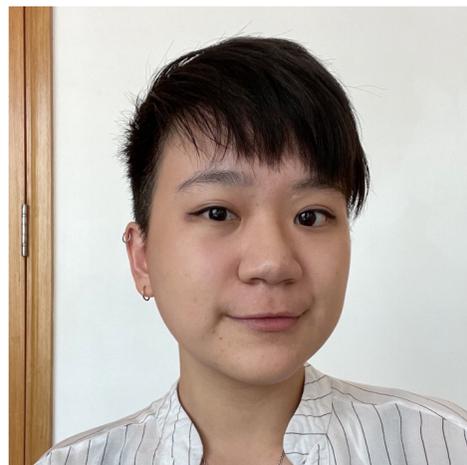
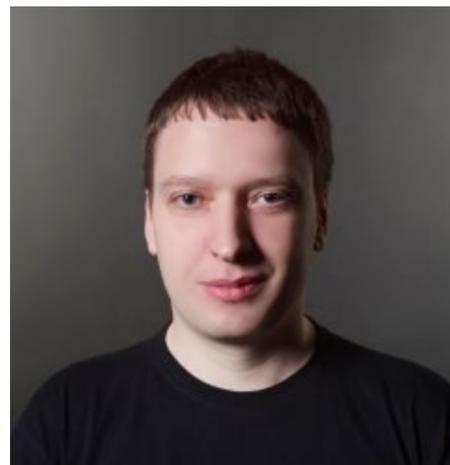


Random Testing of a Higher-Order Blockchain Language *(Experience Report)*



Tram Hoang

National University of Singapore



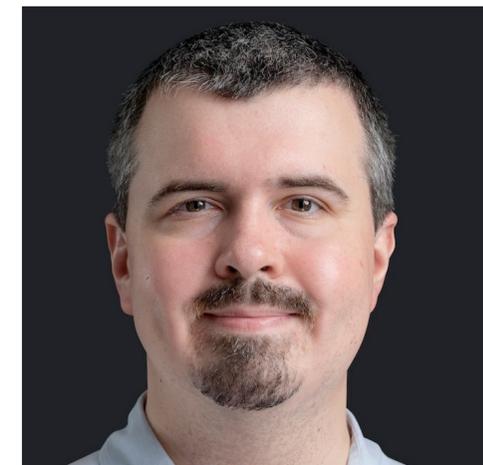
Anton Trunov

Zilliqa



Leonidas Lampropoulos

University of Maryland, College Park



Ilya Sergey

National University of Singapore



What is Blockchain?

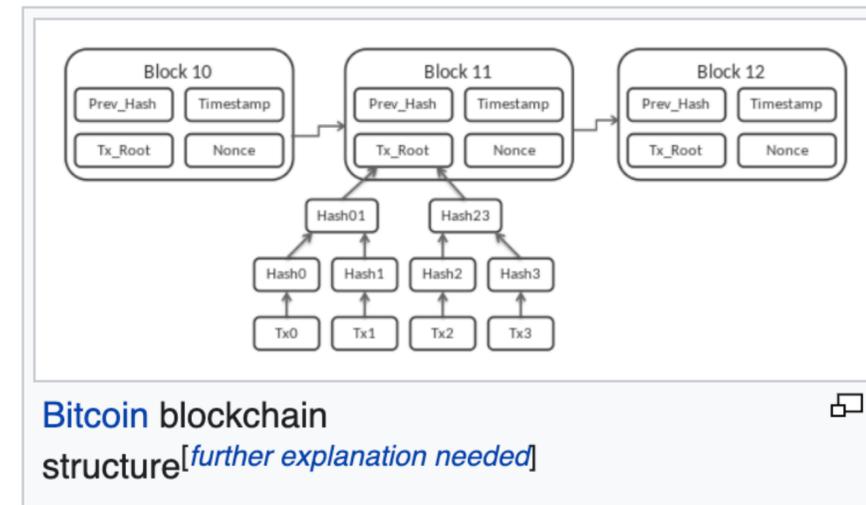
Blockchain



From Wikipedia, the free encyclopedia

For other uses, see [Block chain \(disambiguation\)](#).

A **blockchain** is a type of [Digital Ledger Technology \(DLT\)](#) that consists of growing list of [records](#), called *blocks*, that are securely linked together using [cryptography](#).^{[1][2][3][4]} Each block contains a [cryptographic hash](#) of the previous block, a [timestamp](#), and transaction data (generally represented as a [Merkle tree](#), where [data nodes](#) are represented by leaves). The timestamp proves that the transaction data existed when the block was created. Since each block contains information about the block previous to it, they effectively form a *chain* (compare [linked list](#) data structure), with each additional block linking to the ones before it. Consequently, blockchain transactions are irreversible in that, once they are recorded, the data in any given block cannot be altered retroactively without altering all subsequent blocks.



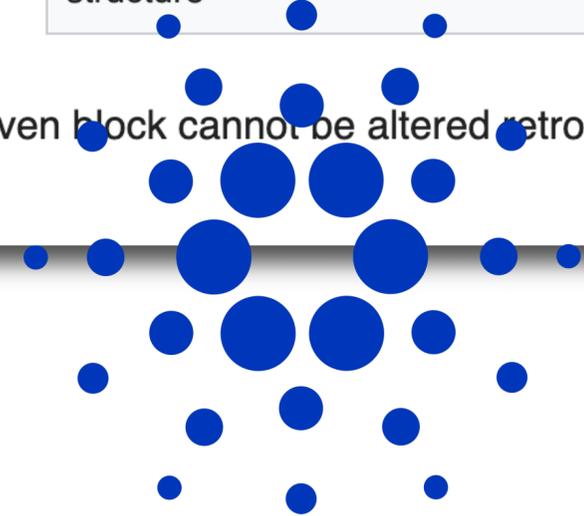
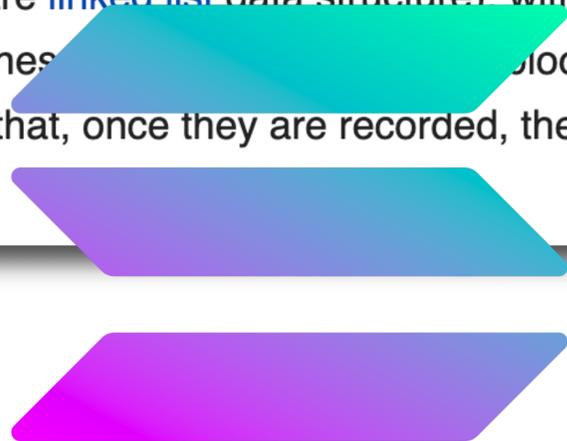
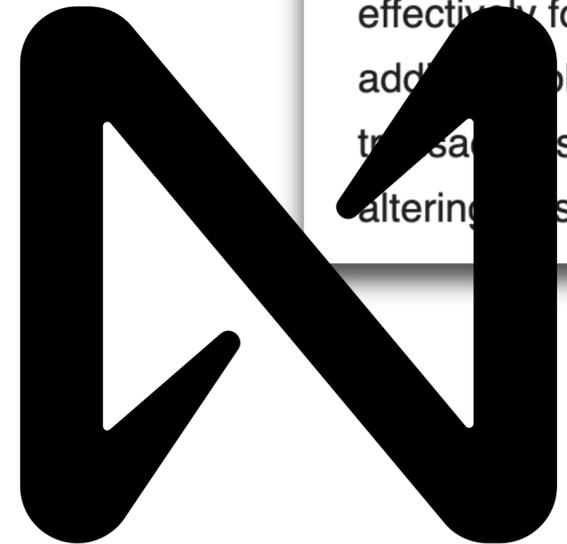
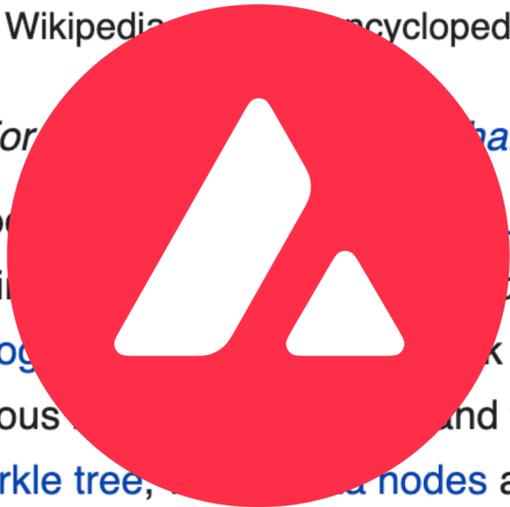
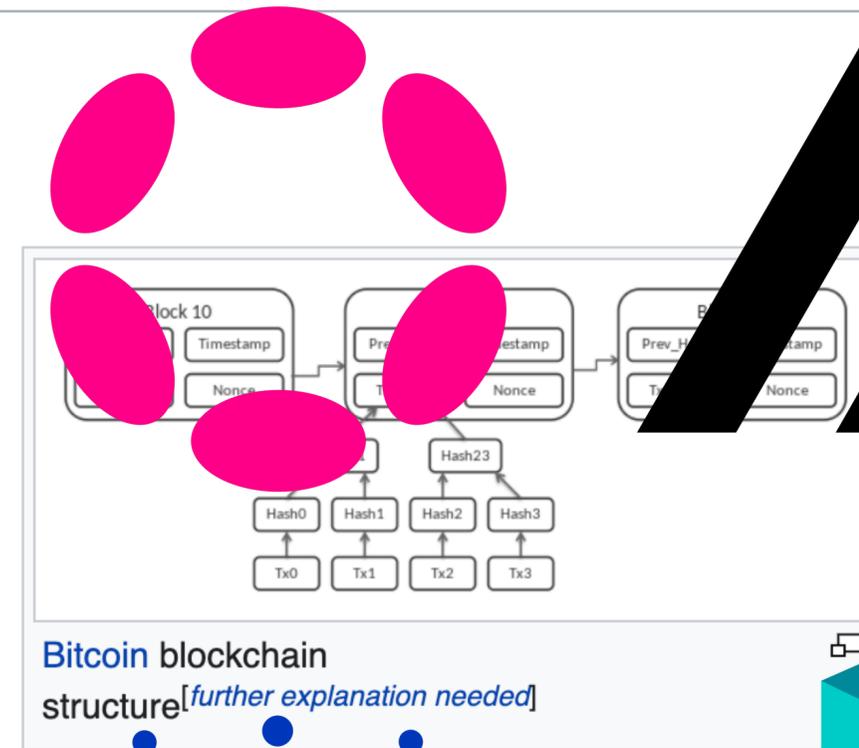
What is Blockchain?

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Blockchains are functional

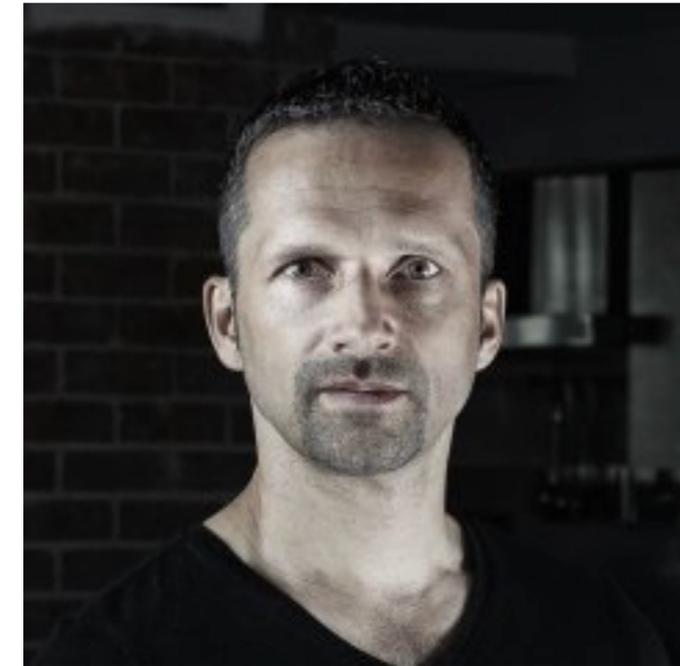
ICFP 2019 Keynote

Track [ICFP 2019 Keynotes and Reports](#)

When **Mon 19 Aug 2019 09:00 - 10:00** at [Aurora Borealis](#) - [Monday Keynote](#) Chair(s): [Derek Dreyer](#)

Abstract Functional programming and blockchains are a match made in heaven! The immutable and reproducible nature of distributed ledgers is mirrored in the semantic foundation of functional programming. Moreover, the concurrent and distributed operation calls for a programming model that carefully controls shared mutable state and side effects. Finally, the high financial stakes often associated with blockchains suggest the need for high assurance software and formal methods.

Nevertheless, most existing blockchains favour an object-oriented, imperative approach in both their implementation as well as in the contract programming layer that provides user-defined custom functionality on top of the basic ledger. On the one hand, this might appear surprising, given that it is widely understood that this style of programming is particularly risky in concurrent and distributed systems. On the other hand, blockchains are still in their infancy and little research has been conducted into associated programming language technology.



Manuel Chakravarty

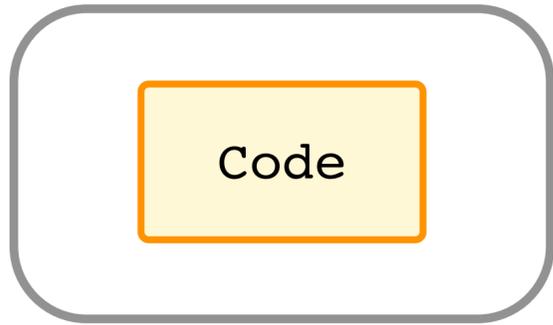
Tweag I/O & IOHK

Getting Your Code on a Blockchain

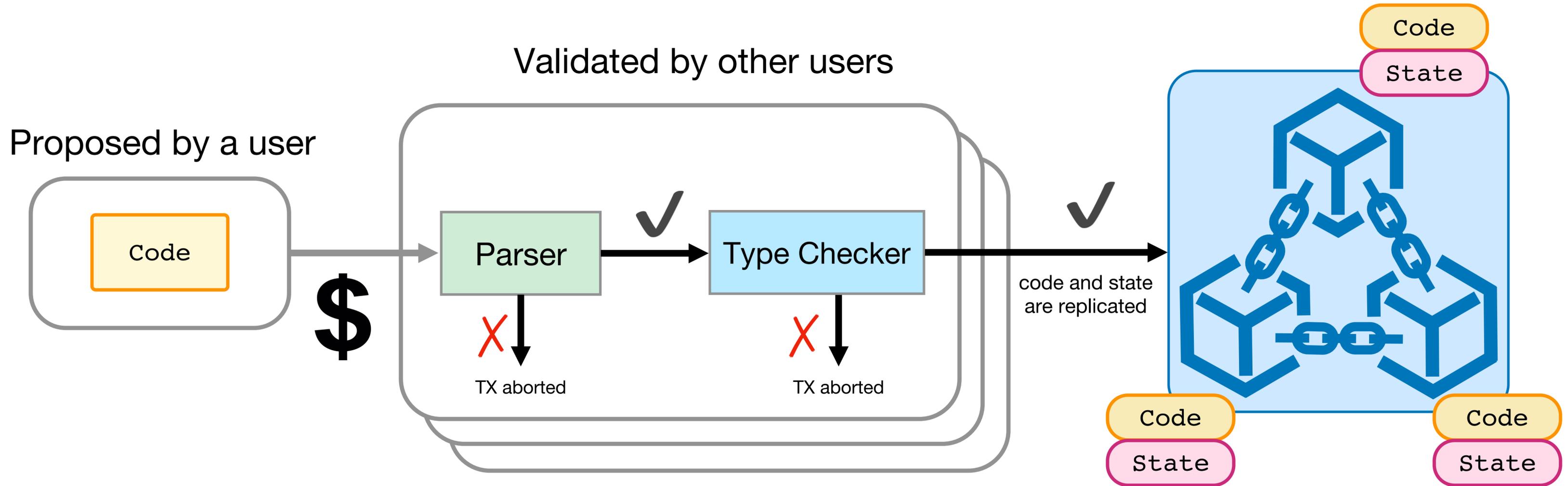
```
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2 library FungibleToken
3 let min_int : Uint128 → Uint128 → Uint128 = (* ... *)
4 let le_int : Uint128 → Uint128 → Bool = (* ... *)
5 let one_msg : Msg → List Msg = (* Return singleton List with a message *)
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7 contract FungibleToken
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14 transition BalanceOf (tokenOwner : ByStr20)
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```

Getting Your Code on a Blockchain

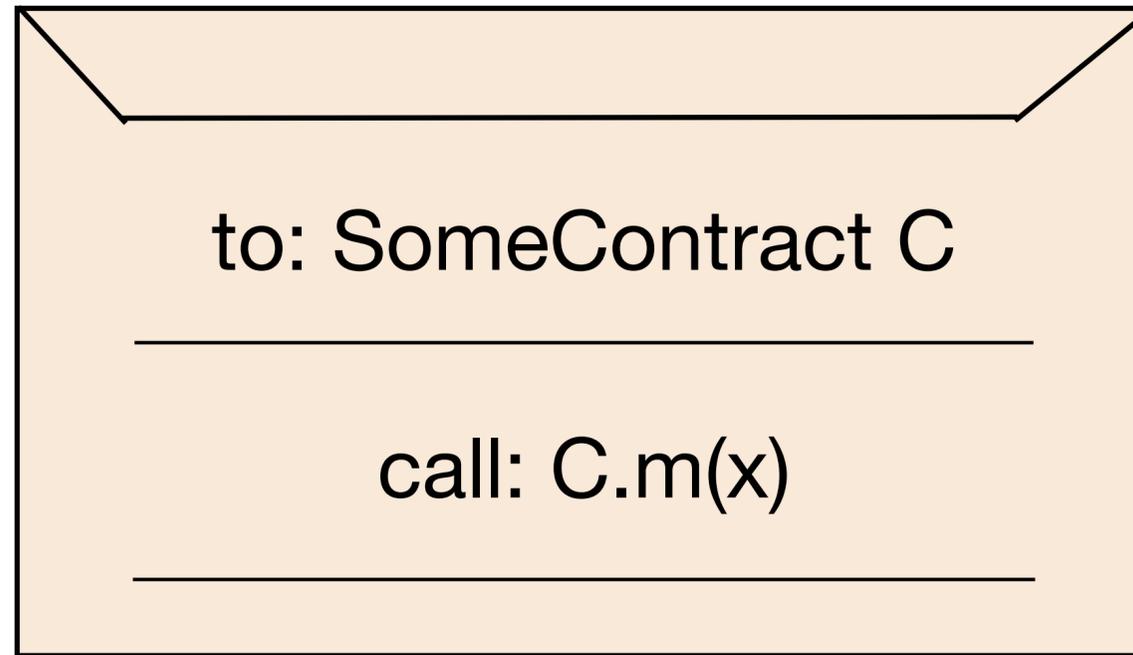
Proposed by a user



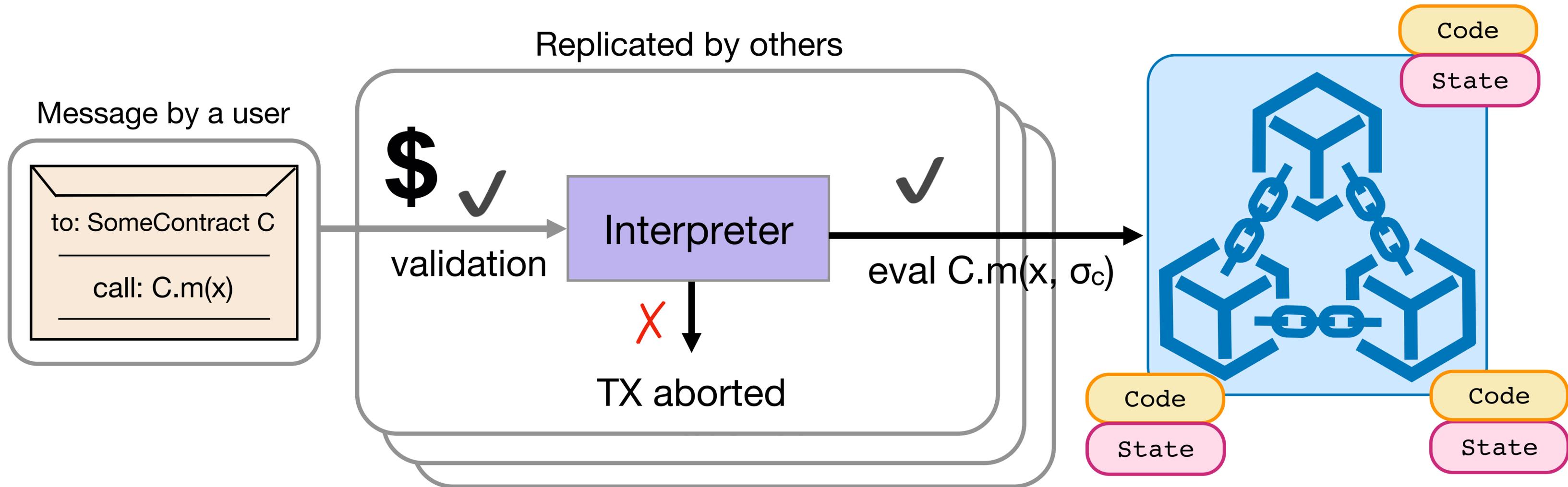
Getting Your Code on a Blockchain



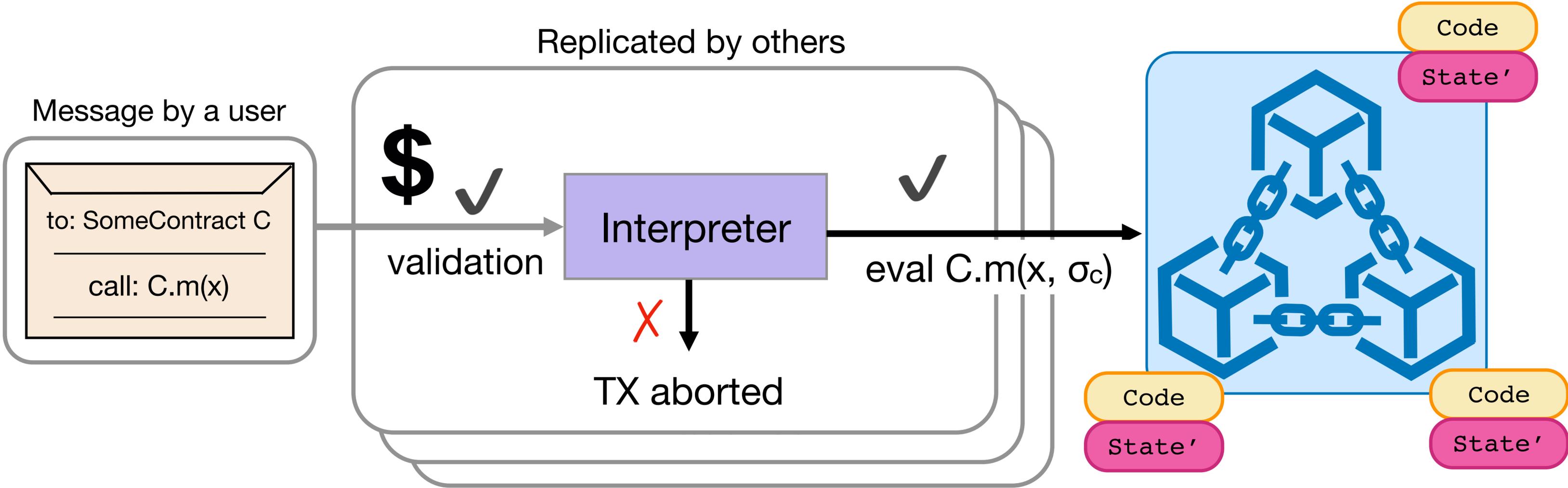
Using Your Code on a Blockchain



Using Your Code on a Blockchain



Using Your Code on a Blockchain



What Can Go Wrong?



Scenario 1: Static Semantics Bug

Fund_Amy.code



```
fun withdraw_donations _ =  
  ...  
  for (b <- backer_accounts) do  
    account_to_address(b) match  
    | Some(addr) => ...  
    | None => ...  
  done
```

⊢ Fund_Amy OK => **No Exceptions**

Scenario 1: Static Semantics Bug

Fund_Amy.code



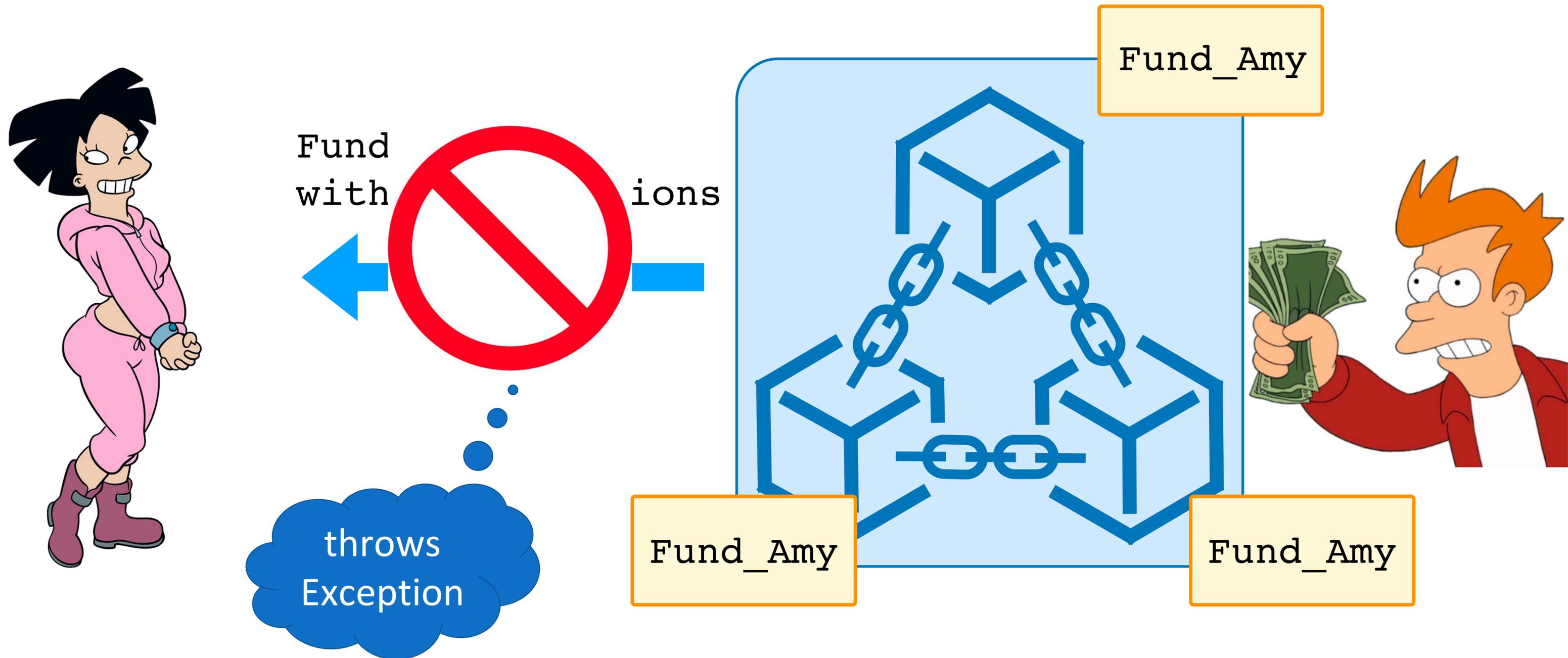
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    account_to_address(b) match  
    | Some(addr) => ...  
    | None => ...  
  done
```

Throws an
exception if b
is ill-formed

⊢ Fund_Amy OK => No Exceptions

WRONG!

Scenario 1: Static Semantics Bug



What Else Can Go Wrong?



Scenario 2: Cost Semantics Bug

Interpreter.ml



```
fun eval_arith_operation op args =  
  ...  
  | Power base x =>  
    let res = compute_pow base x in  
    let gas_charged = log2 x in  
    (res, gas_charged)
```

Scenario 2: Cost Semantics Bug



Interpreter

Replicated by
many users to
re-validate

```
fun eval_arith_operation ... =  
  ...  
  | Power base x =>  
    let res = compute_pow base x in  
    let gas_charged = log2 x in  
    (res, gas_charged)
```

Takes $O(x)$
in Leela's
implementation

Scenario 2: Cost Semantics Bug

Interpreter.ml



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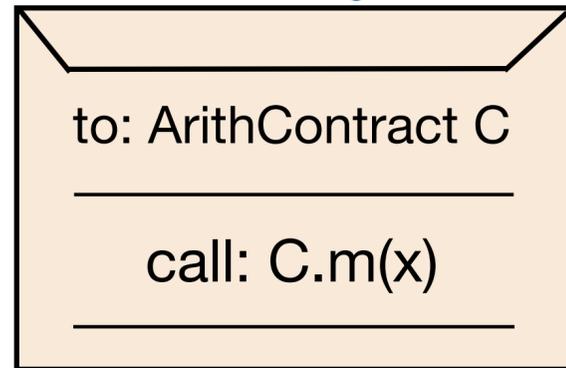
Charges for
computing
power

Scenario 2: Cost Semantics Bug



$\text{pow}(b, x)$
cheap to
propose

Expensive
to execute

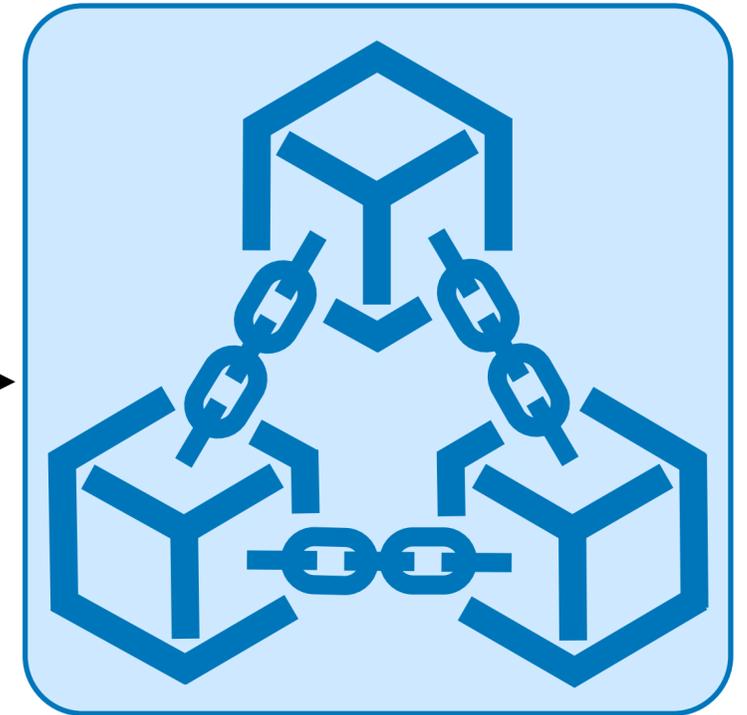


validation

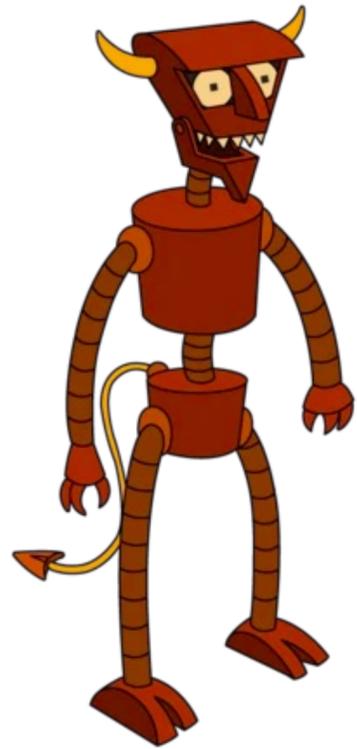
Interpreter.ml

eval $C.m(x, \sigma_c)$

X
TX aborted

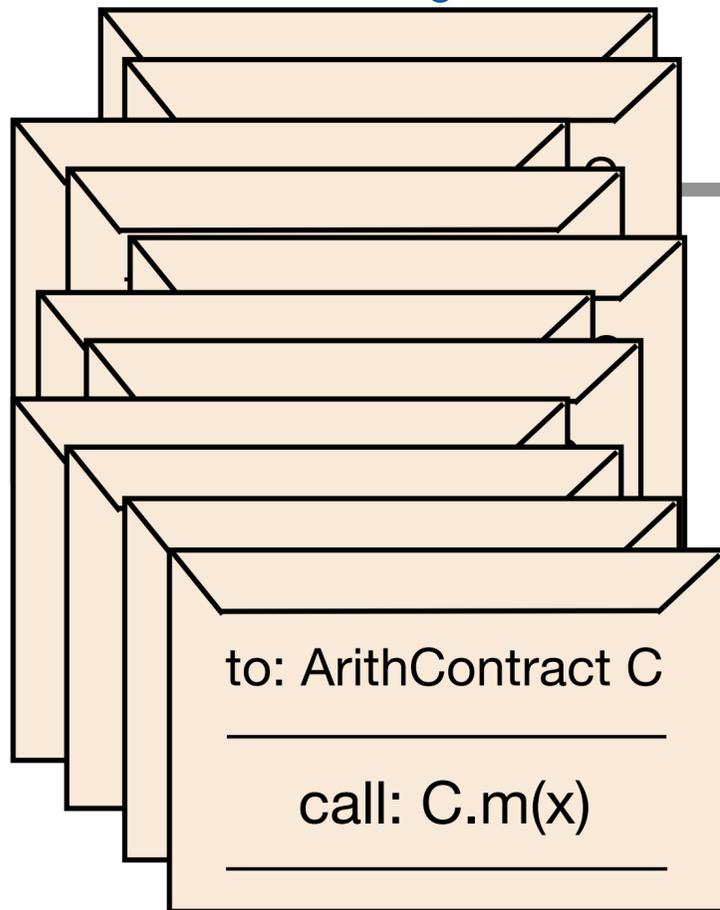


Scenario 2: Cost Semantics Bug



pow(b, x)
cheap to
propose

Expensive
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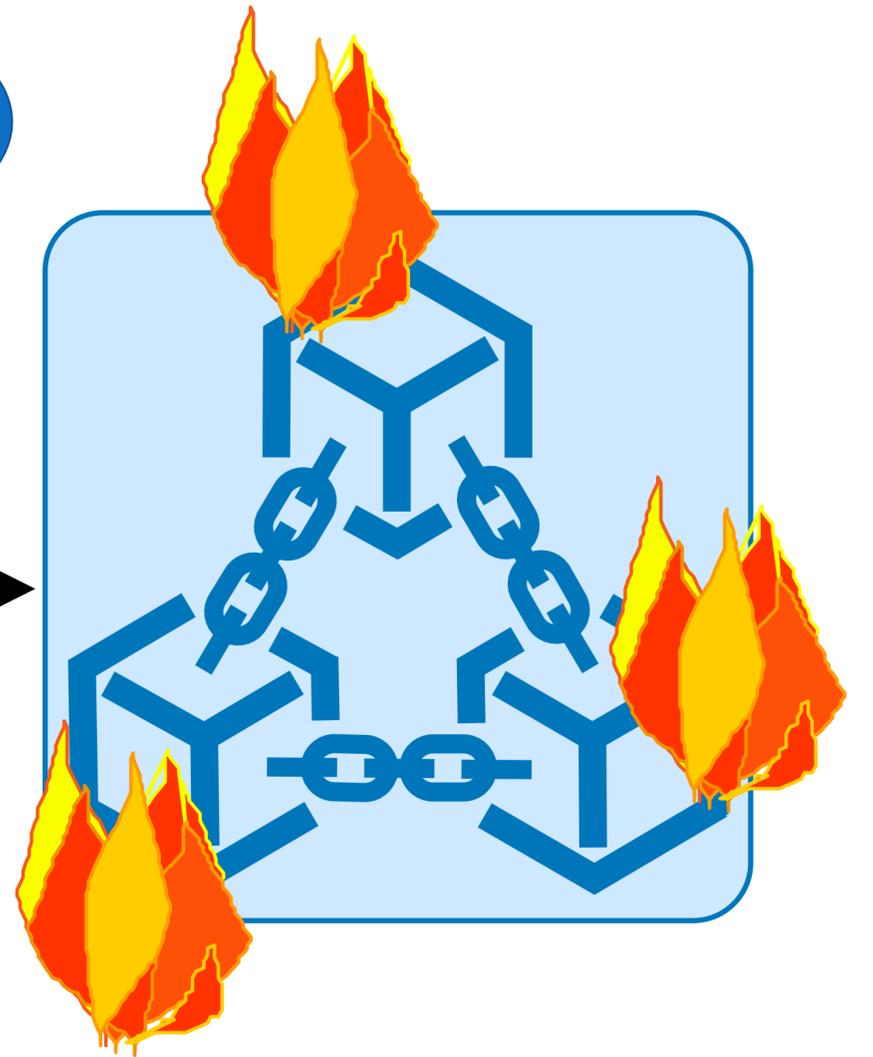


validation

Interpreter.ml

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Scenario 2: Cost Semantics Bug

Interpreter.ml



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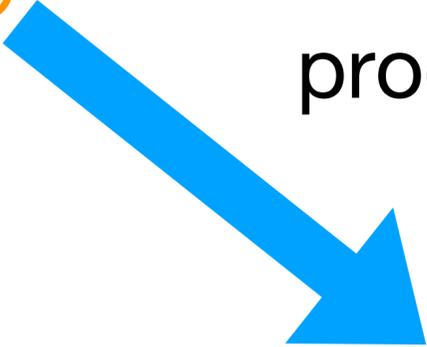


Scenario 3: A Compiler Exploit



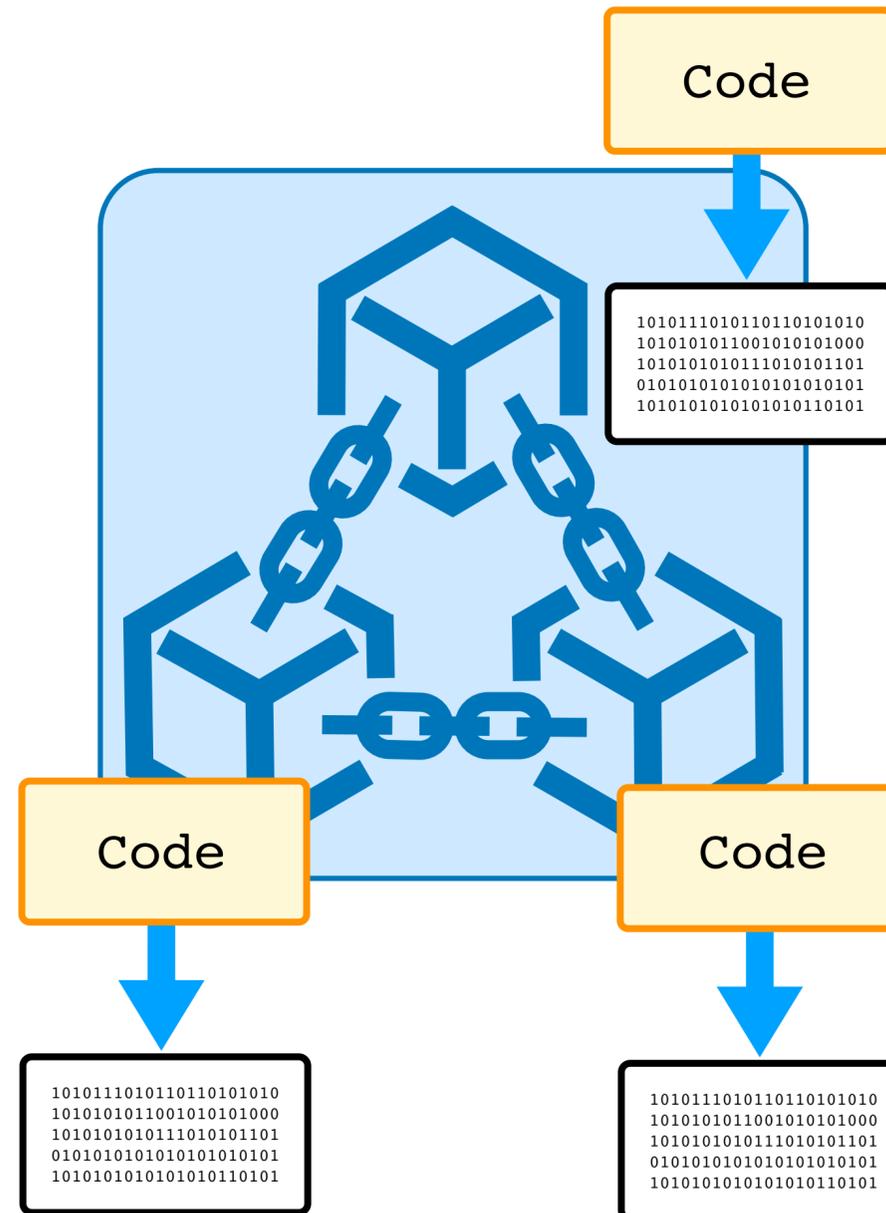
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29 transition Allowance (tokenOwner : ByStr20, spender : ByStr20) (* code omitted *) end
```

**10x speedup
in transaction
processing!**



```
101011101011011010101010
1010101011001010101000
1010101010111010101101
0101010101010101010101
1010101010101010110101
```

Scenario 3: A Replicated Compiler Exploit



Scenario 3: A Replicated Compiler Exploit



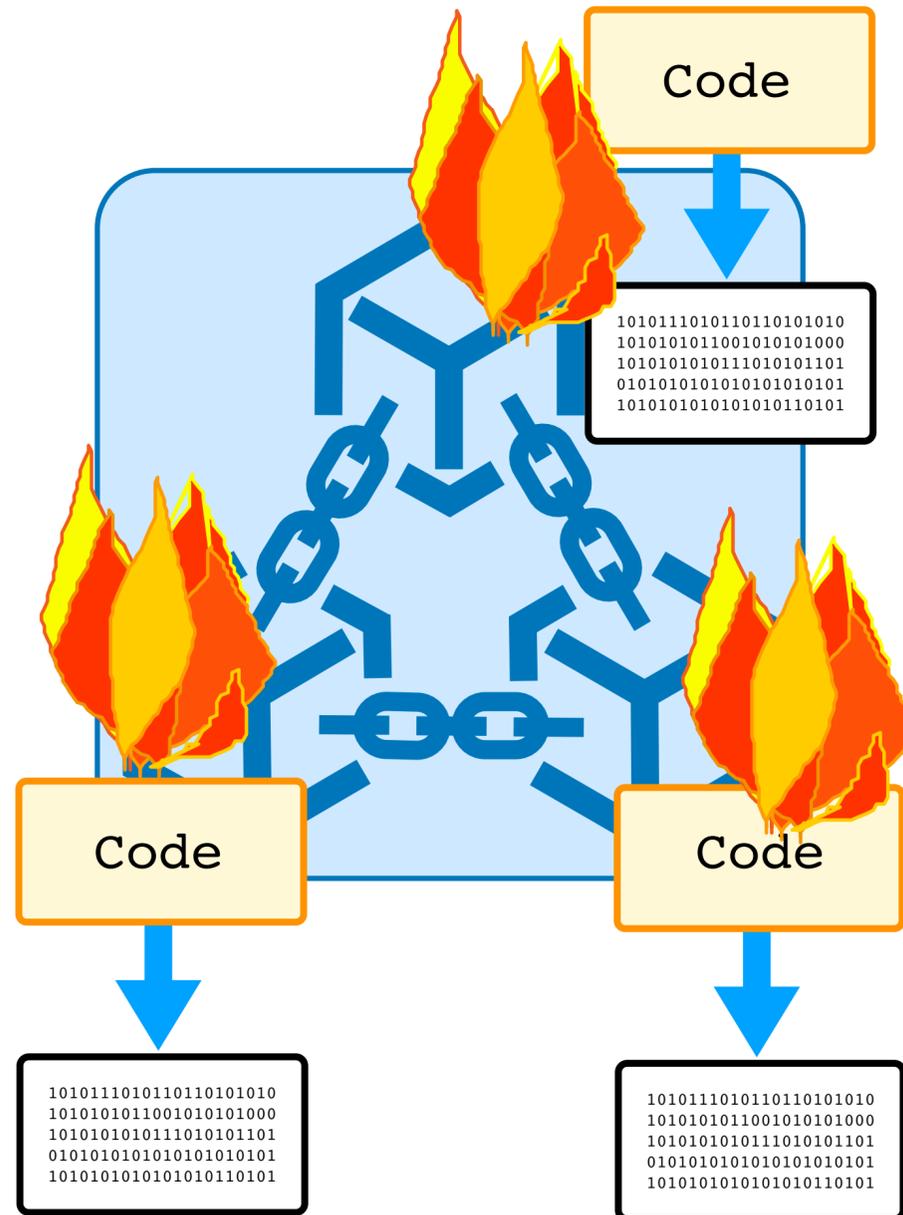
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```

$O(n^3)$
in the
program size



```
101011101011011010101010
1010101011001010101000
1010101010111010101101
0101010101010101010101
1010101010101010110101
```

Scenario 3: A Replicated Compiler Exploit



Language-Layer Bugs



- **Type Checker & Interpreter:**
static guarantees are not ensured at runtime

- **Reference Interpreter:**
cost semantics is misaligned with runtime costs



- **Compiler:**
Compilation cost is not linear in the program size



This Talk

Catching **Bugs**

in the Blockchain **Language Layer**

using **Property-Based Testing**

The Rest of the Talk

- The Language
- The Testing Framework
- Generating Random Programs
- Semantic Harness for Testing
- Found Bugs

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Scilla

Smart Contract Intermediate Level Language



- Principled Model for Computation
System F + extensions
- Not Turing Complete
Only structural recursion/iteration
- Explicit Effects
State Transformer Semantics
- Communication
Contracts are autonomous actors

Used by



OOPSLA'19



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Safer Smart Contract Programming with SCILLA

ILYA SERGEY, Yale-NUS College, Singapore and National University of Singapore, Singapore
VAIVASWATHA NAGARAJ, Zilliqa Research, India
JACOB JOHANNSEN, Zilliqa Research, Denmark
AMRIT KUMAR, Zilliqa Research, United Kingdom
ANTON TRUNOV, Zilliqa Research, Russia
KEN CHAN GUAN HAO, Zilliqa Research, Malaysia

The rise of programmable open distributed consensus platforms based on the blockchain technology has aroused a lot of interest in replicated stateful computations, *aka smart contracts*. As blockchains are used predominantly in financial applications, smart contracts frequently manage millions of dollars worth of virtual coins. Since smart contracts cannot be updated once deployed, the ability to reason about their correctness becomes a critical task. Yet, the de facto implementation standard, pioneered by the Ethereum platform, dictates smart contracts to be deployed in a low-level language, which renders independent audit and formal verification of deployed code infeasible in practice.

Scilla

Pure Fragment: System F

Variables: x, y, \dots, X, Y, \dots

Primitives: $p ::= \text{Int32} \mid \text{Int64} \mid \dots \mid \text{UInt32} \mid \dots \mid$
 $\text{String} \mid \text{ByStr} \mid \text{ByStrX} \mid \text{Message} \mid \dots$

Constants : $c ::= 0 \mid 1 \mid \text{" " } \mid \dots$

Types: $\sigma, \tau \dots ::= p \mid \sigma \rightarrow \tau \mid X \mid \forall X. \tau$

Terms: $e, \dots ::= x \mid c \mid e_1 e_2 \mid \lambda x : \sigma. e$
 $\mid e \tau \mid \Lambda X. e \mid \{f : e, \dots\}$
 $\mid C e_1 \dots e_n \mid \text{match } e \text{ with } \langle \text{pat} \Rightarrow \text{sel} \rangle \text{ end}$

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Pure Fragment: System F

Variables: x, y, \dots, X, Y, \dots

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Scilla

Stateful Fragment

```
S ::=  
  | x <- f  
  | f := x  
  | let x = e  
  | event m  
  | send ms
```

Scilla

Contract definition

Library of pure functions

Mutable fields

Immutable contract parameters

Transitions

Interaction via messages

```
1 scilla_version 0
2 library FungibleToken
3 let min_int : Uint128 → Uint128 (* code omitted *)
4 let le_int : Uint128 → Uint128 → Bool = (* code omitted *)
5 let one_msg : Msg → List Msg = (* Return singleton List with one message *)
6
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```

Scilla

Monadic Interpreter (in OCaml)

```
1 let rec exp_eval (e, loc) env = match e with
2   let open EvalMonad.Let_syntax in
3   | Literal l -> return (l, env)
4   | Var i ->
5     let%bind v = Env.lookup env i in return (v, env)
6   | Let (i, _, lhs, rhs) ->
7     let%bind lval, _ = wrap_eval lhs env (e, U) in
8     let env' = Env.bind env (get_id i) lval in
9     wrap_eval rhs env' (e, E lval)
10  | GasExpr (g, e') ->
11    let thunk () = exp_eval e' env in
12    let%bind cost = eval_gas_charge env g in
13    checkwrap thunk (Uint64.of_int cost)
14    ("Insufficient gas")
15  | Fixpoint (g, _, body) -> (* Other cases *)
```



Monadic
cost & failure
tracking

The Rest of the Talk

- The Language
- The Testing Framework
- Generating Interesting Programs
- Semantic Harness for Testing
- Found Bugs

The Rest of the Talk

- The Language
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Property-Based Testing

- Programmer writes *properties* of software system or component as a function from inputs to Booleans
- Tool *generates* many random inputs and applies the function to each one
- Famously embodied in **Haskell QuickCheck**



John Hughes



Koen Claessen

Testing Language Properties

Theorem preservation :

forall Γ e τ e' ,

$\Gamma \vdash e : \tau \rightarrow e \Rightarrow e' \rightarrow \Gamma \vdash e' : \tau.$

Tricky part:
we only need
well-typed terms

Testing Language Properties

Theorem preservation :

forall Γ e τ e' ,

$\Gamma \vdash e : \tau \rightarrow e \Rightarrow e' \rightarrow \Gamma \vdash e' : \tau.$

Non-Solution

1. Generate an *environment*, *term*, and *type*
2. Check if the term e is *well-typed*
3. If it's not, start over (and again...)

Testing Language Properties

Theorem preservation :

forall $\Gamma e \tau e'$,

$\Gamma \vdash e : \tau \rightarrow e \Rightarrow e' \rightarrow \Gamma \vdash e' : \tau.$

Solution

Write a generator that produces *well-typed terms!*

Testing Language Properties

Write a generator that produces *well-typed terms*.

This is a difficult and long-studied problem!

- CSmith [Yang et al., PLDI '11]
- Testing GHC's strictness analyser [Palka et al., AST '11]
- Testing Noninterference, Quickly [Hritcu et al., ICFP '13]

A Tool for the Job: QuickChick

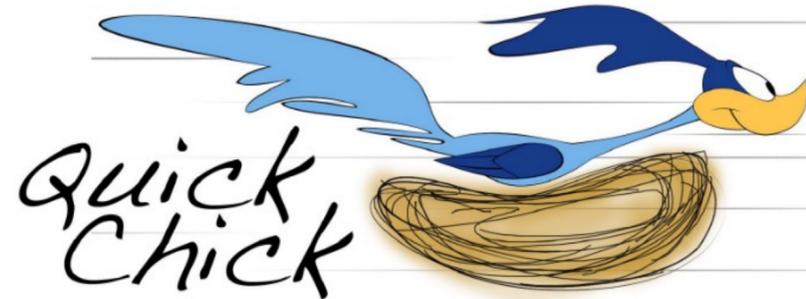


... used in practice to facilitate verification
... in many places
(UPenn, UMD, Princeton, MIT, INRIA)
... taught in courses and summer schools

(**[JFP 2016]**, DeepWeb, Vellvm)

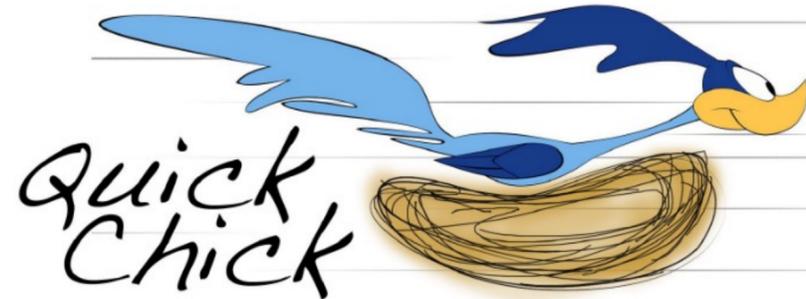
(UMD 631, DeepSpec Summer Schools)

A Tool for the Job: QuickChick



- Easy to define generators for hierarchical data (ASTs)
- Good integration with OCaml via Coq extraction
- Ability to do fuzzing-like, feedback-based generation

A Tool for the Job: QuickChick



- Easy to define generators for hierarchical data (ASTs)
- Good integration with OCaml via Coq extraction
- Ability to do fuzzing-like, feedback-based generation
(ended up not using much, at least so far)

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Pure Fragment: System F

Variables: x, y, \dots, X, Y, \dots

Primitives: $p ::= \text{Int32} \mid \text{Int64} \mid \dots \mid \text{Uint32} \mid \dots \mid$
 $\text{String} \mid \text{ByStr} \mid \text{ByStrX} \mid \text{Message} \mid \dots$

Constants : $c ::= 0 \mid 1 \mid \text{" " } \mid \dots$

Types: $\sigma, \tau \dots ::= \mathbf{p} \mid \sigma \rightarrow \tau \mid \mathbf{X} \mid \forall \mathbf{X}. \tau$

Terms: $e, \dots ::= \mathbf{x} \mid \mathbf{c} \mid \mathbf{e}_1 \mathbf{e}_2 \mid \lambda \mathbf{x} : \sigma. \mathbf{e}$
 $\mid \mathbf{e} \ \boldsymbol{\tau} \mid \boldsymbol{\Lambda} \mathbf{X}. \mathbf{e} \mid \{f : e, \dots\}$
 $\mid \mathbf{C} \ e_1 \ \dots \ e_n \mid \text{match } e \text{ with } \langle \text{pat} \Rightarrow \text{sel} \rangle \text{ end}$

Generating System F Terms

$$\frac{\Gamma; X, \Delta \vdash e : \tau}{\Gamma; \Delta \vdash \Lambda X. e : \forall X. \tau}$$

$$\frac{\Gamma; \Delta \vdash e : \forall X. \tau}{\Gamma; \Delta \vdash e \tau' : \tau[\tau' / X]}$$

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$$\frac{\Gamma; \Delta \vdash e : \forall X. \tau \quad \sigma = \tau[\tau' / X]}{\Gamma; \Delta \vdash e \tau' : \sigma}$$

Generating System F Terms

How do we generate τ , τ' , and X such that this equality holds?

$$\frac{\Gamma; \Delta \vdash e : \forall X. \tau \quad \sigma = \tau[\tau' / X]}{\Gamma; \Delta \vdash e \tau' : \sigma}$$

Un-substitution

Idea: Produce a distribution of closed “sub-types” τ' of σ to abstract!*

$$\frac{\Gamma; \Delta \vdash e : \forall X. \tau \quad \sigma = \tau[\tau' / X]}{\Gamma; \Delta \vdash e \tau' : \sigma}$$

- Pick a closed sub-type τ' of σ
- Traverse σ and abstract τ' with X

*Details are a bit tricky (need keep track of closedness and frequencies): see the paper for the algorithm.

The Rest of the Talk

- The Language
- The Testing Framework
- **Generating Interesting Programs**
- Semantic Harness for Testing
- Bugs

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Testing Control- and Type-Flow Analysis in Scilla Compiler

- The analysis correctly over-approximates the *flow of values to variables*
 - use case: **function inlining**
- It also over-approximates the flow of *ground types to type variables*
 - use case: **monomorphization**
- To test over-approximation, we need **collecting semantics**

Monadic Interpreters to the Rescue

```
1 let rec exp_eval (e, loc) env = match e with
2   let open EvalMonad.Let_syntax in
3   | Literal l -> return (l, env)
4   | Var i ->
5     let%bind v = Env.lookup env i in return (v, env)
6   | Let (i, _, lhs, rhs) ->
7     let%bind lval, _ = wrap_eval lhs env (e, U) in
8     let env' = Env.bind env (get_id i) lval in
9     wrap_eval rhs env' (e, E lval)
10  | GasExpr (g, e') ->
11    let thunk () = exp_eval e' env in
12    let%bind cost = eval_gas_charge env g in
13    checkwrap thunk (Uint64.of_int cost)
14    ("Insufficient gas")
15  | Fixpoint (g, _, body) -> (* Other cases *)
```

PLDI'13 Monadic Abstract Interpreters

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ICFP'17



Abstracting Definitional Interpreters (Functional Pearl)

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DAVID VAN HORN, Univeristy of Maryland, USA

Implemented *State-Collecting Semantics* for **Flows-To Information**
as a **monad instance**

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Bugs Found!

ID	Short bug description	Status
<i>Type checking and type inference</i>		
#1	Closure values could be used as map keys	known
#2	Type variables were not properly shadowed; the bug allowed for encoding non well-formed recursion	known
#3	Type checker allowed for hashing closure values	new
#4	Type checker allowed for hashing polymorphically-typed values	new
#5	Sub-types of address type ByteString were implicitly up-cast to type ByteString	new
<i>Definitional interpreter</i>		
#6	Conversion between bech32 and ByStr20 datatypes threw an exception	new
#7	Cryptographic built-in operations <code>ecdsa_verify</code> and <code>ecdsa_recover_pk</code> were throwing exceptions	new
#8	Cryptographic built-in <code>ecdsa_recover_pk</code> could abort Scilla interpreter with an OS-level exception	new
#9	The interpreter inadequately charged gas for the power arithmetic operation	new
<i>Type-flow analysis</i>		
#10	Type-flow analysis does not terminate on programs that make use of impredicative polymorphism	known

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To Take Away



Random Testing of a Higher-Order Blockchain Language (Experience Report)

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ANTON TRUNOV, Zilliqa Research, Russia

LEONIDAS LAMPROPOULOS, University of Maryland, USA

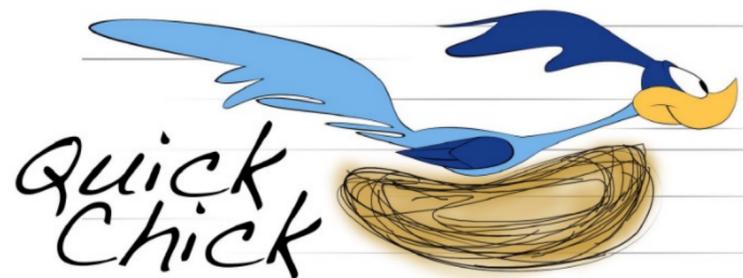
ILYA SERGEY, National University of Singapore, Singapore

We describe our experience of using property-based testing—an approach for automatically generating random inputs to check executable program specifications—in a development of a higher-order smart contract language that powers a state-of-the-art blockchain with thousands of active daily users.

We outline the process of integrating QUICKCHICK—a framework for property-based testing built on top of the Coq proof assistant—into a real-world language implementation in OCaml. We discuss the challenges we have encountered when generating well-typed programs for a realistic higher-order smart contract language, which mixes purely functional and imperative computations and features runtime resource accounting. We describe the set of the language implementation properties that we tested, as well as the semantic harness required to enable their validation. The properties range from the standard type safety to the soundness of a control- and type-flow analysis used by the optimizing compiler. Finally, we present the list of bugs discovered and rediscovered with the help of QUICKCHICK and discuss their severity and possible ramifications.

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- We've tested the *language layer* (based on System F) of a real-world blockchain with **QuickChick** and found several **critical bugs**.
- We've introduced *un-substitution*: a simple technique to generate *well-typed* System F terms.
- We've used *monadic interpreters* methodology of implementing *collecting semantics*.
- Check out our *artifact* for the QuickChick test harness and examples!



Thanks!