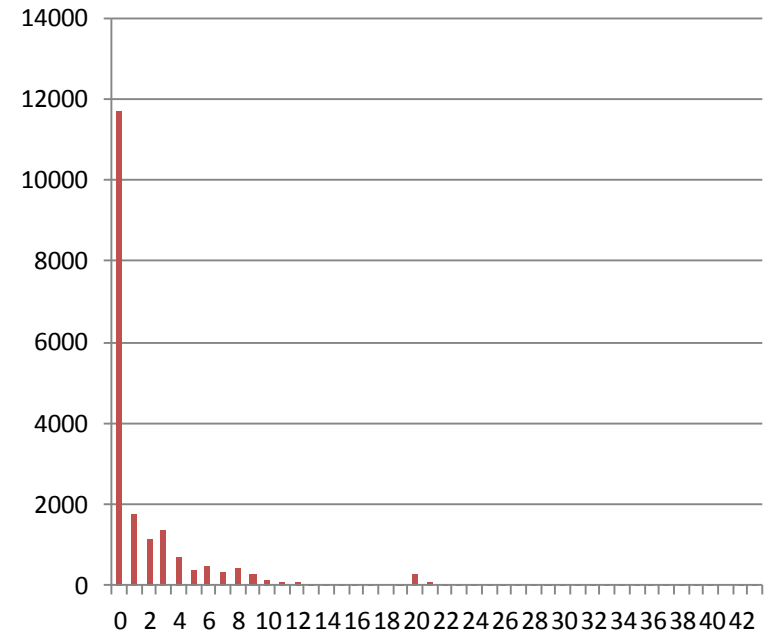
- How well does SPLat scale?
- Experiment
  - Ruby on Rails implementation of SPLat
  - Applied against the Groupon code base
    - 4.5 years of work from 250+ engineers
    - 400K+ LOC (171K LOC of server side, 231K lines of tests)
    - 19K tests
    - 170 boolean feature variables (up to  $2^{170}$ )

# Groupon Evaluation: Results

Number  
of tests



No. of configurations executed



No. of features accessed

# Summary of SPLat

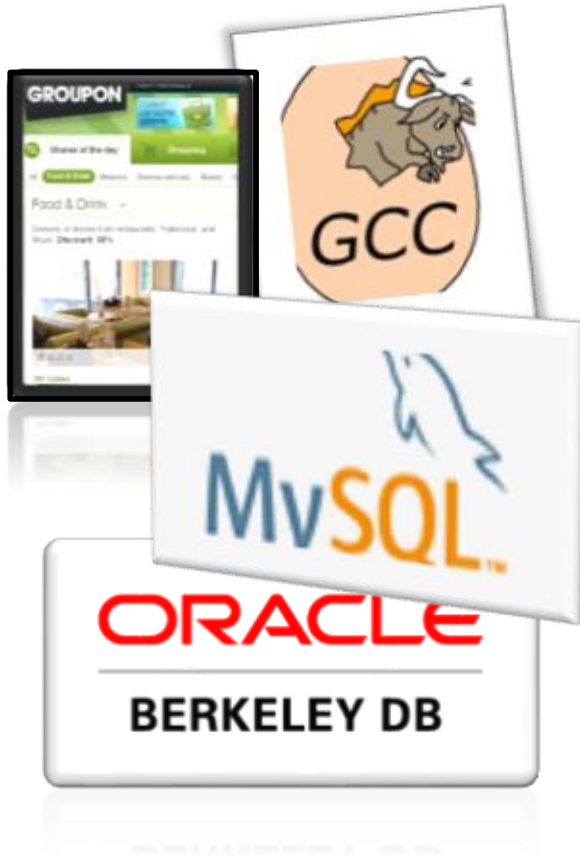
- Hypothesis: most tests exercise a relatively small number of configurations
  - Confirmed with Groupon case study
- It misses no configurations
- Low overhead compared to running selected configurations with no instrumentation
- Limitations
  - SPLat is not able to find equivalent states during executions (merging)

# Lack of Feature Models

## Our Solution

### -- **SPLif** --

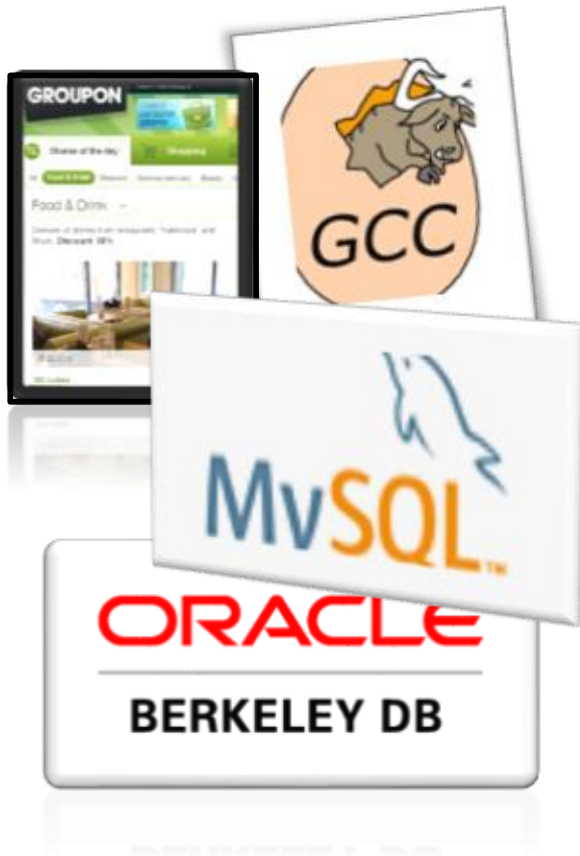
# Lack of Feature Models



- Feature Models are important but often are not documented

Why important? A test failure due to a configuration that is not in the (missing) model is meaningless.

# Lack of Feature Models



- Feature Models are important but often are not documented

Why not documented?

# Existing Reverse Engineering Techniques

- Static Analysis [She *et al.* ICSE'11]
- Information Retrieval [Alves *et al.* SPLC'08, Davril *et al.*, FSE'13]
- Evolutionary Search [Lopez-Herrejon *et al.* SSBSE'13]
- Custom solutions [Haslinger *et al.* FASE'13]

No prior work builds on  
tests and their executions

# Basic Terminology

- Partial vs. Complete Configuration

MTW=0\*1 (partial)

MTW=010 (complete)

Recall Notepad Features:  
**M**enubar, **T**oolbar, and  
**W**ordcount

- Consistent vs. Inconsistent Configuration

MTW=0\*1 (consistent)

MTW=00\* (inconsistent)

Recall Notepad Constraint:  
**M** ✓ **T** (Undocumented )



# Proposal: SPLif

- Revise the feature model during Testing
  - Ask the user to label configurations
    - If configuration is consistent, inspect!
- Assumptions
  - User is aware about many feature relationships
  - User makes no mistake :-)

# SPLif Example (1 test)

- Configurations (MTW):

111

011

110

010

10\*

00\*

```
class Notepad {  
    void toolBar() {  
        if (T) {  
            ...  
            if (W)  
                ...  
        }  
  
        if (M) { ... }  
    }  
  
    ...  
  
    void test() {  
        toolBar();  
    }  
}
```

# SPLif Example (1 test)

- Configurations (MTW):

111

011 ✖

110

010

10\* ✖

00\* ✖

Execution of  
some tests fails!

# SPLif Example (1 test)

- Configurations (MTW):

011 ✖

Select failing  
configurations

10\* ✖

00\* ✖

# SPLif Example (1 test)

- Configurations (MTW):

00\*

10\*

011

Rank  
configurations  
for inspection

# SPLif Example (1 test)

- Configurations (MTW):

00\*

Inconsistent!

10\*

011

# SPLif Example (1 test)

- Configurations (MTW):

00\*

Inconsistent!

10\*

011

Partial Feature Model (PFM) =  $\neg(\bigcup c_i)$ ,  
where  $c_i$  is an inconsistent configuration

In this case  $c_1 = (\neg M \wedge \neg T)$  and PFM =

$\neg(\neg M \wedge \neg T)$

$M \vee T$

**M**  $\vee$  **T**

# SPLif Example (1 test)

- Configurations (MTW):

00\*

Inconsistent!

10\*

011

Partial Feature Model (PFM) =  $\neg(\bigcup c_i)$ ,  
where  $c_i$  is an inconsistent configuration

Configurations that violate this  
constraint will not be inspected!

In the

$\neg(\neg M \wedge$

$\neg M \vee$

**M**  $\vee$  **T**



# SPLif Example (1 test)

- Configurations (MTW):

00\*

10\*

011

Consistent

Partial Feature Model:

$\mathbf{M} \vee \mathbf{T}$

The test failed on a configuration where no inconsistency has been observed. Tester should inspect!

# SPLif Example (1 test)

- Configurations (MTW):

00\*

**10\***

011

Consistent

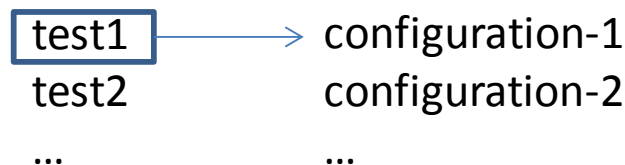
Partial Feature Model:

**M**  $\vee$  **T**

Feature model obtained is complete in this case. But that is not always the case.

# Evaluation Setup

- Asked students to generate tests for 5 SPLs
  - 212 tests in total
    - Of these 85 tests fail for some configuration (~40%)
  - 7378 configurations in total
    - Of these 1220 fail (~16%)
    - Of these 154 are consistent (~12%)
- SPLif ranks tests likely to contain consistent configurations and configurations on each test



# Evaluation Setup

- We inspected tests and failing configurations
- Configuration inspection
  - Consistent configuration found => Bug in test or code
  - Inconsistent configuration found => Update in model

# Evaluation Results

- # of configuration inspections smaller than # failing configurations
  - SPLif uses set of concrete configurations (due to ?)
- No bug in code found
- Few test repairs needed
  - Most cases only one change needed in test

# Design & Implementation

## Safe Composition

# Safe Composition

- Problem
  - Are there inconsistencies in code?
  - This is a well studied problem
    - “Safe composition of product lines”. Thaker *et al.*, GPCE’07
    - “Safe composition of knowledge-based software product lines”, Teixeira *et al.*, JSS’13
    - ...

# One Approach

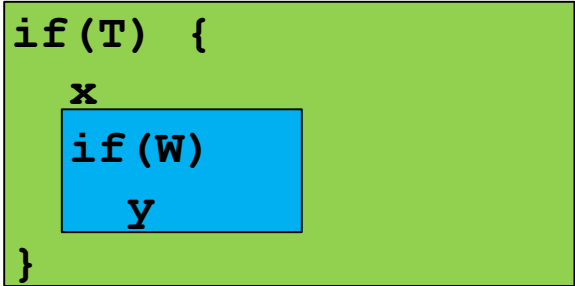
- Assume Feature Model (FM) is available
- Infer feature constraints from code and check those against FM using a constraint solver

“Safe composition of product lines”. Thaker *et al.*, GPCE’07



# Example

```
class Notepad {  
    void toolBar() {  
        if(T) {  
            x  
            if(W)  
                y  
        }  
    }  
  
    ...  
  
    void test() {  
        toolBar();  
    }  
}
```



**FOF:** Member --> Feature Expression

Consider uninterpreted function FOF as the mapping from members to features

# Example

```
class Notepad {  
    void toolBar() {  
        if(T) {  
            x  
            if(W)  
                y  
        }  
    }  
  
    ...  
  
    void test() {  
        toolBar();  
    }  
}
```

Feature constraints extracted from code:

$$T \Rightarrow \text{FOF}(x)$$
$$(T \text{ AND } W) \Rightarrow \text{FOF}(y)$$

Use a constraint solver to find contradictions between these constraints and those expressed in the FM.

# Design & Implementation (Safe) Decomposition

# Problem

- How to decompose features into modules?

alternatively,

- What is the binding of features to members?
  - Existing solutions are imprecise
    - E.g., information retrieval

# Example

- What are the possible valuations for...
  - FOF(x), FOF(y), and FOF(toolBar)?

```
class Notepad {  
  void toolBar() {  
    if(T) {  
      x  
      if(W)  
        y  
    }  
  }  
}
```

The diagram illustrates the scope of variables in the provided code. A green rectangle highlights the scope of the `toolBar()` method, which includes the `if(T)` block. Within this green rectangle, a blue rectangle highlights the scope of the `if(W)` block, which includes the variable `y`. The variable `x` is located within the green rectangle but outside the blue rectangle, indicating its scope is the `toolBar()` method. The variable `y` is located within the blue rectangle, indicating its scope is the `if(W)` block. The variable `toolBar` is the name of the method, and its scope is the entire class `Notepad`.

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