

The Dafny Programming Language and Static Verifier

Stefan Zetzsche

Amazon Web Services

October 4, 2023

1 Introduction

What is Dafny?

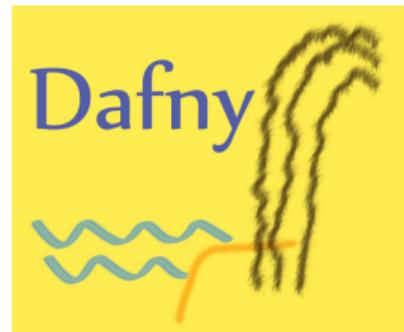
Live Demo

What is Dafny?

```
function Fib(n: nat): nat {
    if n <= 1 then n else Fib(n - 1) + Fib(n - 2)
}

method ComputeFib(n: nat) returns (b: nat)
    ensures b == Fib(n)
{
    var c := 1;
    b := 0;
    for i := 0 to n
        invariant b == Fib(i) && c == Fib(i + 1)
    {
        b, c := c, b + c;
    }
}
```

Dafny and Rustan Leino



Dafny at Amazon: Authorization



```
permit(principal, action, resource)
when {
    resource has owner && resource.owner == principal
};
```

<https://github.com/cedar-policy>

<https://www.amazon.science/blog/how-we-built-cedar-with-automated-reasoning-and-differential-testing>

Dafny at Amazon: Crypto Tools

Cryptography is hard to do safely and correctly.

<https://docs.aws.amazon.com/aws-crypto-tools/index.html>

<https://github.com/aws/aws-encryption-sdk-dafny>

[https://aws.amazon.com/blogs/security/
aws-security-profile-cryptography-edition-valerie-lambert-senior-software-development-engineer/](https://aws.amazon.com/blogs/security/aws-security-profile-cryptography-edition-valerie-lambert-senior-software-development-engineer/)

Table of Contents

Introduction

Dafny as a Programming Language

Dafny as a Proof Assistant

Dafny for the Verification of Programs

Dafny at ILLC

2 Dafny as a Programming Language

Dafny as a Programming Language

Dafny is a mature language that allows you to:

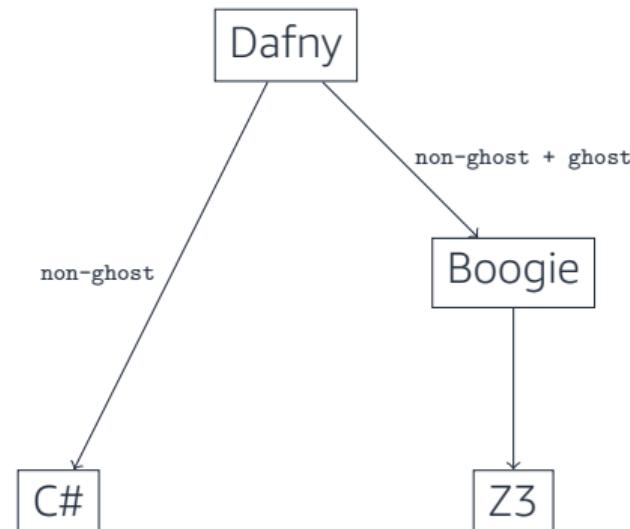
- write functional/imperative/OO programs
- compile programs
- execute programs
- interoperate with other languages

Multi-Paradigms

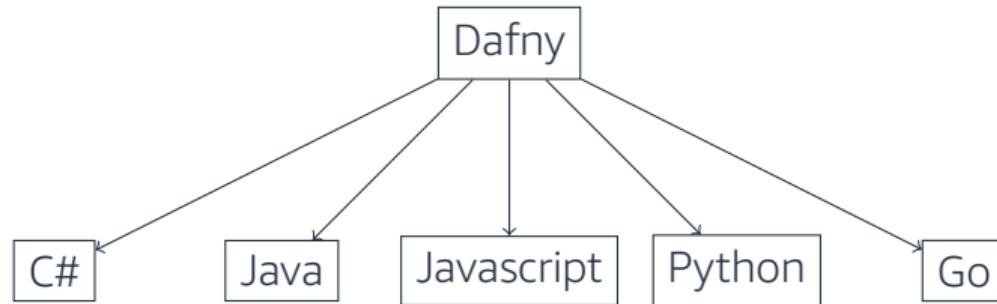
Dafny supports multi-paradigm concepts:

- inductive datatypes
- while-loops
- lambda expressions
- higher-order functions
- classes with mutable state
- polymorphism

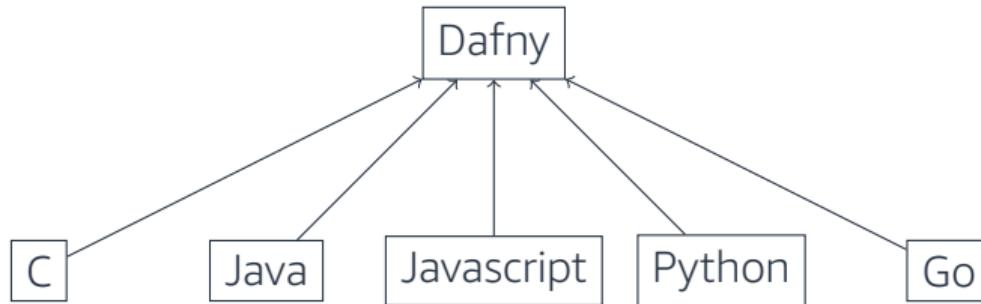
Pipeline



Compilation



Interoperate with {:extern}



2.1 Functional Programming

Functions, Constants, Predicates

```
function FunctionName(param1: Type1, param2: Type2): Type3 {  
    expression  
}  
  
const constantName: Type := expression;  
  
predicate predicateName(param1: Type1, param2: Type2) {  
    booleanExpression  
}
```

Functions as In/Out Parameters

```
function Apply(f: int -> int, n: int): int {  
    f(n)  
}  
  
function ApplyPartial(f: int -> int -> int, n: int): int -> int {  
    f(n)  
}
```

Recursive Functions

```
function Factorial(n: nat): nat {  
    if n == 0 then 1 else n * Factorial(n-1)  
}
```

Inductive Datatypes

```
datatype list = Nil | Cons(head: bool, tail: list)

function Conjunction(xs: list): bool {
  match xs
    case Nil => true
    case Cons(head, tail) => head && Conjunction(tail)
}
```

Polymorphism

```
datatype list<T> = Nil | Cons(head: T, tail: list)

function Length<T>(xs: list<T>): nat {
  match xs
    case Nil => 0
    case Cons(_, tail) => 1 + Length(tail)
}
```

Immutable Collection Types

- Sequences

`seq(length, i => f(i))`

- Sets

`set x: T | p(x) :: f(x)`

- Maps

`map x: T | p(x) :: f(x)`

- Multisets

2.2 Imperative Programming

Methods

```
method MethodName<T>(arg1: T, arg2: string) {  
    print(arg1);  
    print(arg2);  
}
```

Methods

```
method Call() returns (o: int) {  
    MethodName("Hello,", "World\n");  
    o := FunctionName(42);  
}
```

Conditional

```
method IfElse() {  
    if booleanExpression {  
        // ...  
    } else {  
        // ...  
    }  
}
```

While Loop

```
method WhileLoop() {  
    while booleanExpression {  
        // ...  
    }  
}
```

For Loop

```
method ForLoop() {  
    for variable := startExpression to stopExpression {  
        // ...  
    }  
}
```

Arrays

```
method Aliasing() {  
    var A := new int[100];  
    var B := A;  
}
```

Reading Arrays

```
function Read(A: array<bool>): bool
    reads A
{
    if A.Length == 0 then
        false
    else
        A[0]
}
```

Modifying Arrays

```
method Modify(A: array<bool>, b: bool)
    modifies A
{
    if A.Length == 0 {
    } else {
        A[0] := b;
    }
}
```

2.3 Object-Oriented Programming

Classes

```
class C {  
    var mutableField: int  
    const immutableField: int  
  
    constructor(i: int, j: int) {  
        immutableField := i;  
        mutableField := j;  
    }  
}  
  
method M() {  
    var o := new C(0, 1);  
}
```

Functions and Methods

```
class C {  
    var mutableField: int  
  
    function Get(): int  
        reads this  
    {  
        mutableField  
    }  
  
    method Set(i: int)  
        modifies this  
    {  
        mutableField := i;  
    }  
}
```

Inheritance

```
trait T {  
    method Print()  
}  
  
class C extends T {  
    method Print() {  
        print("Stefan");  
    }  
}  
  
class D extends T {  
    method Print() {  
        print("Zetzsche");  
    }  
}
```

3 Dafny as a Proof Assistant

3.1 Formal Mathematics

Type Symbols

```
type NaturalNumber
```

Constant Symbols

```
ghost const Zero: NaturalNumber
```

Function Symbols

```
ghost function Successor(n: NaturalNumber): NaturalNumber
```

Predicate Symbols

```
ghost predicate Equal(m: NaturalNumber, n: NaturalNumber)
```

Axioms

```
lemma {:axiom} Reflexive()
  ensures forall n: NaturalNumber :: Equal(n, n)
```

Axioms and Quantification

```
lemma {:axiom} Reflexive(n: NaturalNumber)
  ensures Equal(n, n)
```

Lemma

```
lemma {:axiom} Reflexive(n: NaturalNumber)
  ensures Equal(n, n)

lemma AboutZero()
  ensures exists n: NaturalNumber :: Equal(n, Zero)
{
  // ...
}
```

Lemma

```
lemma {:axiom} Reflexive(n: NaturalNumber)
  ensures Equal(n, n)

lemma AboutZero()
  ensures exists n: NaturalNumber :: Equal(n, Zero)
{
  Reflexive(Zero);
}
```

Second Order and Excluded Middle

```
lemma SecondOrder()
  ensures forall p: int -> bool :: forall x: int :: p(x) || !p(x)
{}
```

Higher Order

```
lemma ThirdOrder()
  ensures forall P: (int -> bool) -> bool,  p: int -> bool :: P(p) || !P(p)
{}
```

3.2 Structured Proofs

Proof Structure

```
lemma ProofStructure()
  requires Assumptions
  ensures Goal
{
  assert Goal by {
    Assumptions
  }
}
```

Conjunction

```
lemma ProofOfConjunction() {
    assert A && B by {
        assert A by {
            // Proof of A
        }
        assert B by {
            // Proof of B
        }
    }
}
```

Disjunction

```
lemma ProofOfDisjunction1() {  
    assert A || B by {  
        assert A by {  
            // Proof of A  
        }  
    }  
}  
  
lemma ProofOfDisjunction2() {  
    assert A || B by {  
        assert B by {  
            // Proof of B  
        }  
    }  
}
```

Implication

```
lemma ProofOfImplication() {  
    assert A ==> B by {  
        if A {  
            assert B by {  
                // Proof of B  
            }  
        }  
    }  
}
```

Equivalence

```
lemma ProofOfEquivalence() {  
    assert A <==> B by {  
        assert A ==> B by {  
            // Proof of A ==> B;  
        }  
        assert B ==> A by {  
            // Proof of B ==> A;  
        }  
    }  
}
```

Contradiction

```
lemma ProofByContradiction() {  
    assert B by {  
        if !B {  
            assert false by {  
                // Proof of false;  
            }  
        }  
    }  
}
```

Product

```
lemma ProofOfProduct() {
    assert A ==> (B && C) by {
        assert A ==> B by {
            // Proof of A ==> B;
        }
        assert A ==> C by {
            // Proof of A ==> C;
        }
    }
}
```

Coproduct

```
lemma ProofOfCoproduct() {
    assert (A || B) ==> C by {
        assert A ==> C by {
            // Proof of A ==> C;
        }
        assert B ==> C by {
            // Proof of B ==> C;
        }
    }
}
```

Calculations 1

```
lemma UnitIsUnique<T(!new)>(bop: (T, T) -> T, unit1: T, unit2: T)
  requires forall x :: bop(x, unit2) == x
  requires forall x :: bop(unit1, x) == x
  ensures unit1 == unit2
{
  calc {
    unit1;
    ==
    bop(unit1, unit2);
    ==
    unit2;
  }
}
```

Calculations 2

```
lemma UnitIsUnique<T(!new)>(bop: (T, T) -> T, unit1: T, unit2: T)
  requires A1: forall x :: bop(x, unit2) == x
  requires A2: forall x :: bop(unit1, x) == x
  ensures unit1 == unit2
{
  calc {
    unit1;
    == { reveal A1; }
    bop(unit1, unit2);
    == { reveal A2; }
    unit2;
  }
}
```

Calculations 3

```
lemma UnitIsUnique<T(!new)>(bop: (T, T) -> T, unit1: T, unit2: T)
  requires A1: forall x :: bop(x, unit2) == x
  requires A2: forall x :: bop(unit1, x) == x
  ensures unit1 == unit2
{
  assert unit1 == bop(unit1, unit2) by {
    reveal A1;
  }
  assert bop(unit1, unit2) == unit2 by {
    reveal A2;
  }
}
```

Non-Deterministic Choice

```
lemma ProofUsingExistential<T>(p: T -> bool, q: T -> bool)
  requires A1: exists x :: p(x)
  requires A2: forall x :: p(x) ==> q(x)
  ensures exists x :: q(x)
{
  reveal A1;
  var c :| p(c);
  assert q(c) by {
    reveal A2;
  }
}
```

4 Dafny for the Verification of Programs

4.1 Independent Verification of Functional Programs

Conditional

```
function Abs(x: int): int {  
    if x < 0 then  
        -x  
    else  
        x  
}
```

```
lemma AbsPositive(x: int)  
    ensures Abs(x) >= 0  
{  
    if x < 0 {  
        assert -x > 0;  
    } else {  
        assert x >= 0;  
    }  
}
```

Recursion and Induction

```
function Length<T>(xs: list): nat {
    match xs
    case Nil => 0
    case Cons(head, tail) => 1 + Length(tail)
}

function Append<T>(xs: list, ys: list): list {
    match xs
    case Nil => ys
    case Cons(head, tail) => Cons(head, Append(tail, ys))
}

lemma AppendLength<T>(xs: list, ys: list)
    ensures Length(Append(xs, ys)) == Length(xs) + Length(ys)
{
    match xs
    case Nil =>
    case Cons(head, tail) => AppendLength(tail, ys);
}
```

4.2 Dependent Verification of Functional Programs

Pre- and Postconditions 1

```
lemma AppendLength<T>(xs: list, ys: list)
  ensures Length(Append(xs, ys)) == Length(xs) + Length(ys)
{
  match xs
    case Nil =>
    case Cons(head, tail) => AppendLength(tail, ys);
}
```

Pre- and Postconditions 2

```
function Append<T>(xs: list, ys: list): list
  ensures Length(Append(xs, ys)) == Length(xs) + Length(ys)
{
  match xs
    case Nil => ys
    case Cons(head, tail) => Cons(head, Append(tail, ys))
}
```

Pre- and Postconditions 3

```
function Append<T>(xs: list, ys: list): list
    requires Assumption
    ensures Length(Append(xs, ys)) == Length(xs) + Length(ys)
    ensures Property
{
    assert Property by {
        // Proof of Property via Assumption
    }
    match xs
        case Nil => ys
        case Cons(head, tail) => Cons(head, Append(tail, ys))
    }
}
```

Pre- and Postconditions 4

```
function Append<T>(xs: list, ys: list): list
  ensures Length(Append(xs, ys)) == Length(xs) + Length(ys)
  // && forall zs :: Append(Append(xs, ys), zs) == Append(xs, Append(ys, zs))
{
  match xs
    case Nil => ys
    case Cons(head, tail) => Cons(head, Append(tail, ys))
}
```

Termination 1a

```
function SumFromZeroTo(n: int): int {  
    if n <= 0 then  
        0  
    else  
        n + SumFromZeroTo(n-1)  
}
```

Termination 1b

```
function SumFromZeroTo(n: int): int
    decreases n
{
    if n <= 0 then
        0
    else
        n + SumFromZeroTo(n-1)
}
```

Termination 2a

```
function SumFromTo(m: int, n: int): int {  
    if m >= n then  
        n  
    else  
        m + SumFromTo(m+1, n)  
}
```

Termination 2b

```
function SumFromTo(m: int, n: int): int
  decreases n - m
{
  if m >= n then
    n
  else
    m + SumFromTo(m+1, n)
}
```

4.3 Verification of Imperative Programs

Hoare Logic (Total)

$$[P]S[Q] \quad \text{iff} \quad \text{wp}(S, Q) \Rightarrow P$$

```
method S()
  requires P()
  ensures Q()
```

Skip

$\overline{[P]} \text{ skip } \overline{[P]}$

```
method Skip()
  requires P()
  ensures P()
{}  
}
```

Assignment

$$\overline{[P[E/x]] \ x := E \ [P]}$$

```
method Assignment<T>(x: T) returns (y: T)
  requires P(E(x))
  ensures P(y)
{
  y := E(x);
}
```

Composition

$$\frac{[P]S[Q] \quad , \quad [Q]T[R]}{[P] \ S; T \ [R]}$$

```
method S()
  requires P()
  ensures Q()
```

```
method T()
  requires Q()
  ensures R()
```

```
method Composition()
  requires P()
  ensures R()
{
  S(); T();
}
```

Consequence

$$\frac{P_1 \rightarrow P_2 \quad , \quad [P_2] S [Q_2] \quad , \quad Q_2 \rightarrow Q_1}{[P_1] S [Q_1]}$$

```
lemma Implications()
  ensures P1() ==> P2()
  ensures Q2() ==> Q1()
```

```
method S()
  requires P2()
  ensures Q2()
```

```
method Consequence()
  requires P1()
  ensures Q1()
{
  Implications();
  S();
}
```

Loops (Partial)

$$\frac{\{P \wedge B\} \; S \; \{P\}}{\{P\} \text{ while } B \text{ do } S \; \{\neg B \wedge P\}}$$

```
method S()
  requires P() && B()
  ensures P()
```

```
method WhileLoop()
  requires P()
  ensures !B() && P()
{
  while B()
    invariant P()
  {
    S();
  }
}
```

Loops (Partial)

$$\frac{\{P \wedge B\} \vdash S \{P\}}{\{P\} \text{ while } B \text{ do } S \{\neg B \wedge P\}}$$

```
method Times(n: nat, a: nat) returns (b: nat)
  ensures b == n * a
{
  b := 0;
  var i := 0;
  while i < n
    invariant b == i * a && i <= n
  {
    b := b + a;
    i := i + 1;
  }
}
```

5 Dafny at ILLC

5.1 Use Case Example

Big Step Semantics

Syntax

$$c \in \text{cmd} ::= \text{Inc} \mid c_0; c_1 \mid c^*$$

Semantics

$$\frac{t = s + 1}{s \xrightarrow{\text{Inc}} t} \quad \frac{s \xrightarrow{c_0} s' \quad , \quad s' \xrightarrow{c_1} t}{s \xrightarrow{c_0; c_1} t} \quad \frac{t = s}{s \xrightarrow{c^*} t} \quad \frac{s \xrightarrow{c} s' \quad , \quad s' \xrightarrow{c^*} t}{s \xrightarrow{c^*} t}$$

$\rightarrow \subseteq \text{state} \times \text{cmd} \times \text{state}$, $\text{state} = \text{int}$

Big Step Semantics in Dafny

Live Demo

Big Step Semantics in Dafny

```
datatype cmd = Inc | Seq(cmd, cmd) | Repeat(cmd)

type state = int

least predicate BigStep(s: state, c: cmd, t: state) {
    match c
    case Inc =>
        t == s + 1
    case Seq(c0, c1) =>
        exists s' :: BigStep(s, c0, s') && BigStep(s', c1, t)
    case Repeat(c0) =>
        (t == s) || (exists s' :: BigStep(s, c0, s') && BigStep(s', Repeat(c0), t))
}

least lemma Increasing(s: state, c: cmd, t: state)
    requires BigStep(s, c, t)
    ensures s <= t
{}
```

5.2 Opportunities

Open Source

The screenshot shows the GitHub organization page for 'dafny-lang'. At the top, there's a navigation bar with links for Product, Solutions, Open Source, Pricing, Search, Sign in, and Sign up. Below the navigation is the organization's logo, which is a yellow icon of a tree or plant, followed by the name 'Dafny' and a subtitle 'Dafny is a verification-aware programming language'. A pinned repository card for 'dafny' (Public) is displayed, showing its description, stars (2.3k), forks (219), and last update (1 hour ago). To the right of the pinned card is a 'People' section showing profile icons for several team members. Below the pinned card is a search bar and a list of repositories: 'dafny' (Public), 'blog' (Public), 'ide-vscode' (Public), and 'libraries' (Public). Each repository card includes its name, type, description, statistics (stars, forks, issues, pull requests, and last update), and a green waveform icon.

<https://github.com/dafny-lang/dafny>

Workshop

The screenshot shows the POPL 2024 conference website. At the top, it says "POPL 2024" and "Wed 17 - Fri 19 January 2024 London, United Kingdom". Below that is a navigation bar with links for "Attending", "Tracks", "Organization", "Search", and "Series".

[POPL 2024 \(series\)](#) / [Dafny 2024 \(series\)](#) /

Dafny 2024

[About](#) [Call for Papers](#)

Call for Papers

We don't intend to publish the workshop's submissions. However, presentations may be recorded and the videos may be made publicly available.

Important Dates

- Submission: Wednesday, October 11, 2023 (AoE)
- Notification: Wednesday, November 15, 2023
- Workshop: Sunday, January 14, 2024

Submission Guidelines

To give a presentation at the workshop, please submit an anonymous extended abstract (2-6 pages, excluding references) via hotcrp:

<https://dafny24.hotcrp.com>

Please use the acmart two-column sigplan sub-format LaTeX style to prepare your submission:

<https://www.sigplan.org/Resources/Author/>

Contact

All questions about submission should be emailed to the program chairs Stefan Zetsche (stefanze@amazon.com) and Joseph Tassarotti (jt4767@nyu.edu).

Formal Reasoning at AWS



Formal Reasoning About the Security of Amazon Web Services

Byron Cook^{1,2,✉}

¹ Amazon Web Services, Seattle, USA

byron@amazon.com

² University College London, London, UK

Abstract. We report on the development and use of formal verification tools within Amazon Web Services (AWS) to increase the security assurance of its cloud infrastructure and to help customers secure themselves. We also discuss some remaining challenges that could inspire future research in the community.

1 Introduction

Amazon Web Services (AWS) is a provider of cloud services, meaning on-demand access to IT resources via the Internet. AWS adoption is widespread, with over a million active customers in 190 countries, and \$5.1 billion in revenue during the last quarter of 2017. Adoption is also rapidly growing, with revenue regularly increasing between 40–45% year-over-year.

The challenge for AWS in the coming years will be to accelerate the development of its functionality while simultaneously increasing the level of security offered to customers. In 2011, AWS released over 80 significant services and features. In 2012, the number was nearly 160; in 2013, 280; in 2014, 516; in 2015, 722; in 2016, 1,017. Last year the number was 1,430. At the same time, AWS is increasingly being used for a broad range of security-critical computational workloads.

Formal automated reasoning is one of the investments that AWS is making in order to facilitate continued simultaneous growth in both functionality and security. The goal of this paper is to convey information to the formal verification research community about this industrial application of the community's results. Toward that goal we describe work within AWS that uses formal verification to raise the level of security assurance of its products. We also discuss the use of formal reasoning tools by externally-facing products that help customers secure themselves. We close with a discussion about areas where we see that future research could contribute further impact.

Related Work. In this work we discuss efforts to make formal verification applicable to use-cases related to cloud security at AWS. For information on previous work within AWS to show functional correctness of some key distributed algorithms, see [43]. Other providers of cloud services also use formal verification to establish security properties, e.g. [23,34].

© The Author(s) 2018

H. Chaudhuri and G. Weissenbacher (Eds.): CAV 2018, LNCS 10881, pp. 38–47, 2018.
https://doi.org/10.1007/978-3-319-96145-1_3

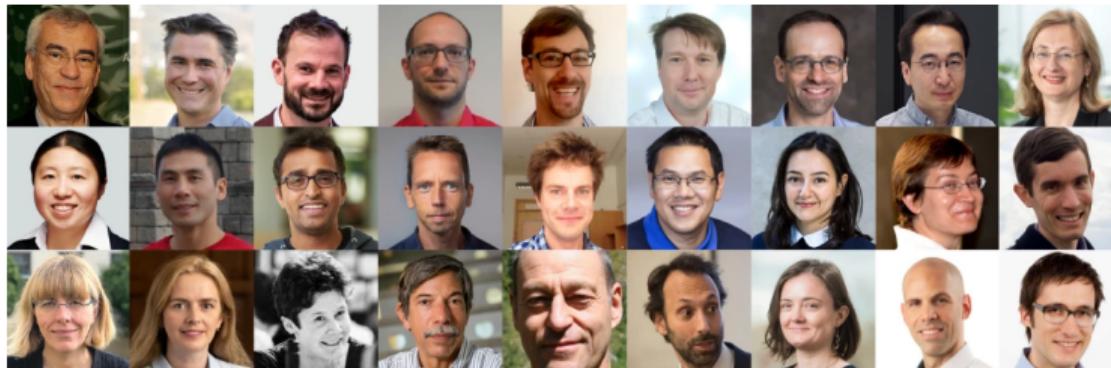


Amazon researchers and engineers gathered for the annual Amazon Formal Reasoning Enthusiasts (FReE) workshop to discuss formal methods tools that improve quality of Amazon software and customer experience. 🎉



10:23 pm · 20 Oct 2022

Amazon Research Awards



<https://www.amazon.science/research-awards/program-updates/79-amazon-research-awards-recipients-announced>

<https://www.amazon.science/research-awards/call-for-proposals/automated-reasoning-call-for-proposals-fall-2023>

The End

<https://dafny.org/>