

# The Blame Game for Property-based Testing: work-in-progress

Alberto Momigliano,  
joint work with Mario Ornaghi

DI, University of Milan

CILC 2019, Trieste

# Property-based Testing

- ▶ A light-weight validation approach merging two well known ideas:
  1. automatic generation of test data, against
  2. executable program specifications.
- ▶ Brought together in *QuickCheck* (Claessen & Hughes ICFP 00) for Haskell
- ▶ The programmer specifies properties that functions should satisfy **inside** in a very simple DSL, akin to Horn logic
- ▶ QuickCheck aims to falsify those properties by trying a large number of **randomly** generated cases.

- ▶ Our recently (re)released tool:  
<https://github.com/aprolog-lang>
- ▶ On top of  $\alpha$ Prolog, a simple extension of Prolog with **nominal** abstract syntax.
- ▶ Use nominal Horn formulas to write specs and checks.
- ▶ Equality coincides with  $\equiv_{\alpha}$ ,  $\#$  means “not free in”,  $\langle x \rangle M$  is  $M$  with  $x$  bound,  $\forall$  is the *fresh* Pitts-Gabbay quantifier.
- ▶  $\alpha$ Check searches **exhaustively** for counterexamples, using iterative deepening.
- ▶ Our intended domain: the meta-theory of programming languages artifacts: from static analyzers to interpreters, compilers, parsers, pretty-printers, down to run-time systems. . .

- ▶ This grammar characterizes all the strings with the same number of  $a$ 's and  $b$ 's:

$S ::= \cdot \mid bA \mid aB$

$A ::= aS \mid bAA$

$B ::= bS \mid aBB$

- ▶ We encode it in  $\alpha$ Prolog, inserting two quite obvious bugs, but be charitable and think of a much larger grammar:
  - ▶ viz., the grammar of *Ocaml<sub>light</sub>* consists of 251 productions

$ss([]).$

$ss([b|W]) :- ss(W).$

$ss([a|W]) :- bb(W).$

$bb([b|W]) :- ss(W).$

$bb([a|VW]) :- append(V,W,VW), bb(V), bb(W).$

$aa([a|W]) :- ss(W).$

(an ice cream to the first who finds both bugs in the next 30 secs)

- ▶ We use  $\alpha$ Check to debug it, splitting the characterization of the grammar into soundness and completeness:

```
#check "sound" 10: ss(W), count(a,W,N1), count(b,W,N2)
                    => N1 = N2.
```

```
#check "compl" 10: count(a,W,N), count(b,W,N) => ss(W).
```

- ▶ The tool dutifully reports (at least) two counterexamples:

Checking for counterexamples to

sound:  $N1 = z$ ,  $N2 = s(z)$ ,  $W = [b]$

compl:  $N = s(s(z))$ ,  $W = [b,b,a,a]$

- ▶ Where is the bug? Which clause(s) shall we **blame**? Can we help the user localize the slice of program involved?

- ▶ Where do bugs come from? That's a huge problem.

- ▶ Where do bugs come from? That's a huge problem.
- ▶ Did anybody say *declarative debugging*?

- ▶ Where do bugs come from? That's a huge problem.
- ▶ Did anybody say *declarative debugging*? Let's do something less heavy handed.

- ▶ Where do bugs come from? That's a huge problem.
- ▶ Did anybody say *declarative debugging*? Let's do something less heavy handed.
- ▶ We do not claim to have a general approach:
  - ▶ First, we're addressing the sub-domain of *mechanized meta-theory model-checking*, where fully declarative PL models are tested against theorems these systems should obey
  - ▶ Second, we just want to give *some* practical help to the poor user debugging a model w/o exploiting her as an oracle.

- ▶ The `#check` pragma corresponds to specs of the form that we try and refute  $\forall \vec{X}. G \supset A$
- ▶ Take completeness of the above grammar:  
 $\exists W. \text{count}(a, W, N), \text{count}(b, W, N), \text{not}(\text{ss}(W)).$   
A *counterexample* is a grounding substitution  $\theta$  that  $\theta(G)$  is derivable, but  $\theta(A)$  is not
- ▶ For the above to unexpectedly succeed, two (possibly overlapping) things may go wrong:
  - MA:  $\theta(A)$  fails, whereas it belongs to the intended interpretation of its definition (*missing answer*);
  - WA: a bug in  $\theta(G)$  creates some erroneous bindings that make the conclusion fail (*wrong answer*).

- ▶ Our “old-school” idea consists in coupling:
  1. *abduction* to try and diagnose *MA*'s with
  2. *proof verbalization*: presenting at various levels of abstraction *proof-trees* for *WA*'s to explain where the bug occurred.
- ▶ Differently from declarative debugging, we ask the user only to state who she **trusts**:
  - ▶ built-in, certainly; libraries, most likely;
  - ▶ predicates that have sustained enough testing;
- ▶ and which are the **abductable** predicates:
  - ▶ some heuristics based on the dependency graph should help.

# Proof verbalization

- ▶ Back to the *soundness* check: we trust unification and the auxiliary count predicate ...

```
ss(W), count(a,W,N1), count(b,W,N2) => N1 = N2.  
sound: N1 = z, N2 = s(z), W = [b]
```

- ▶ ... hence it must be a case of **WA**, starring `ss([b])`.  
Verbalizing the proof tree yields:

```
ss([b]) for rule s2, since:  
  ss([]) for fact s1.
```

- ▶ This points to rule `s2`

```
ss([b|W]) :- ss(W). % BUG  
ss([b|W]) :- aa(W). % OK
```

- ▶ Clearly, proof trees tend to be longer than that and we *distill* them to hide information, up to showing only the skeleton of the proof (the clauses used).

# Abduction

- ▶ Once we fix the previous bug, the second still looms:  
`count(a,W,N), count(b,W,N) => ss(W).`  
`compl: N = s(s(z)), W = [b,b,a,a]`
- ▶ It's a **MA**: putting all the grammar in the abducibles, we have:  
`ss([b,b,a,a])` for rule `s2`, since:  
`aa([b,a,a])` for assumed.
- ▶ We realize that there is **no** clause head `aa([b|VW])` in the program, matching the failed leaf: we have forgot the clause:  
`aa([b|VW]) :- append(V,W,VW), aa(V),aa(W).`

# Abduction

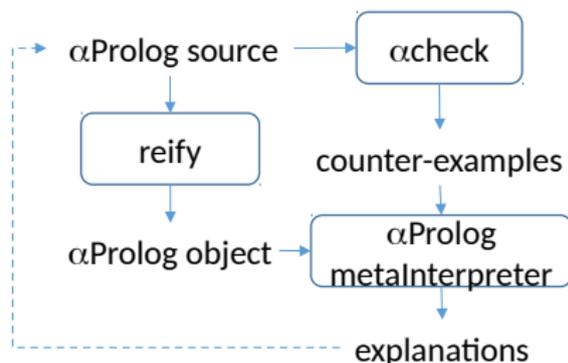
- ▶ Once we fix the previous bug, the second still looms:  
`count(a,W,N), count(b,W,N) => ss(W).`  
`compl: N = s(s(z)), W = [b,b,a,a]`
- ▶ It's a **MA**: putting all the grammar in the abducibles, we have:  
`ss([b,b,a,a])` for rule `s2`, since:  
`aa([b,a,a])` for assumed.
- ▶ We realize that there is **no** clause head `aa([b|VW])` in the program, matching the failed leaf: we have forgot the clause:  
`aa([b|VW]) :- append(V,W,VW), aa(V),aa(W).`
- ▶ I told you the bugs were silly, didn't I?
- ▶ That's why we implemented a tool for **mutation** testing: plenty of unbiased faulty programs to explain away!

# Mutation testing

- ▶ Change a source program in a localized way by introducing a single (syntactic) *fault* — have a “mutant”, hopefully not semantically equivalent.
- ▶ “Kill it” with your testing suite means finding the fault.
- ▶ A killed mutant is a good candidate for blame assignment: it contains reasonable bugs not planted by ourselves.
- ▶ We have written a **mutator** for  $\alpha$ Prolog by randomly applying **type-preserving** mutation operators
- ▶ and checking with  $\alpha$ Check (up to a bound of course) that the mutant is not equivalent to its ancestor;
- ▶ if so, we pass it to the blame tool for explanation.

# Architecture of the tool

- ▶ The back-end consists of an  $\alpha$ Prolog meta-interpreter working on a reified version of the sources of an  $\alpha$ Prolog program
- ▶ The front-end is written in Prolog and is responsible for everything else:
  - ▶ The reification process and syncing the latter with the sources
  - ▶ Calling  $\alpha$ Check, feeding the meta-interpreter with the necessary info and doing the verbalization



# Conclusions

- ▶ We are close to release a tool for explanations of bugs reported by  $\alpha$ Check for **full**  $\alpha$ Prolog— whose features we have not used in this talk.
- ▶ While our approach of abduction + explanations is simple-minded it tries to find a sweet spot in helping understanding bugs in PL models w/o going full steam into declarative debugging
- ▶ Experience (e.g., significant case studies) will tell if we succeeded
- ▶ The mutator is of independent interest for evaluating the effectiveness of the various strategies of  $\alpha$ Check in finding bugs in  $\alpha$ Prolog specifications.

Thanks!