



Industrial experience with a verification-aware programming language

K. Rustan M. Leino (he/him)

Sr Principal Applied Scientist
Amazon Web Services

My talk

Reflect on

Lessons learned from working with engineers to verify software
How this experience has influenced the language and its tooling

Automated Reasoning at AWS

Use of sound logical tools and techniques to prove properties of software

To have lasting impact,
the tools must be applied with every code check-in

To scale,
the tools must be used by people outside the
Automated Reasoning Group

Dafny

Verification-aware programming language

Java-like language

Designed to support formal verification

Coming up on 16 years

Open source



Dafny for every engineer

Is a programming language

Specifications are part of the language

Not a bolt-on to non-verification language

Targets programmers

Not type-theorists or logicians

Uses curly braces

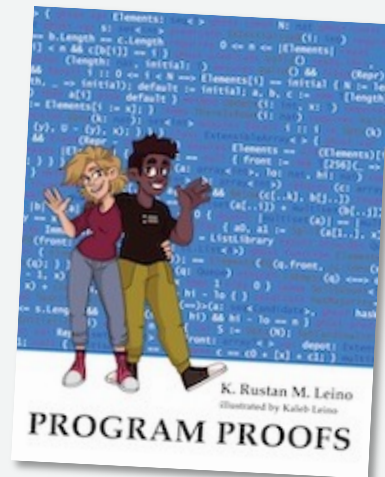
Used in teaching for 15+ years

New book: *Program Proofs* (MIT Press)

Auto-active verification (interactive + automated)

Centers on programs

Proofs are part of the program text



Demo

FindLast

Public uses of Dafny at AWS

AWS Encryption SDK

AWS Database Encryption SDK

Cedar authorization policy engine

Dafny leverage points

Write verified code

Write and verify once, compile to many

Abstract modeling



Dafny design: program expressions, specification expressions

They are the same

Same syntax

Same semantics

```
method FindLast<X>(arr: array<X>, x: X) returns (result: int)
  requires exists i :: 0 <= i < arr.Length && arr[i] == x
```

```
var b := exists i :: 0 <= i < arr.Length && arr[i] == x;
```

Demo...

Dafny design: program expressions, specification expressions

They are the same

- Same syntax

- Same semantics

Not all expressions are evaluated at run time

- Ghost declarations

- Specifications are always checked statically

```
var d := x + y + 1;  
ghost var g := d + x;
```

```
ghost function IsBalanced(t: Tree): bool
```

Dafny design: expressions vs statements

Expressions

- deterministic
- do not modify the program state
- terminate

Statements

- can be nondeterministic
- can modify the state
- can be specified to allow non-termination

Functions

- body is expression
- behave like in mathematics

Methods

- body is statement list

```
function Increase(x: nat): nat {  
  var d := x + x;  
  d + 1  
}
```

```
method Increase(x: nat) returns (r: nat) {  
  var d := x + x;  
  return d + 1;  
}
```

Dafny design: importance that keywords convey right meaning

Example: Want statement that is
checked at run time (like `assume E;` in some languages)
assumed by verifier to hold (like `assume E;`)

`expect E;`

Keywords for Compiled vs. Ghost

	Compiled	Ghost
Variable	<code>var</code>	
Function	<code>function</code>	
Method	<code>method</code>	

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Function	<code>function</code>	<code>ghost function</code>
Method	<code>method</code>	<code>ghost method</code> <code>lemma</code>

Keywords for Compiled vs. Ghost

	Compiled	Ghost
Variable	var	ghost var
Function	function method function	function ghost function
Method	method	lemma

Developer expectations: Dafny ecosystem

Language

Compiler(s)

Verifier

Documentation, training

IDEs

Standard library

Build system

Testing tools

Foreign function interface

Linters

Verification debugger

...

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Influence from customers

Unicode support

Handling failures

- Failure-compatible types

Change of definite-assignment rules

- stricter than required by sound verification

- expected by programmers, and catches common errors

Simplify for customers: loop alternatives

Demo...

Simplify for customers: Auto-accumulator tail recursion

```
function Filter<T>(s: seq<T>, p: T -> bool): seq<T> {  
  if s == [] then  
    []  
  else if p(s[0]) then  
    [s[0]] + Filter(s[1..], p)  
  else  
    Filter(s[1..], p)  
}
```

Experience: Specifications

The process of writing specifications uncovers design bugs

Writing specifications is hard

Better specifications are usually more abstract

Demo

SplitString

Foreign-function interface (extern code)

Writing specifications for extern code is even harder

“Verification finds all bugs” can be misunderstood

Foreign-function interface: difficulty

```
method {:extern} Concat<X>(a: array<X>,
                             b: array<X>,
                             limit: int) returns (r: array<X>)
ensures r[..] == (a[..] + b[..])[..Max(0, Min(|a| + |b|, limit))]
ensures fresh(r)
```

But perhaps the extern method
 expects `limit` to be non-negative
 returns `a` or `b` if the other is empty
 returns `null` in some cases

Foreign-function interface: difficulty



```
method {:extern "Logger.Append"} LogEvent(s: string)  
  ensures log.data == old(log.data) + [s]
```



```
method {:extern "Logger.Append"} LogEvent(s: string)  
  modifies log  
  ensures log.data == old(log.data) + [s]
```

Foreign-function interface: difficulty



```
function {:extern "System.DateTime.Now"} GetTime(): Time
```



```
method {:extern "System.DateTime.Now"} GetTime() returns (t: Time)
```

Foreign-function interface (extern code)

How to avoid errors in extern specifications?

- auditor tool
- `expect` statements
- run-time specification checking
- “bland externs”

Proofs

For programmers

Demo

Wildcard matching: declarative vs operational

Automation

Early days of Dafny:
Automation always

Then:
Added repertoire of proof-authoring constructs

Now:
Favor stability over automation

Still need:
Helpful tools for proof construction
Helpful tools for verification debugging
Educate more

Conclusions

Programming with specifications and proofs, in practice

Listen to customer complaints

Don't be too defensive

Innovate on behalf of customers

Need more automated-reasoning savvy users

Teach!

dafny.org

program-proofs.com

