



### **Yu Pei**, Yi Wei, Carlo A. Furia, Martin Nordio, Bertrand Meyer





### **Overview**





# **Model-based Fault Localization**

- Dynamic analysis
  - Difference between *state invariants* from passing and failing runs as the fault profile
  - State invariants in argument-less boolean queries



# **Code-based Fault Localization**

- Dynamic + Static Analysis
  - State components as candidate fault causes: <exp, loc, val>
  - Suspiciousness scores computed from
    - frequency of appearance in passing/failing runs
    - control dependence on the violation position
    - syntactical similarity with the failing assertion

```
0
                                                  1
                                                         count-1 count count+1
1: move_item (v: G)
        -- Move `v' to the left of cursor
2:
     require v /= Void ; has (v)
3:
     local idx: INTEGER ; found: BOOLEAN
4:
     do
5:
        idx := index
6:
        from start until found or after loop
7:
                                                     <index < idx, L-12, True>
          found := (v = item)
8:
          if not found then forth end
                                                     identified as a highly
9:
        end
10:
                                                     likely cause for fault.
11:
        remove
        go i th (idx) -- <valid index(idx), L-12, False>
12:
        put_left(v)
13:
     end
14:
                                                                           4
```

## **Fixing Actions**

- Results of fault localization
  - Model-based: a list of <loc, inv>
  - Code-based: an ordered list of <exp, loc, val>
    - Order defined by the suspiciousness scores
- Fixing actions: code necessary for correcting the faulty state
  - Object behavioral model
  - Enumeration



5

# Fixing Using Object Behavioral Model (OBM)

- Object behavioral model
  - Suggests how routines change object states
  - Contains a set of possible transitions
  - Can be learned from passing test executions

```
move item (v: G)
                                                              Fault profile: before
     -- from TWO WAY SORTED SET.
     -- Move `v' to the left of cursor.
                                                                           not is empty
  require v /= Void ; has (v)
                                                                             before
  local idx: INTEGER ; found: BOOLEAN
                                                                             not after
  do
                                                                         forth
     idx := index
     from start until found or after loop
                                                                           not is empty
       found := (v = item)
                                                                            not before
                                                                             not after
       if not found then forth end
     end
     remove
                                                               Fixing action: forth
     go_i_th (idx)
     put_left(v)
  end
```

(•)

# **Fixing by Enumeration**

- Identify values that could be modified to affect the state
- Enumerate all applicable operations on the values
  - Fixing with state modification



### **Fix Synthesis**

• Fix schemas capture common fixing styles.





## Validation and Ranking

- Validation
  - Run the patched program against all passing and failing tests, requiring
    - Passing tests still pass
    - Failing tests now pass
- Ranking
  - Static metrics favors
    - simple textual changes
    - changes close to the failing location
    - changes involving less original statements
  - Dynamic metric favors
    - behavioral preservation, i.e. passing tests should terminate in similar resulting states



## **Experimental Results**

- Model-based fault localization + fixing actions from OBM
  - 42 faults from EiffelBase & Gobo: fixed 16 (38%)
  - In a small user study, 4 out of 6 of the selected fixes are the same as those from programmers
- Code-based fault localization + fixing actions by enumeration
  - 64 faults from EiffelBase & Gobo: fixed 14 (22%)
  - 9 faults from a student project: fixed 5 (55%)
  - Results considering only proper fixes.
    Average fixing time is a few minutes per fault



### **Summary**

- A fully automated approach to program fixing, which
  - works with program with contracts,
  - takes (passing and failing) test cases as inputs,
  - exploits dynamic and static analysis techniques,
  - validates candidate fixes through regression, and
  - succeeds in proposing proper fixes to real program faults.
- AutoFix

### http://se.inf.ethz.ch/research/autofix/



11





