

Foundations and tools for the static analysis of Ethereum smart contracts

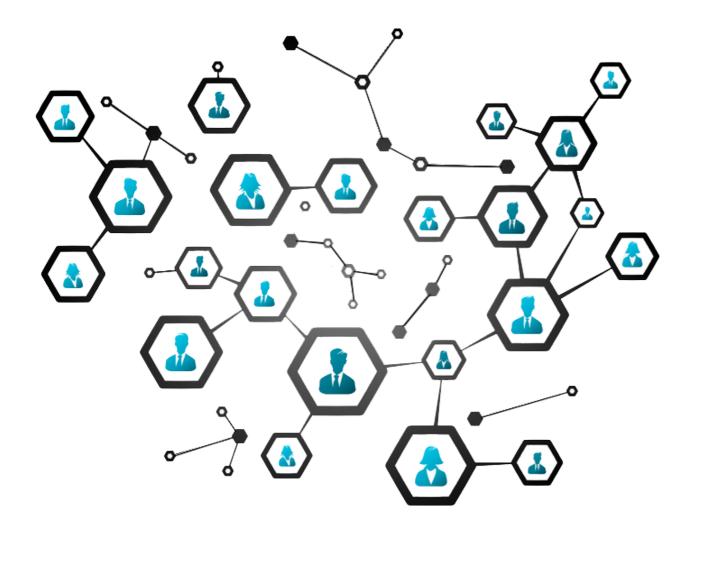
Matteo Maffei and Clara Schneidewind

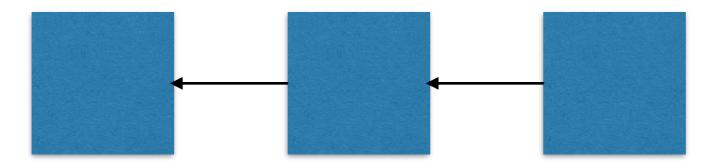
Outline

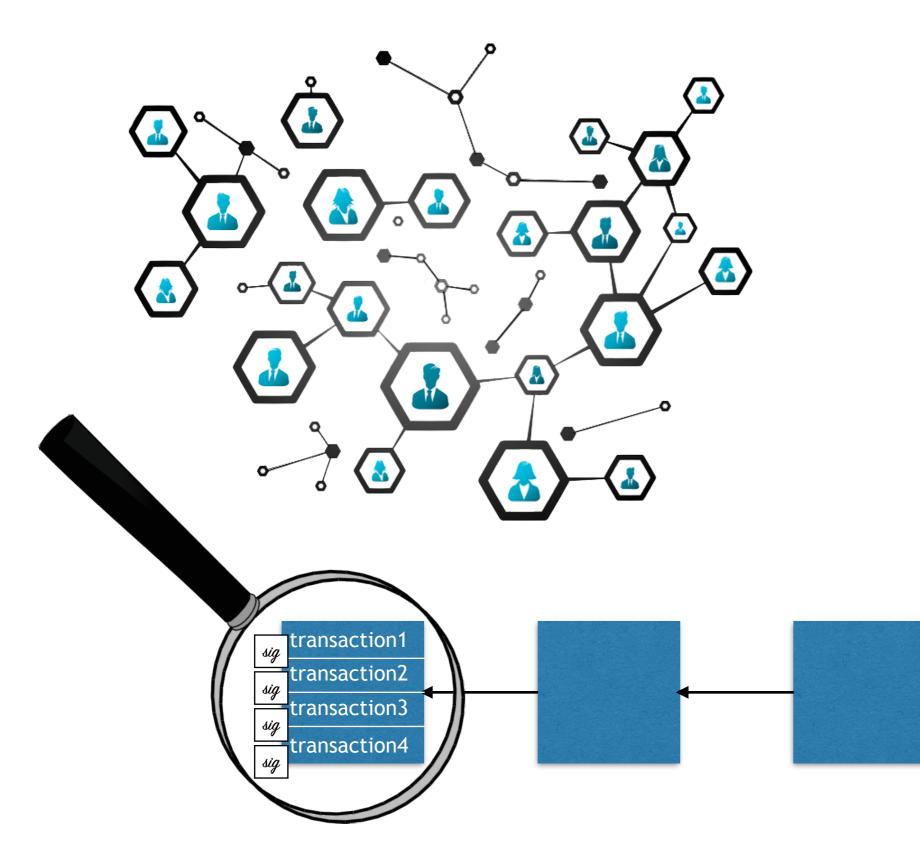
Introduction to Ethereum

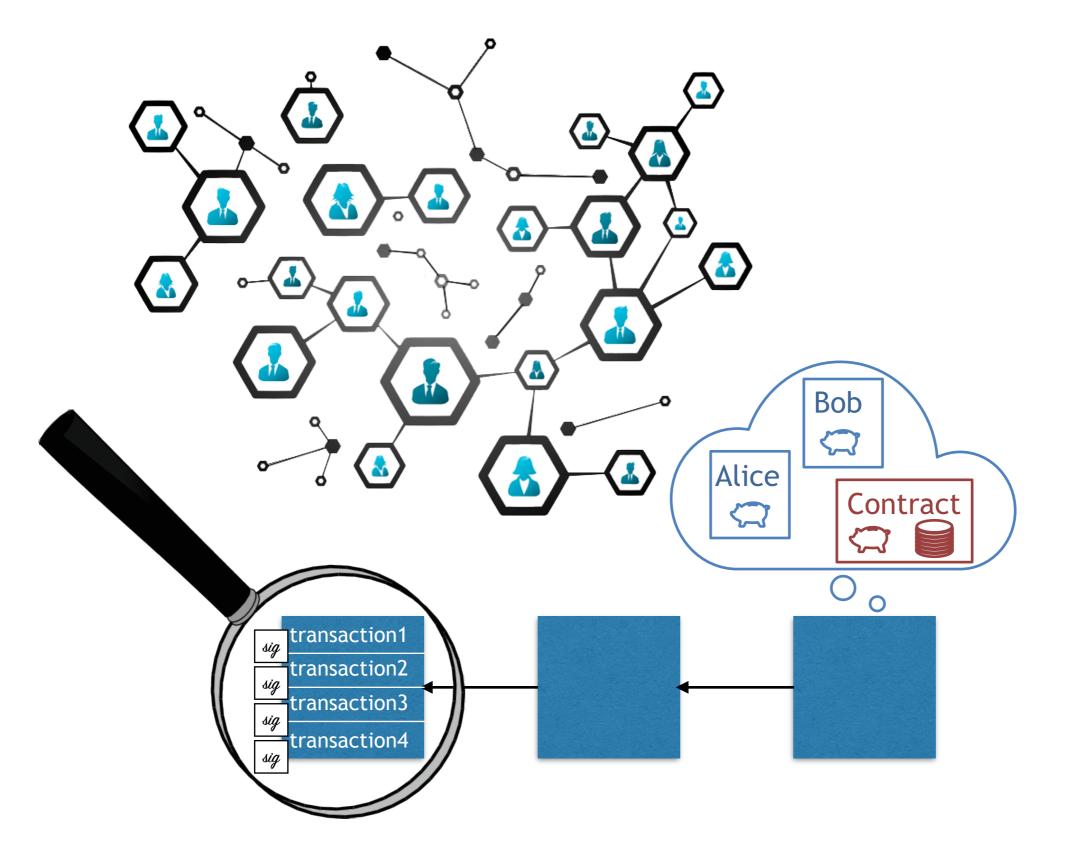
Semantics of EVM bytecode

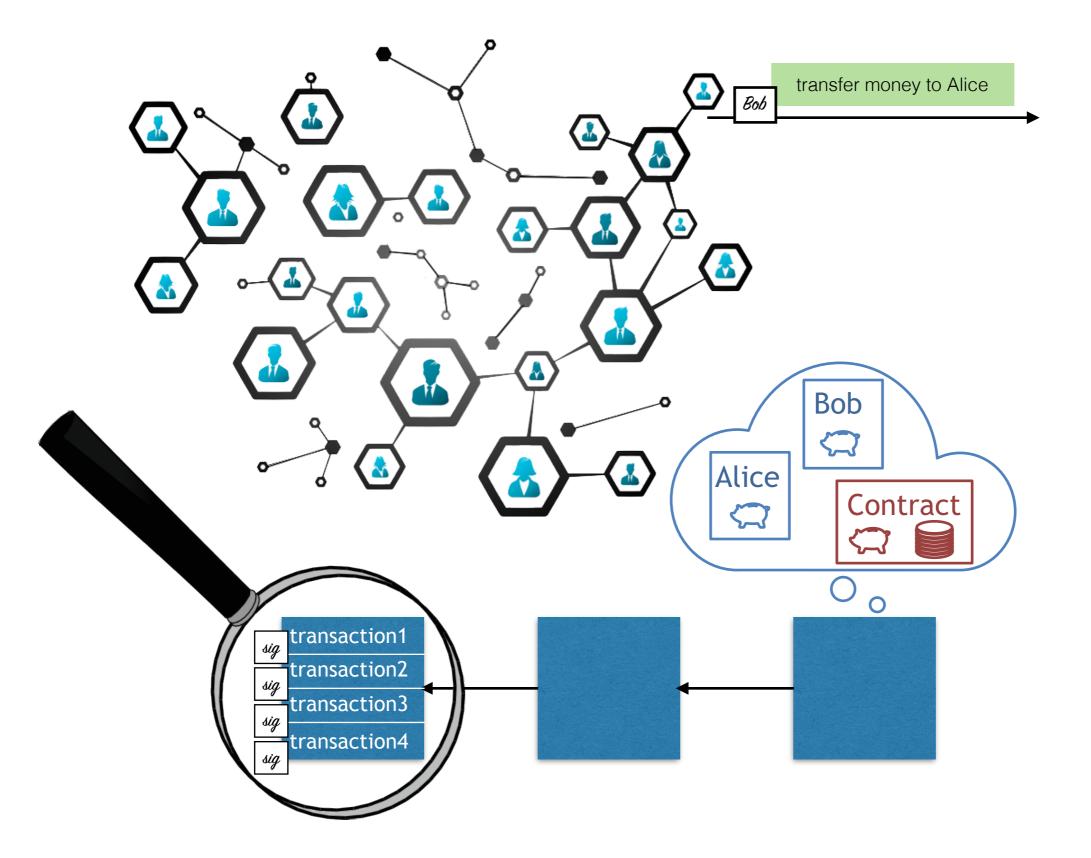
Static Analysis of EVM bytecode

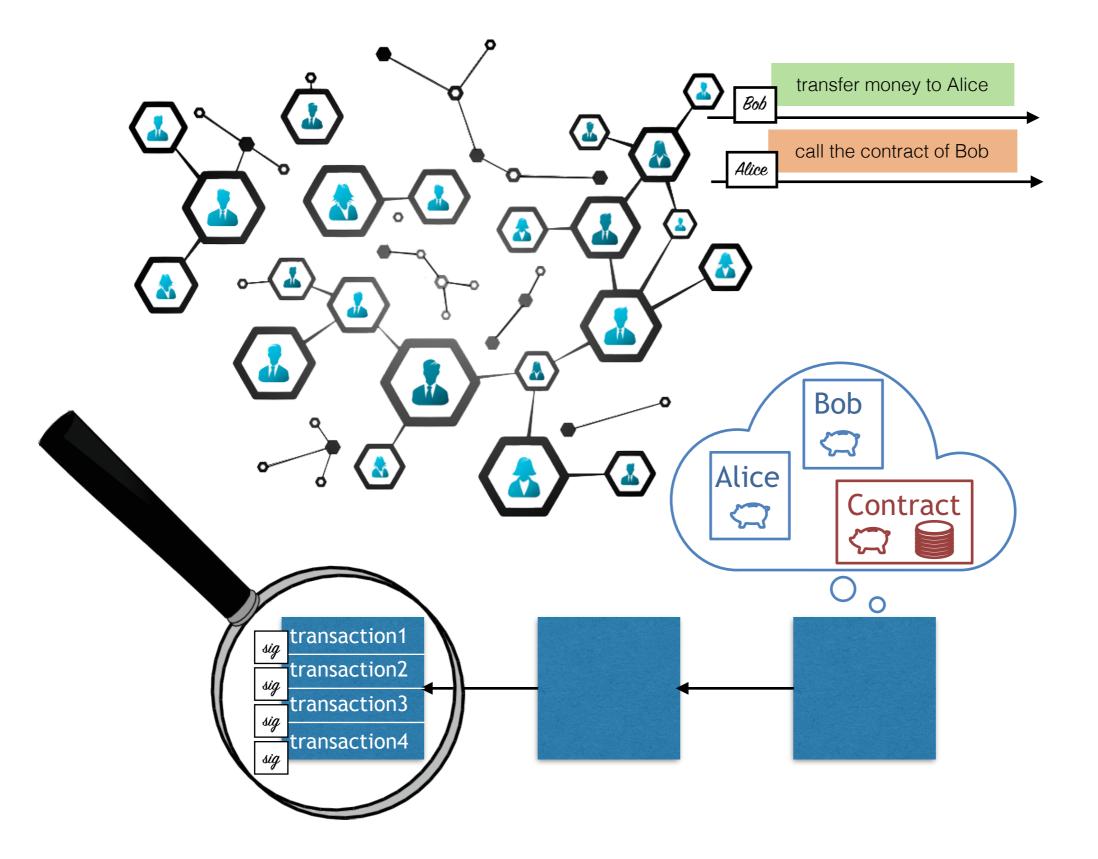


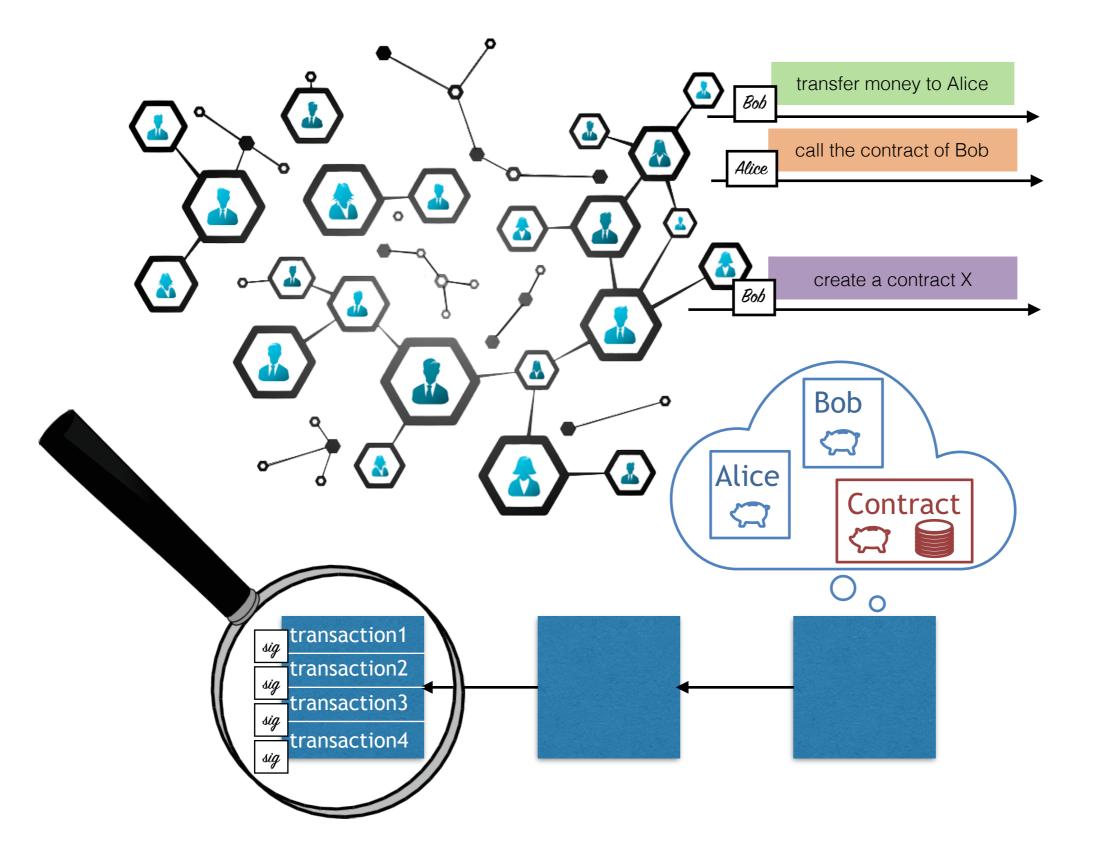


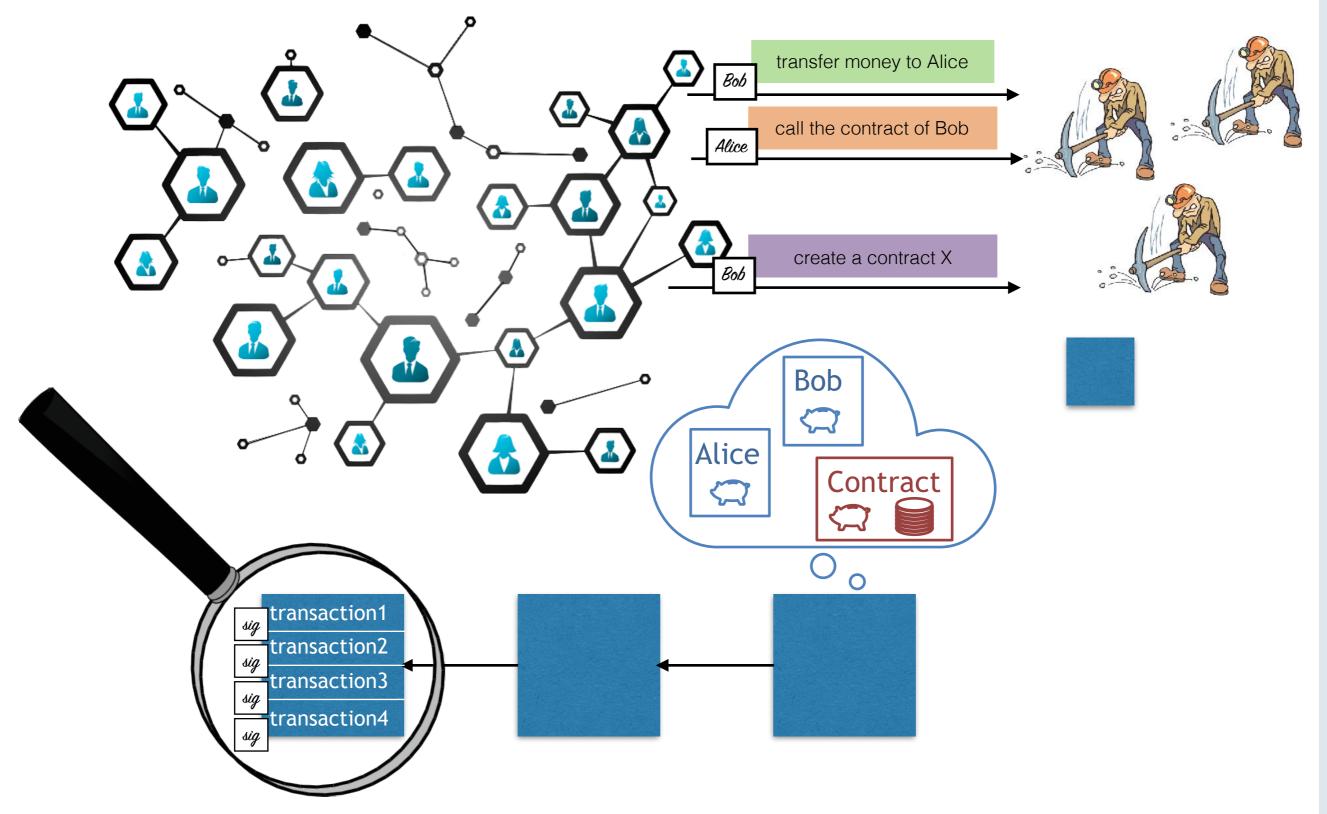


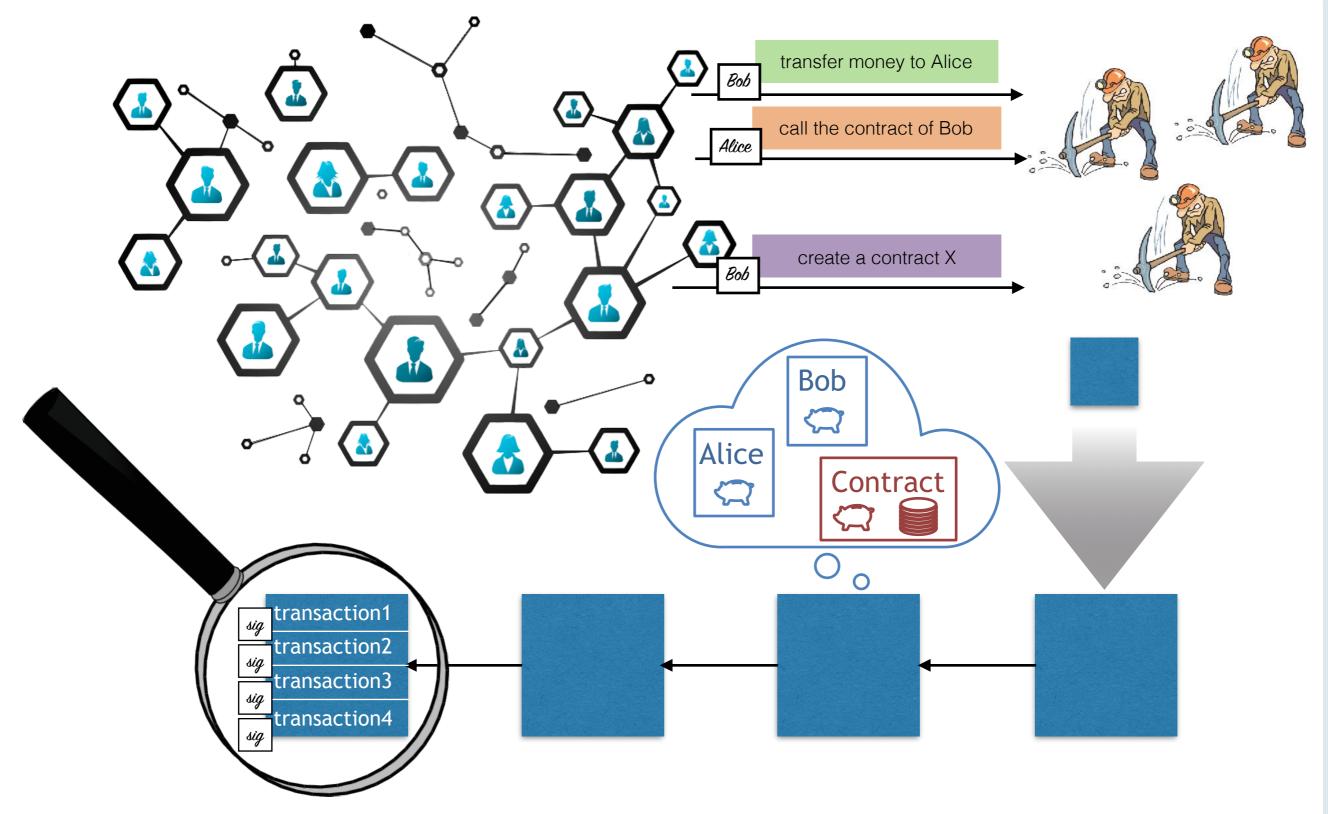


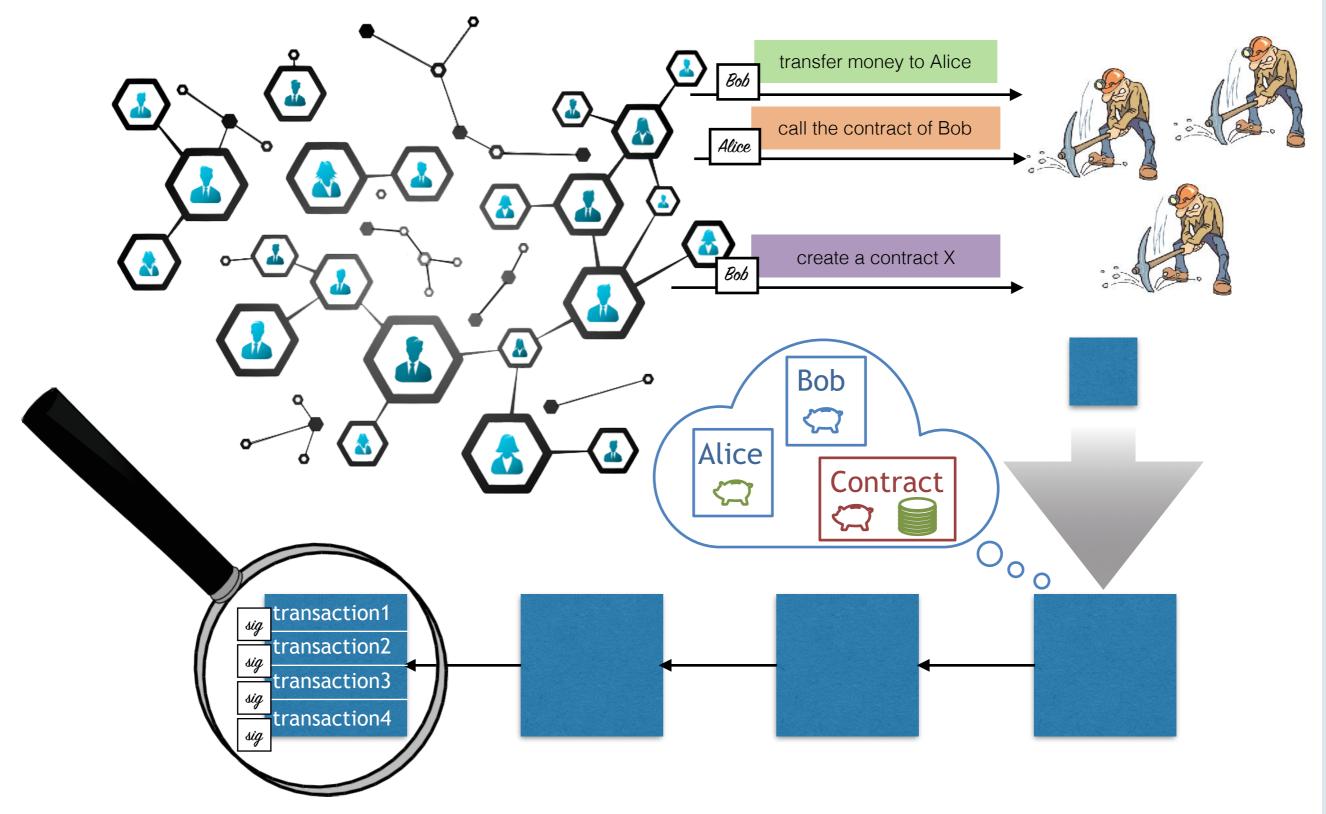












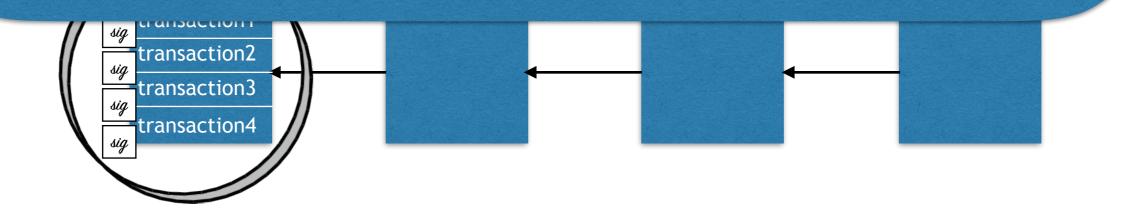
Exciting field for researchers and practitioners

Bob

transfer money to Alice

Three layer architecture: programs, consensus, network

All of that works by a fascinating combination of game theory, probabilistic consensus, cryptography, and *programming language semantics*



BLOCKCHAIN

Blockchain-based Venture Capital Fund Hacked for \$60 Million

David Z. Morris Jun 18, 2016



The nature of the hack was outlined in an open letter claiming to be from the attacker, posted to Pastebin this morning. In part, it reads:

BLOCKCHAIN

Blockchain-based Venture Capital Fund Hacked for \$60 Million

David Z. Morris Jun 18, 2016

coindesk Blockchain 101

hain 101 Technology Markets Business Data & Research Consensus

News emerge operating the had been rot currency, or DAO, which intended as a platform for

The nature o be from the a reads: Tickets are selling fast. Register for Consensus today!

Parity Team Publishes Postmortem on \$160 Million Ether Freeze

Parity Multisig Hacked. Again

Yesterday, Parity Multisig Wallet was hacked again: <u>https://paritytech.io/blog/security-alert.html</u>

"This means that currently no funds can be moved out of the [ANY Parity] multisig wallets"

A lot of people/companies/ICOs are using Parity-generated multisig wallets. **About \$300M is frozen and (probably) lost forever.**

Disclaimer: I lost little money (about \$1000) but my friends lost about \$300K.

reads:

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reads:

A survey of attacks on Ethereum smart contracts

Nicola Atzei, Massimo Bartoletti, and Tiziana Cimoli

Università degli Studi di Cagliari, Cagliari, Italy {atzeinicola,bart,t.cimoli}@unica.it

Abstract. Smart contracts are computer programs that can be correctly executed by a network of mutually distrusting nodes, without the need of an external trusted authority. Since smart contracts handle and transfer assets of considerable value, besides their correct execution it is also crucial that their implementation is secure against attacks which aim at stealing or tampering the assets. We study this problem in Ethereum, the most well-known and used framework for smart contracts of ar. We analyse the security vulnerabilities of Ethereum smart contracts, providing a taxonomy of common programming pitfalls which may lead to vulnerabilities. We show a series of attacks which exploit these vulnerabilities, allowing an adversary to steal money or cause other damage.

1 Introduction

The success of Bitcoin, a decentralised cryptographic currency that reached a capitalisation of 10 billions of dollars since its launch in 2009, has raised considerable interest both in industry and in academia. Industries — as well as national governments [48,55] — are attracted by the "disruptive" potential of the *blockchain*, the underlying technology of cryptocurrencies. Basically, a blockchain is an append-only data structure maintained by the nodes of a peer-to-peer network. Cryptocurrencies use the blockchain as a public ledger where they record all the transfers of currency, in order to avoid double-spending of money.

Although Bitcoin is the most paradigmatic application of blockchain technologies, there are other applications far beyond cryptocurrencies: e.g., financial products and services, tracking the ownership of various kinds of properties, digital identity verification, voting, *etc.* A hot topic is how to leverage on blockchain technologies to implement *smart contracts* [34, 54]. Very abstractly, smart contracts are agreements between mutually distrusting participants, which are automatically enforced by the consensus mechanism of the blockchain — without relying on a trusted authority.

The most prominent framework for smart contracts is Ethereum [32], whose capitalisation has reached 1 billion dollars since its launch in July 2015^1 . In Ethereum, smart contracts are rendered as computer programs, written in a Turing-complete language. The consensus protocol of Ethereum, which specifies how the nodes of the peer-to-peer network extend the blockchain, has the goal

¹ https://coinmarketcap.com/currencies/ethereum

Parity Team Publishes Postmortem on \$160 Million Ether Freeze

Smart Contracts

- Typically written in Solidity (weird JavaScript variant)
- New languages are emerging (weird Python variant)

```
contract SimpleStorage {
    uint storedData;
    function set(uint x) {
        storedData = x;
    }
    function get() constant returns (uint retVal) {
        return storedData;
    }
}
```

• Uploaded on the blockchain as EVM bytecode

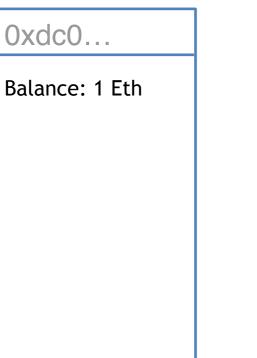
PUSH1 0x01
PUSH1 0x60
MSTORE
PUSH1 0x20
PUSH1 0x40
PUSH1 0x01
PUSH1 0x60
PUSH1 0x00
PUSH32 0x0318247CB34f134f3cF49E97647227dc2D75Abe8
GAS
CALL

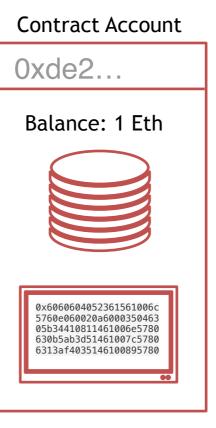
External Account

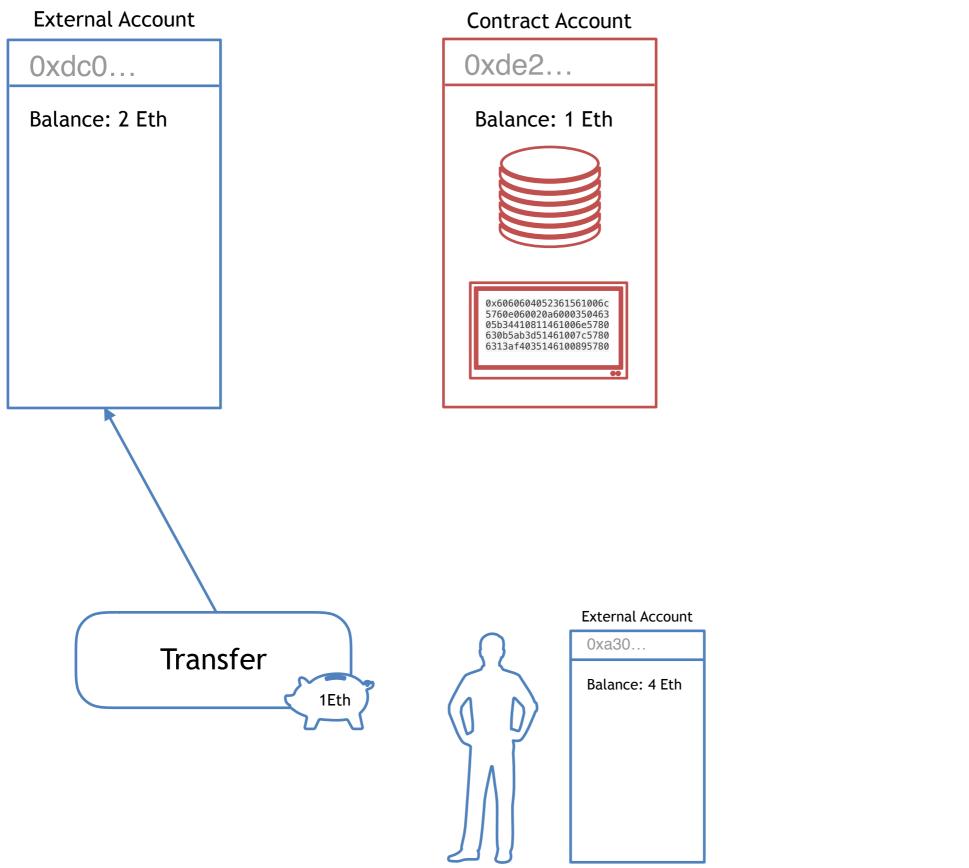
0xdc0...

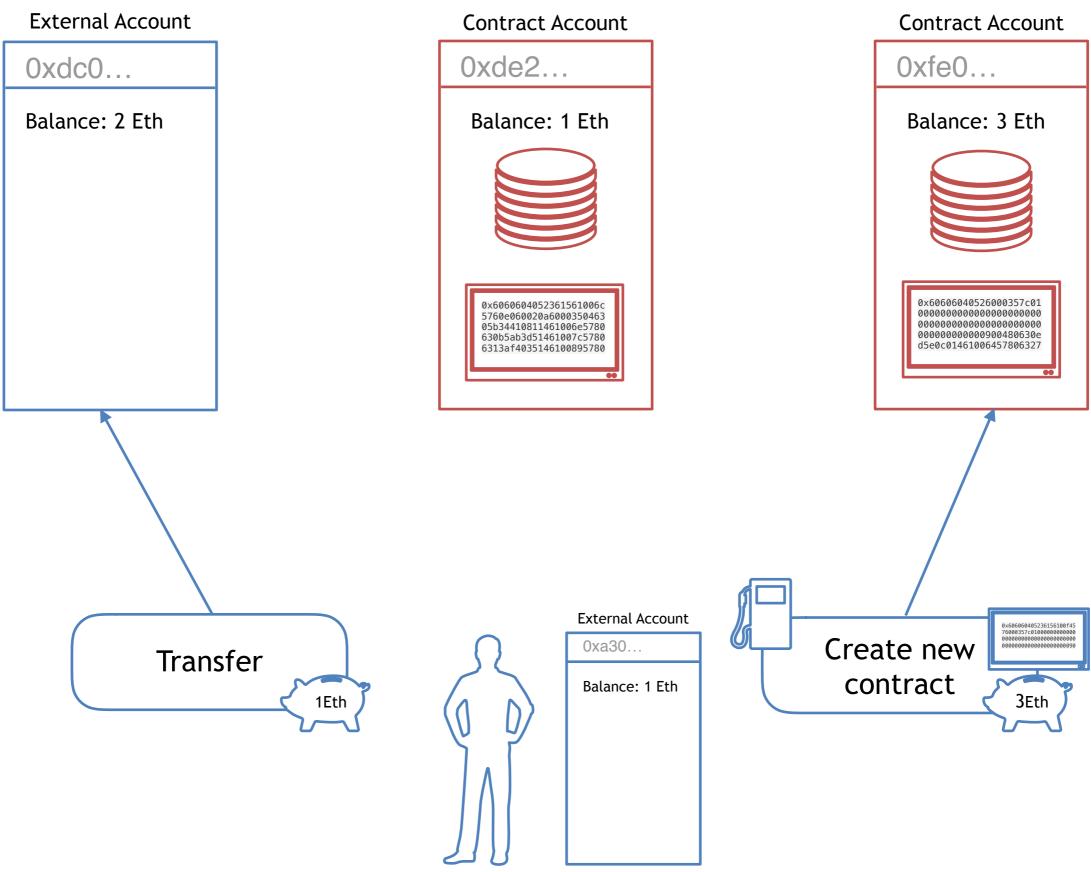
Balance: 1 Eth

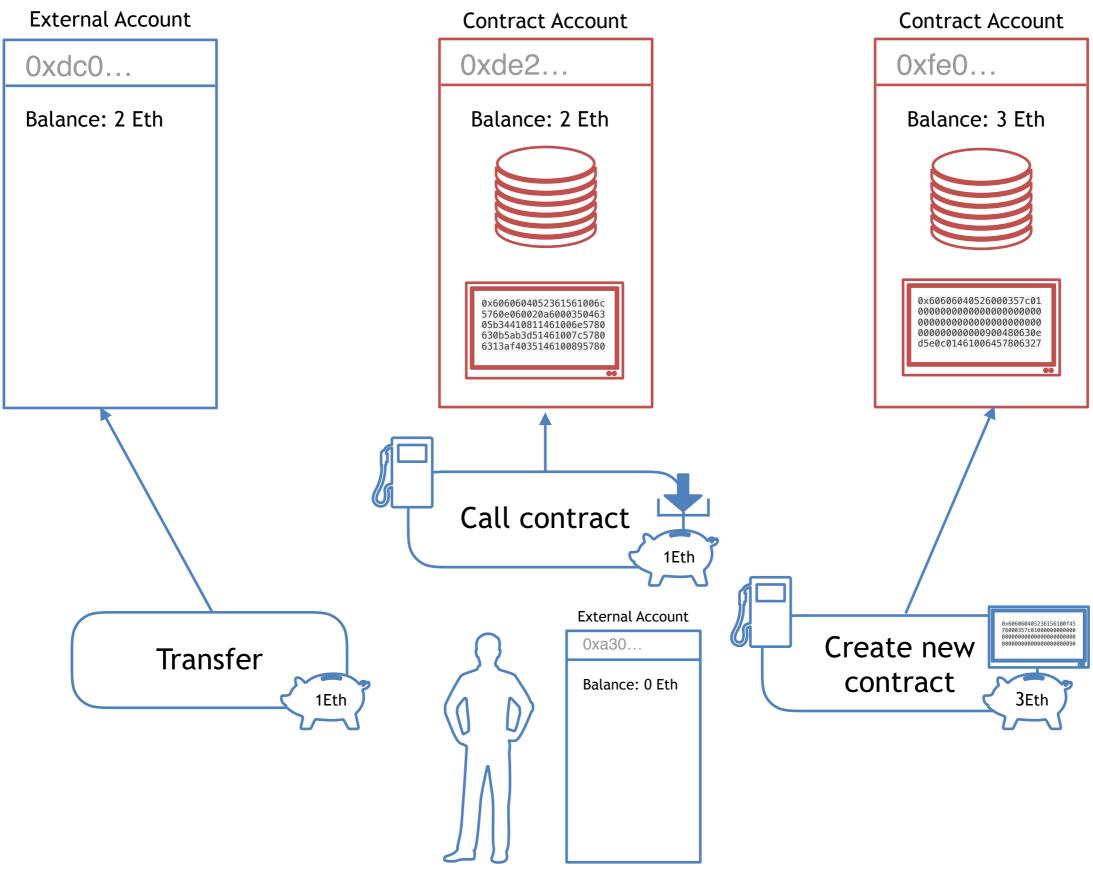
External Account

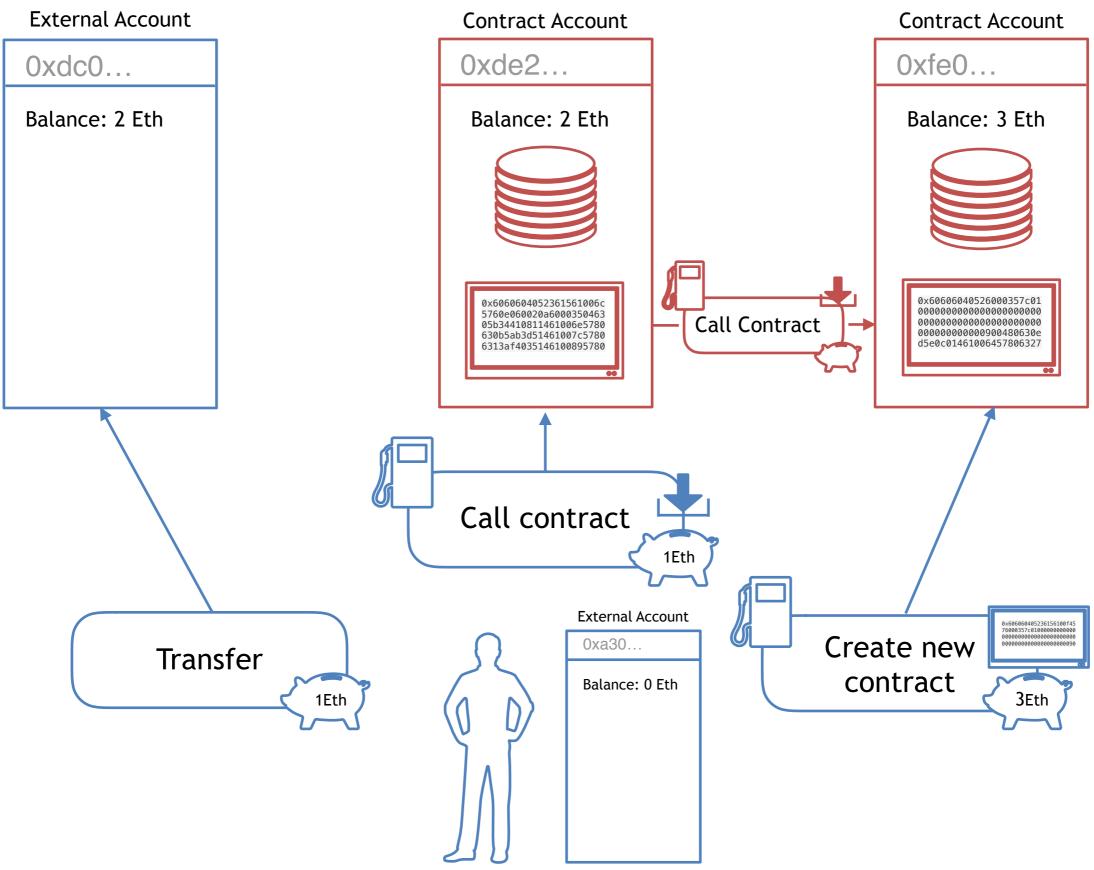


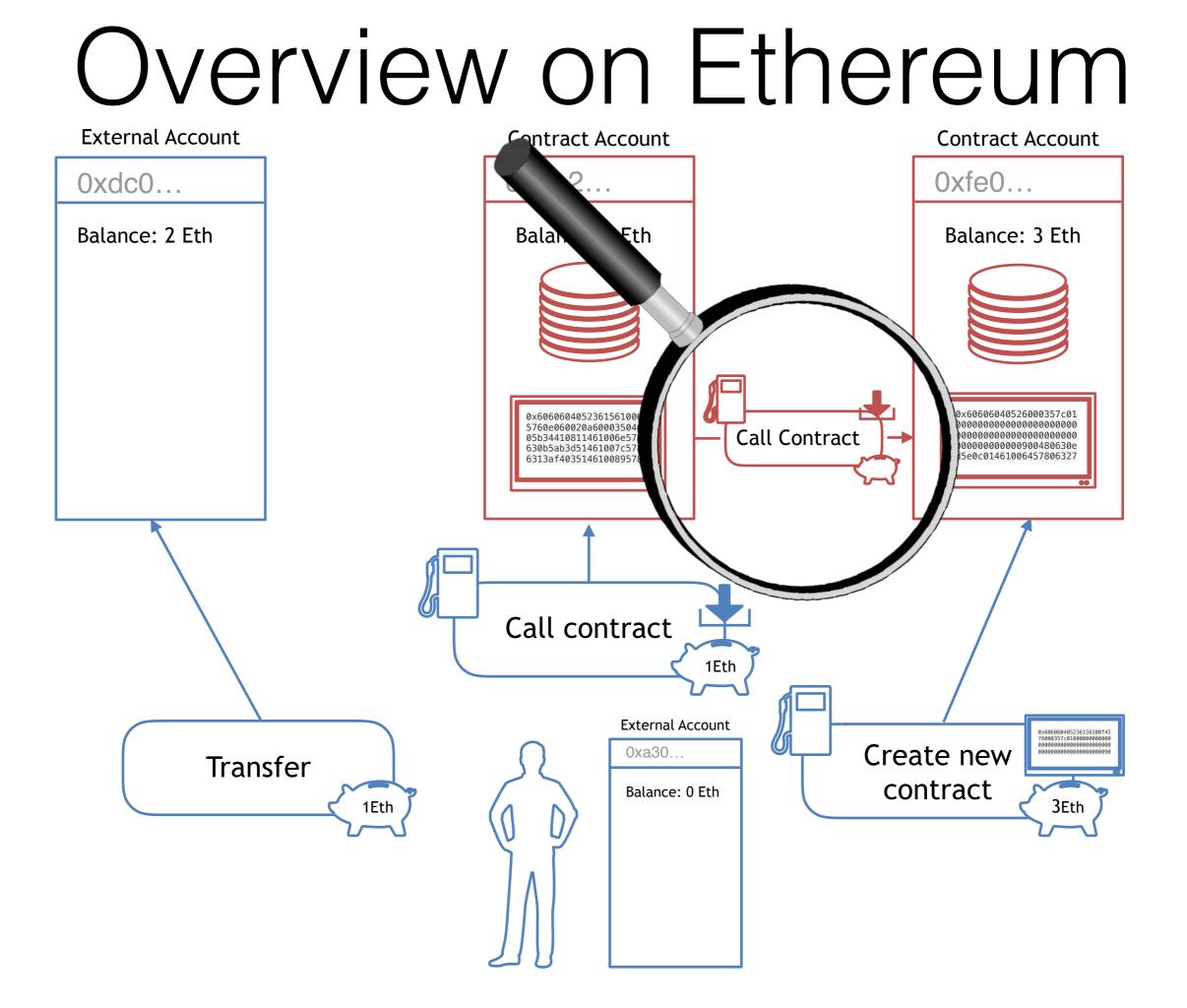


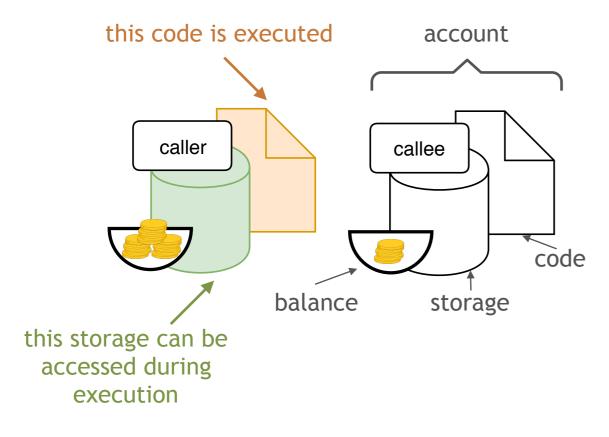


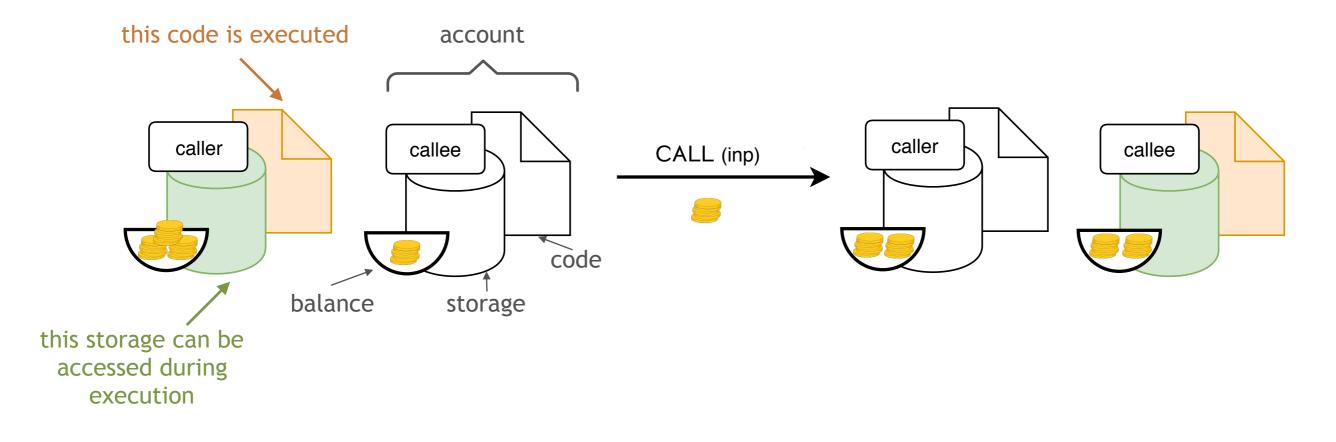


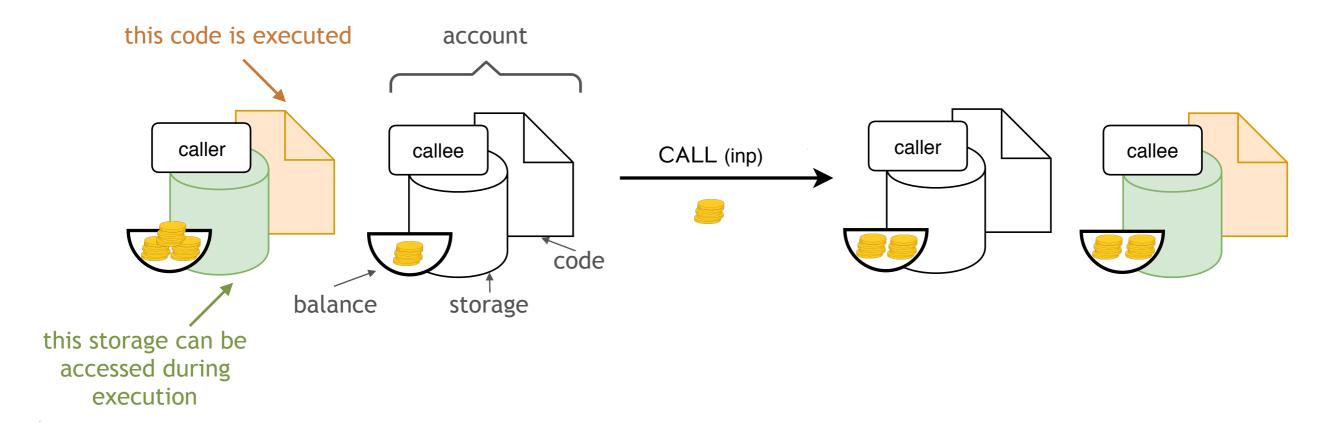


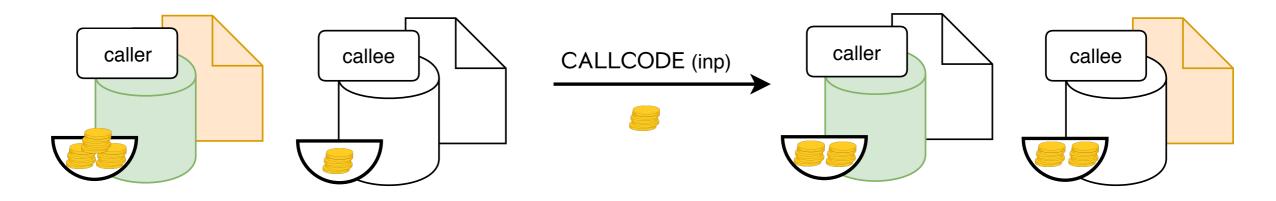


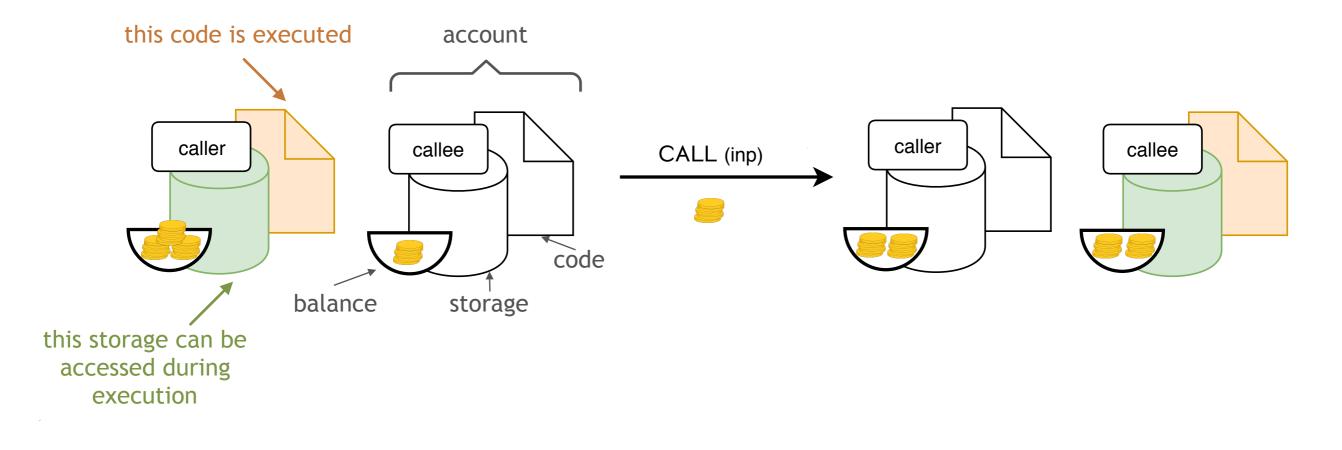


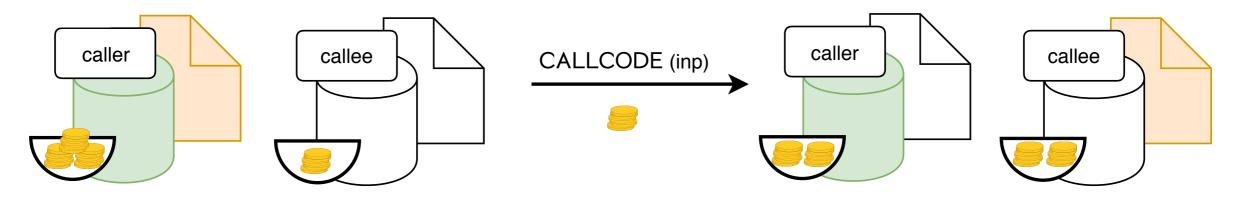








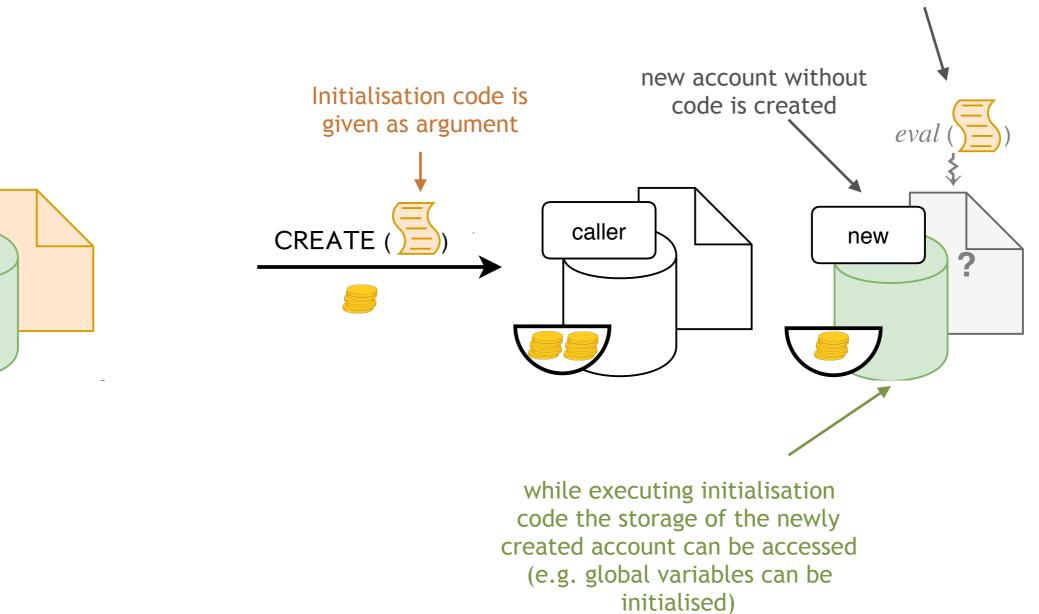




Callee's code can modify the state of the caller!

Contract creation

Upon successful execution, the initialisation code returns as output a code that will be (from that point on) attached to the new account



caller

Outline

Introduction to Ethereum

Semantics of EVM bytecode

Static Analysis of EVM bytecode

We go for a slightly simplified setting (Only plain calls, simplified gas treatment, etc.)

Full treatment in...

A Semantic Framework for the Security Analysis of **Ethereum smart contracts**

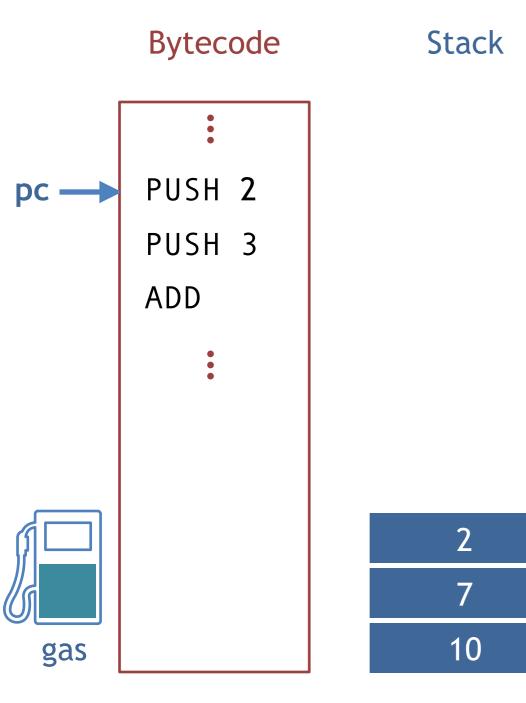
Best paper award at ETAPS'18 Ilya Grishchenko, Matteo Maffei, and Clara Schneidewind

TU Wien {ilya.grishchenko,matteo.maffei,clara.schneidewi

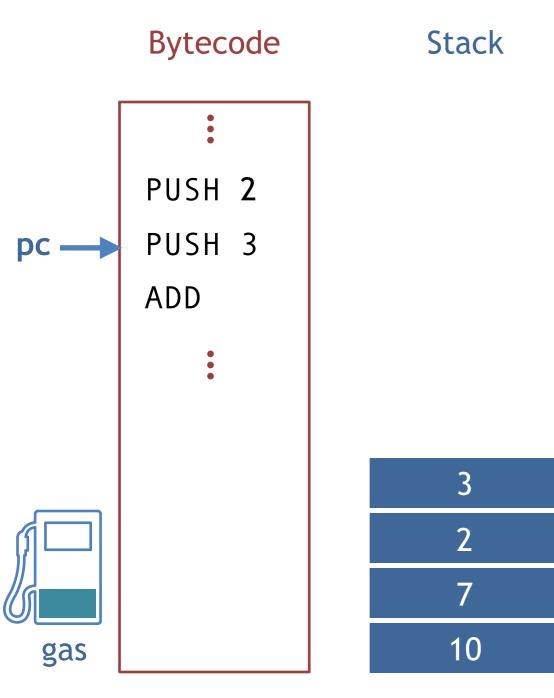
EVM Semantics Formalization

- First complete formalization of EVM bytecode semantics, in the F* proof assistant
- Executable semantics by compilation into OCAML
- Tested against the official Ethereum test suite
- While formalizing, we spotted various bugs and imprecisions in previous (in)formal descriptions, including those used in state-of-the-art static analysers (e.g., Oyente)

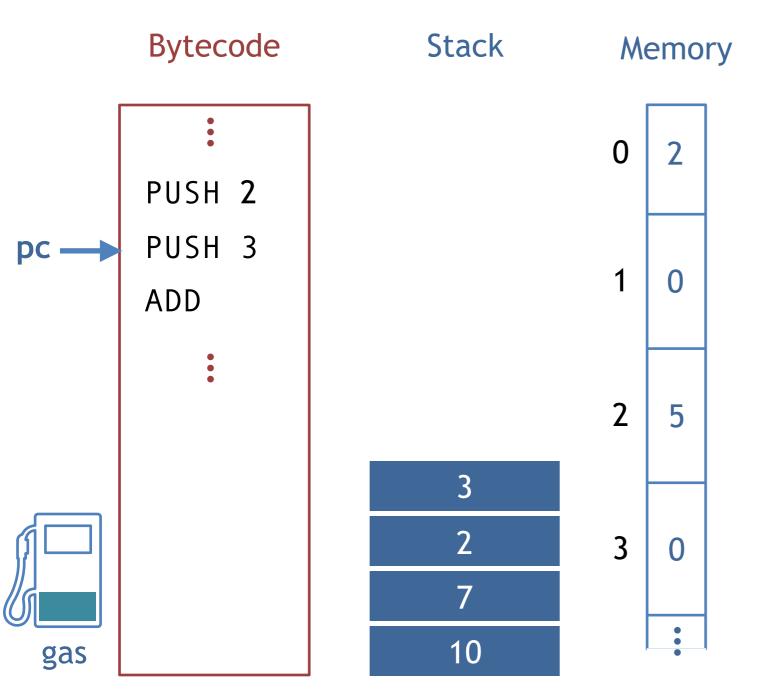
EVM - Layout



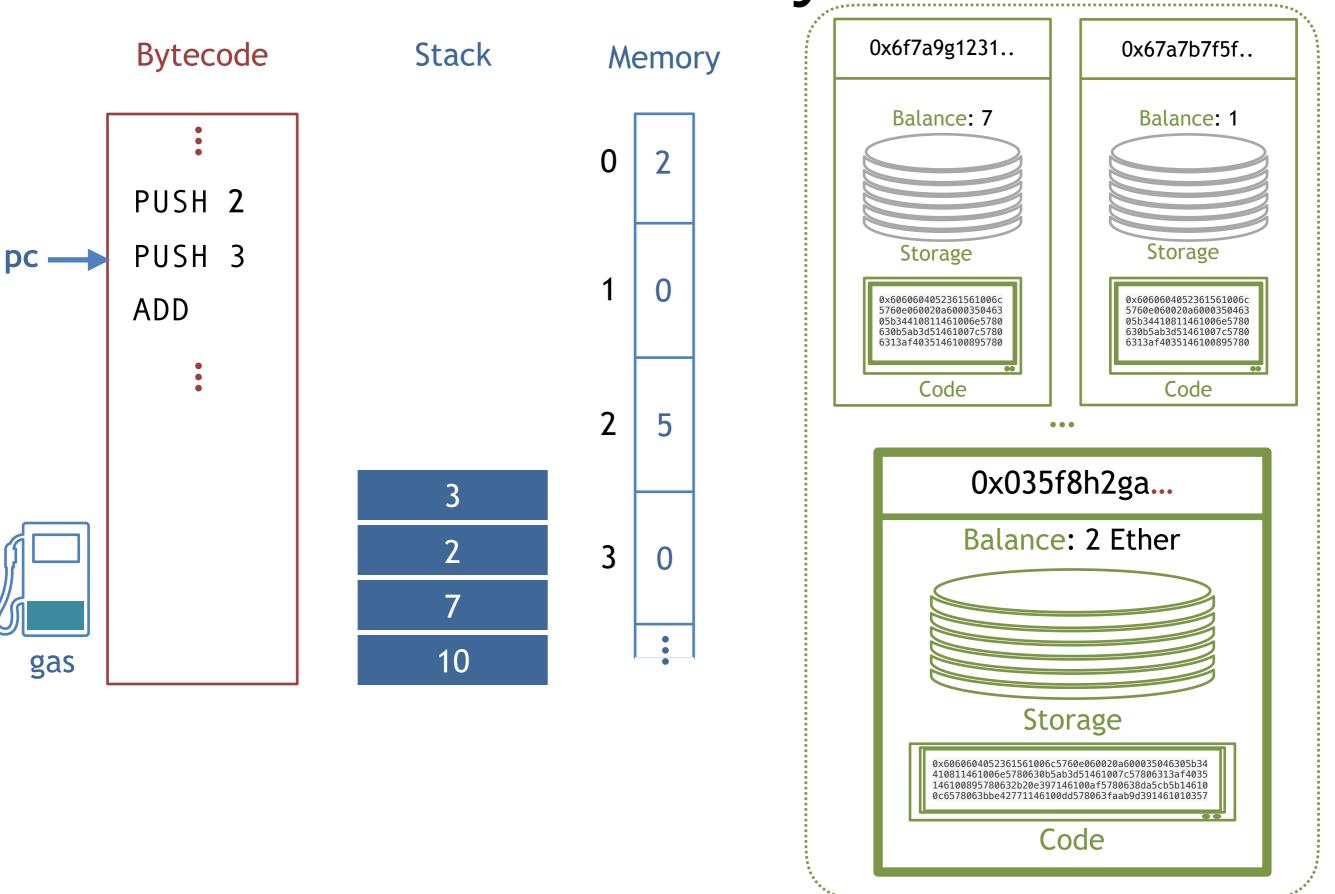
EVM - Layout



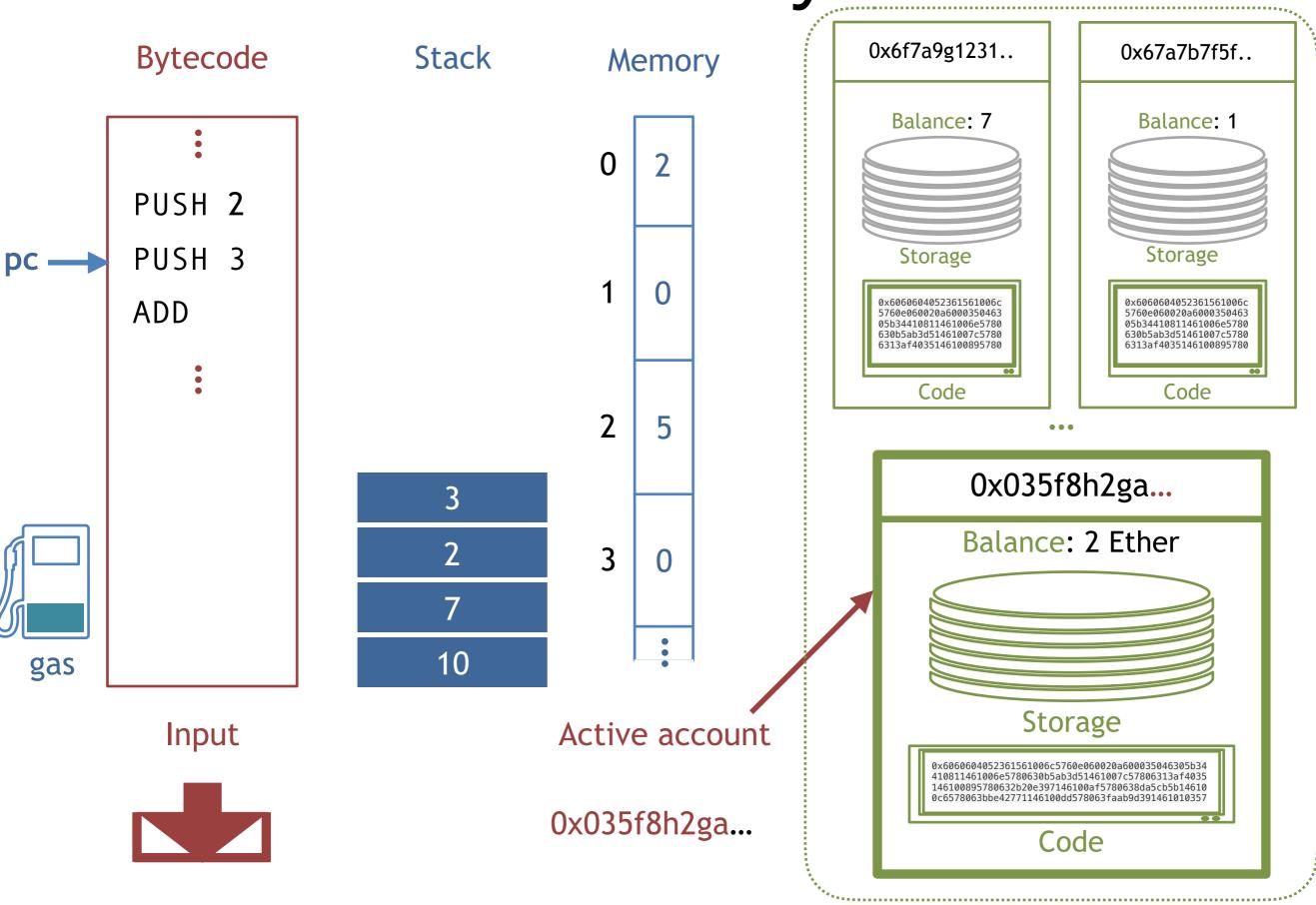
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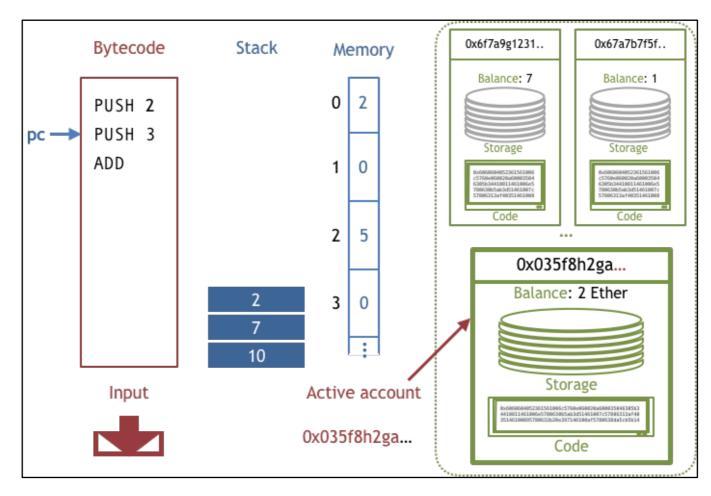
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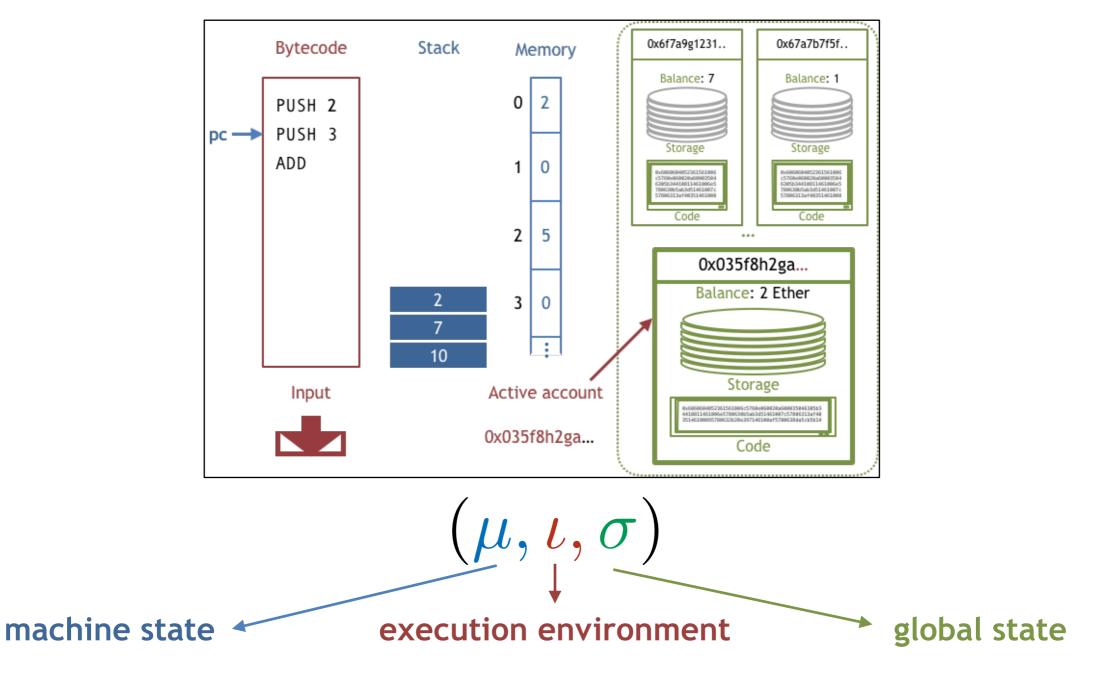
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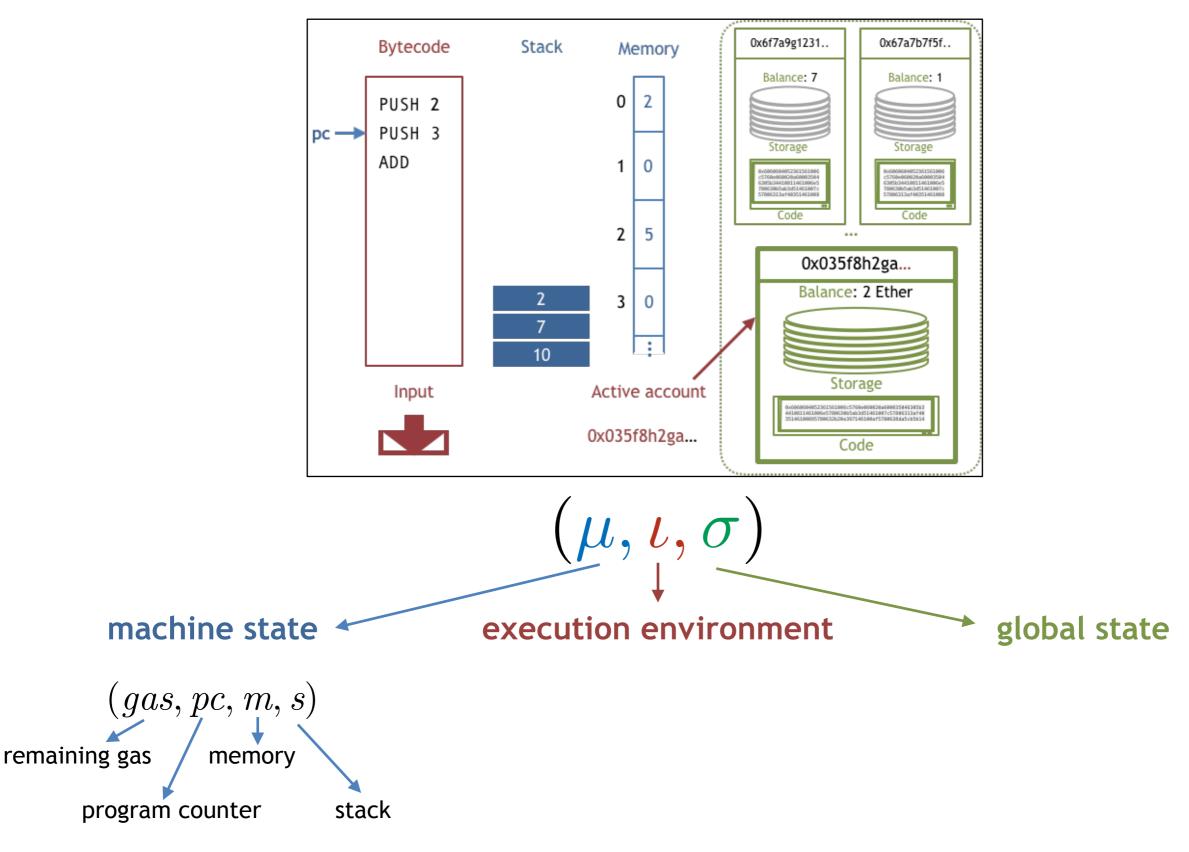
Execution states



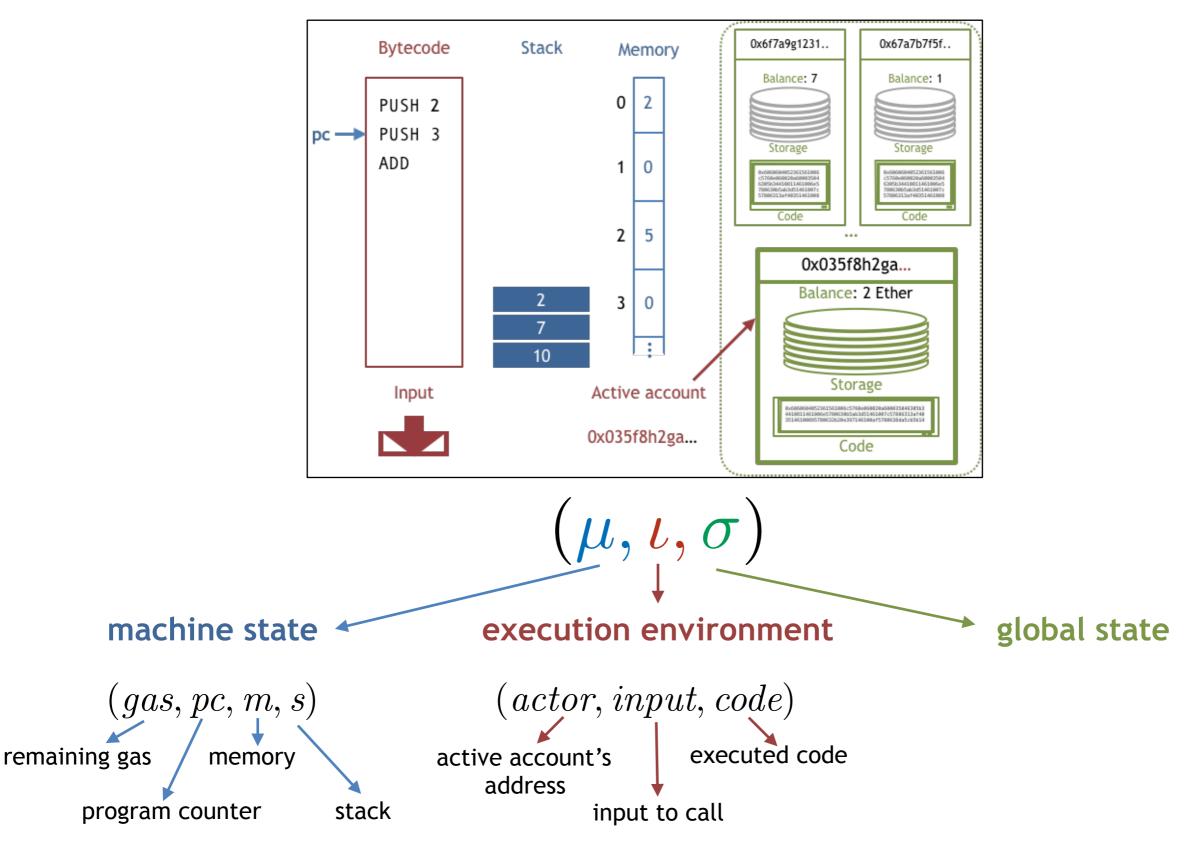
Execution states



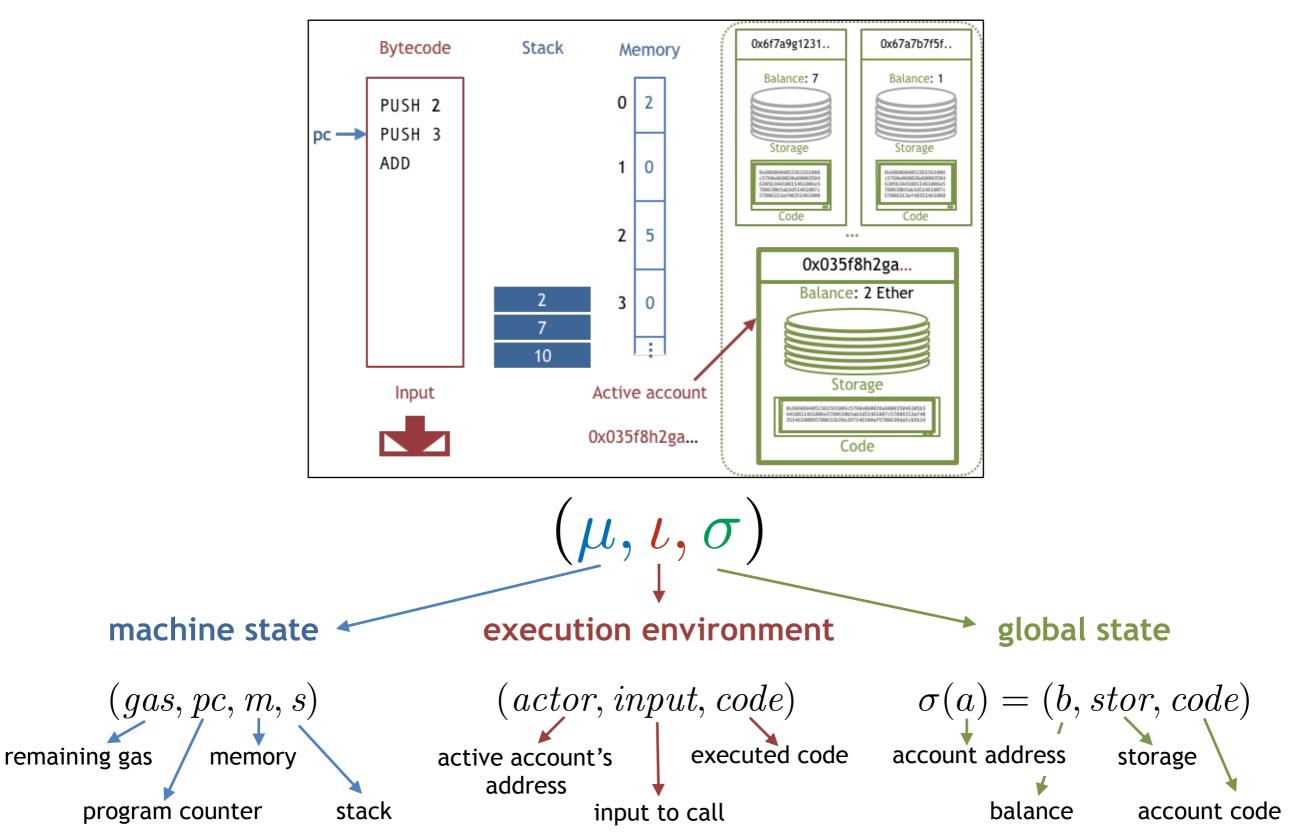
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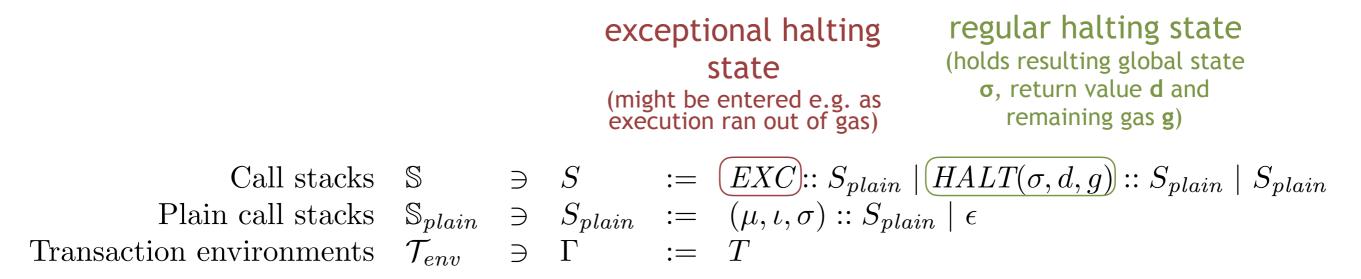


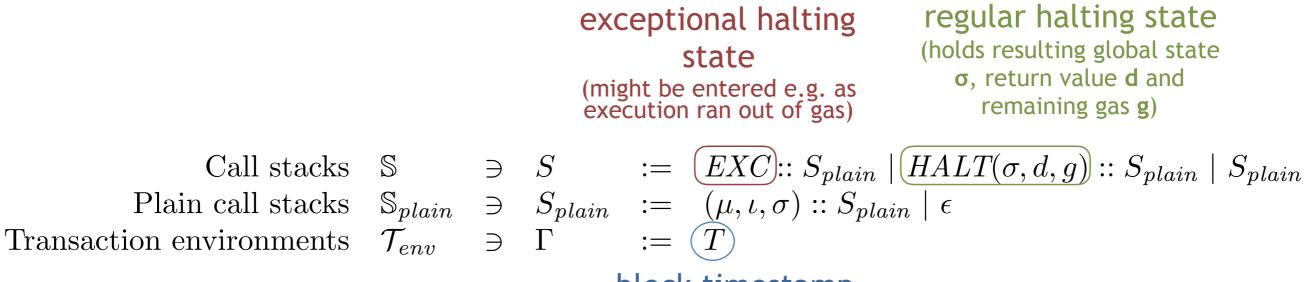
Call stacks $S \ni S := EXC :: S_{plain} | HALT(\sigma, d, g) :: S_{plain} | S_{plain}$ Plain call stacks $S_{plain} \ni S_{plain} := (\mu, \iota, \sigma) :: S_{plain} | \epsilon$ Transaction environments $\mathcal{T}_{env} \ni \Gamma := T$

exceptional halting state

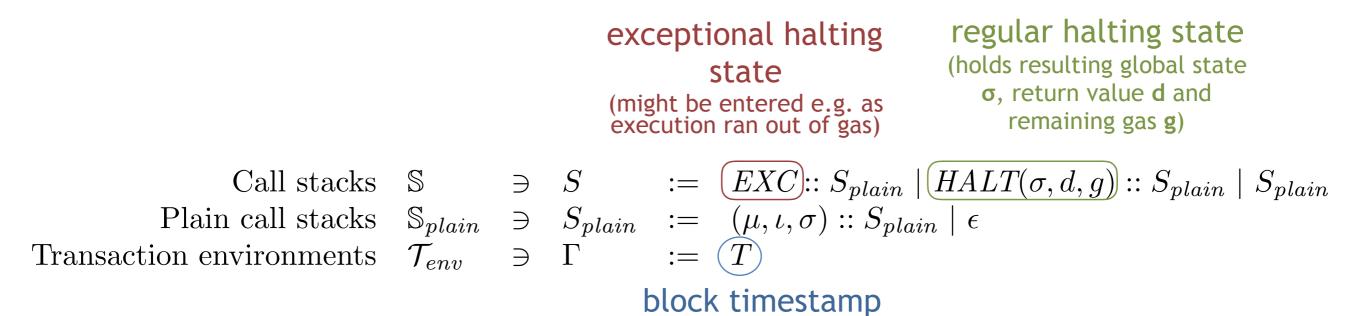
(might be entered e.g. as execution ran out of gas)

Call stacks $S \ni S := EXC:: S_{plain} | HALT(\sigma, d, g) :: S_{plain} | S_{plain}$ Plain call stacks $S_{plain} \ni S_{plain} := (\mu, \iota, \sigma) :: S_{plain} | \epsilon$ Transaction environments $\mathcal{T}_{env} \ni \Gamma := T$





block timestamp



Small step relation

$$\Gamma \vDash S \to S'$$

describes how a call stack S evolves within one step of execution under transaction environment Γ

• Arithmetic, Logical & Comparison instructions: ADD, MUL, LEQ, NOT, AND, OR

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- Environment access
 (global state + execution environment + transaction environment)
 BALANCE, TIMESTAMP, INPUT, ADDRESS

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 CALL

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 BALANCE, TIMESTAMP, INPUT, ADDRESS
- Contract Calls:
 CALL
- Halting: RETURN, STOP

Simple stack operations

The instruction at μ.pc of code ι.code is ADD

$$\mu$$
.gas $>= 1$

$$\Gamma \vDash (\mu, \iota, \sigma) :: S \to (\mu', \iota, \sigma) :: S$$

preconditions are checked: enough gas available + enough element on the stack

machine state is updated

Simple stack operations

$$\mu$$
.gas $>= 1$

$$\begin{array}{c} \mu.\mathsf{s} = a :: b :: s \end{array} \stackrel{(\omega_{\mu,\iota})}{\mu'} = \mathsf{ADD} \\ \mu' = \mu[\mathsf{s} \to (a+b) :: s][\mathsf{pc} += 1][\mathsf{gas} -= 1] \\ \Gamma \vDash (\mu,\iota,\sigma) :: S \to (\mu',\iota,\sigma) :: S \end{array}$$

preconditions are checked: enough gas available + enough element on the stack

machine state is updated

$$\frac{\omega_{\mu,\iota} = \mathsf{ADD} \quad |\mu.\mathsf{s}| < 2}{\Gamma \vDash (\mu,\iota,\sigma) :: S \rightarrow EXC :: S}$$

in case of a stack underflow the execution halts exceptionally

Simple stack operations

$$\mu$$
.gas $>= 1$

$$\Gamma \vDash (\mu, \iota, \sigma) :: S \to (\mu', \iota, \sigma) :: S$$

preconditions are checked: enough gas available + enough element on the stack

machine state is updated

$$\frac{\omega_{\mu,\iota} = \mathsf{ADD} \quad |\mu.\mathsf{s}| < 2}{\Gamma \vDash (\mu,\iota,\sigma) :: S \rightarrow EXC :: S}$$

in case of a stack underflow the execution halts exceptionally

$$\underbrace{\mu.\mathsf{gas} < 1}{\Gamma \vDash (\mu, \iota, \sigma) :: S \to EXC :: S}$$

if the execution runs out of gas, the execution halts exceptionally (holds for all instructions)

Memory Access

$$\begin{array}{l} \text{value on memory} \\ \text{address a is written to} \\ \text{the stack} \\ \omega_{\mu,\iota} = \mathsf{MLOAD} \quad \mu.\mathsf{gas} >= 1 \qquad \mu.\mathsf{s} = a :: s \\ \underline{v = \mu.\mathsf{m}[a]} \quad \mu' = \mu[\mathsf{s} \rightarrow v :: s][\mathsf{pc} += 1][\mathsf{gas} -= 1] \\ \hline \Gamma \vDash (\mu,\iota,\sigma) :: S \rightarrow (\mu',\iota,\sigma) :: S \end{array}$$

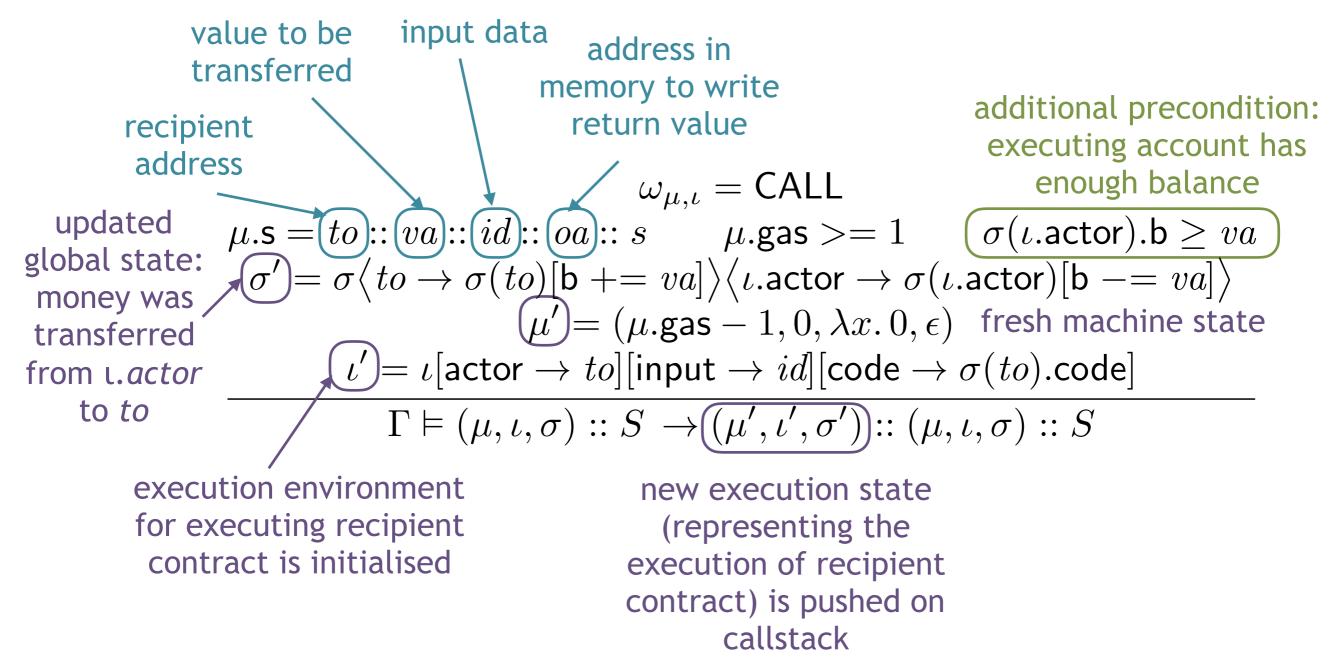
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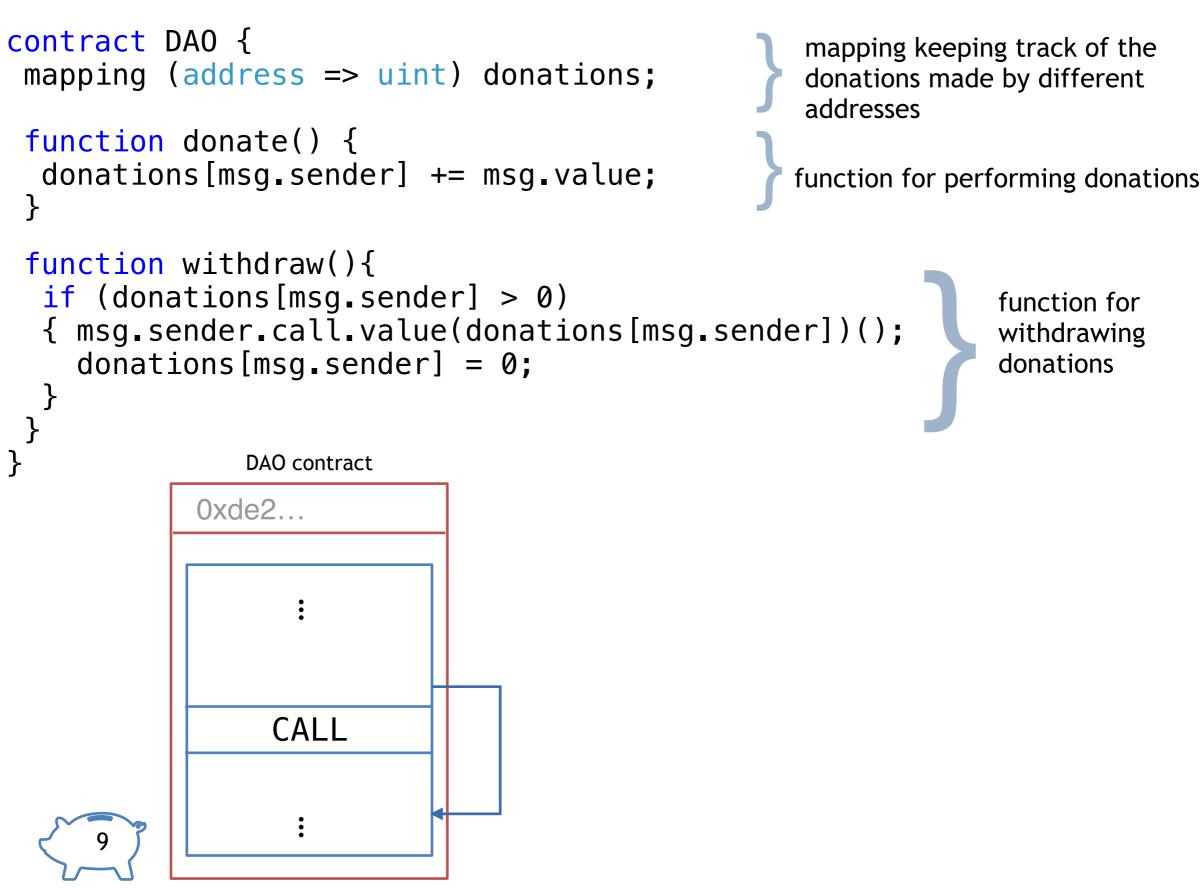
value b is written to memory address a

$$\begin{split} & \omega_{\mu,\iota} = \mathsf{MSTORE} \quad \bigvee \mu.\mathsf{s} = a :: b :: s \qquad \mu.\mathsf{gas} >= 1 \\ & \mu' = \mu[\mathsf{m} \to \mu.\mathsf{m}[a \to b]][\mathsf{s} \to s][\mathsf{pc} \mathrel{+}= 1][\mathsf{gas} \mathrel{-}= 1] \\ & \Gamma \vDash (\mu,\iota,\sigma) :: S \to (\mu',\iota,\sigma) :: S \end{split}$$

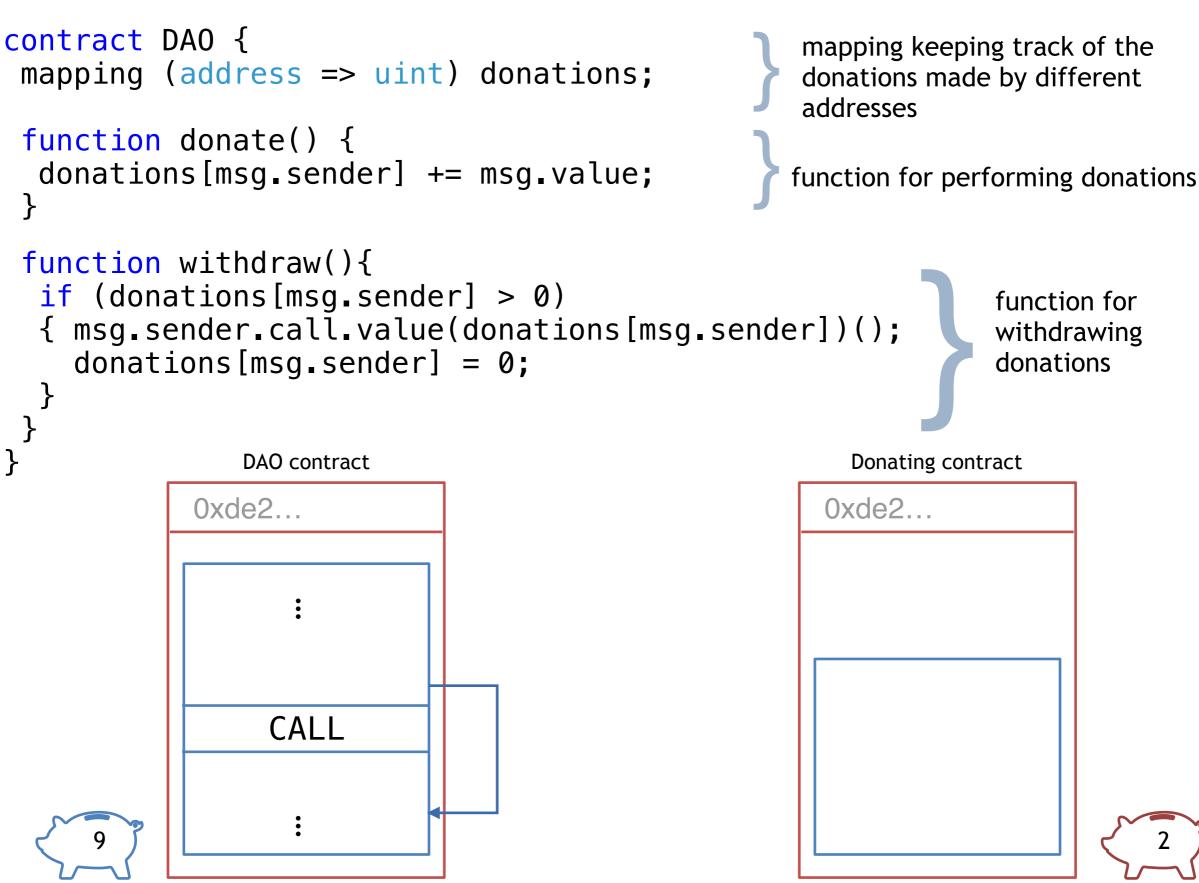
Calling

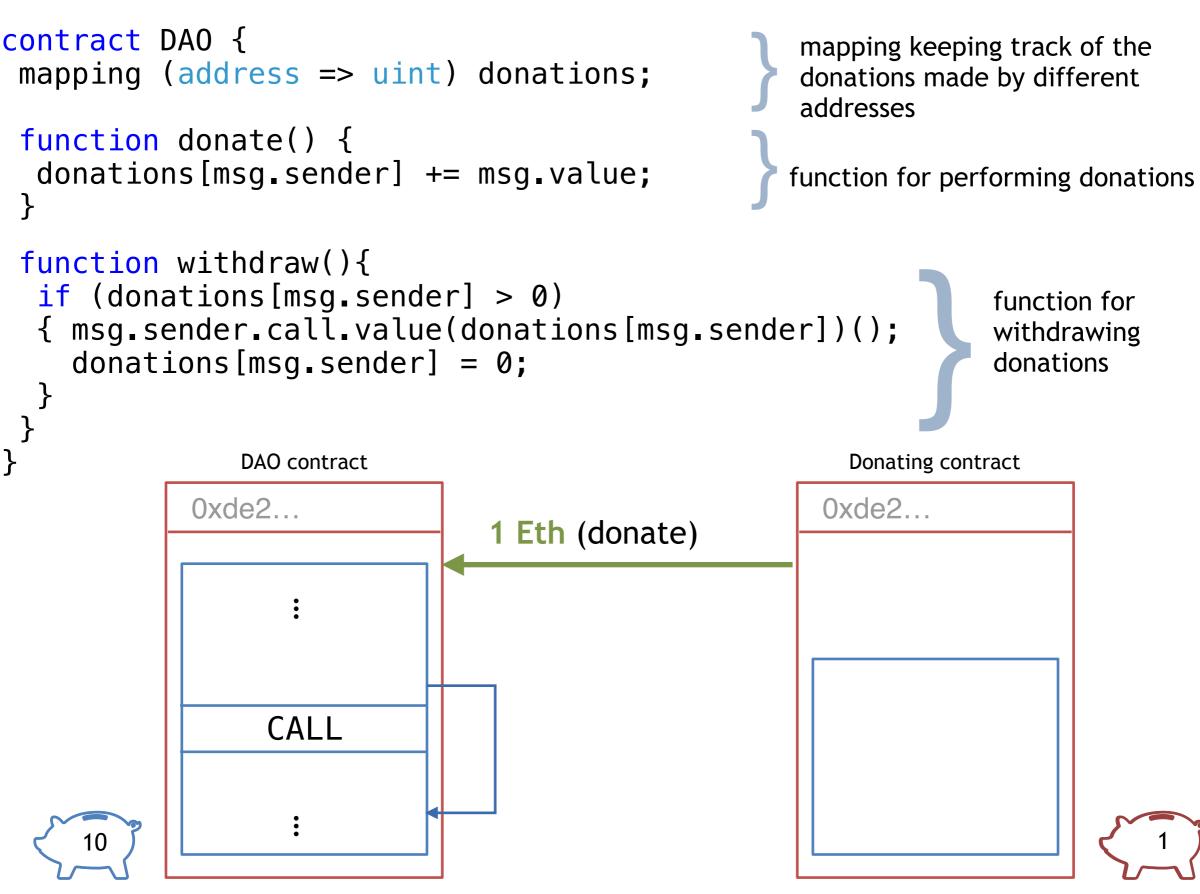


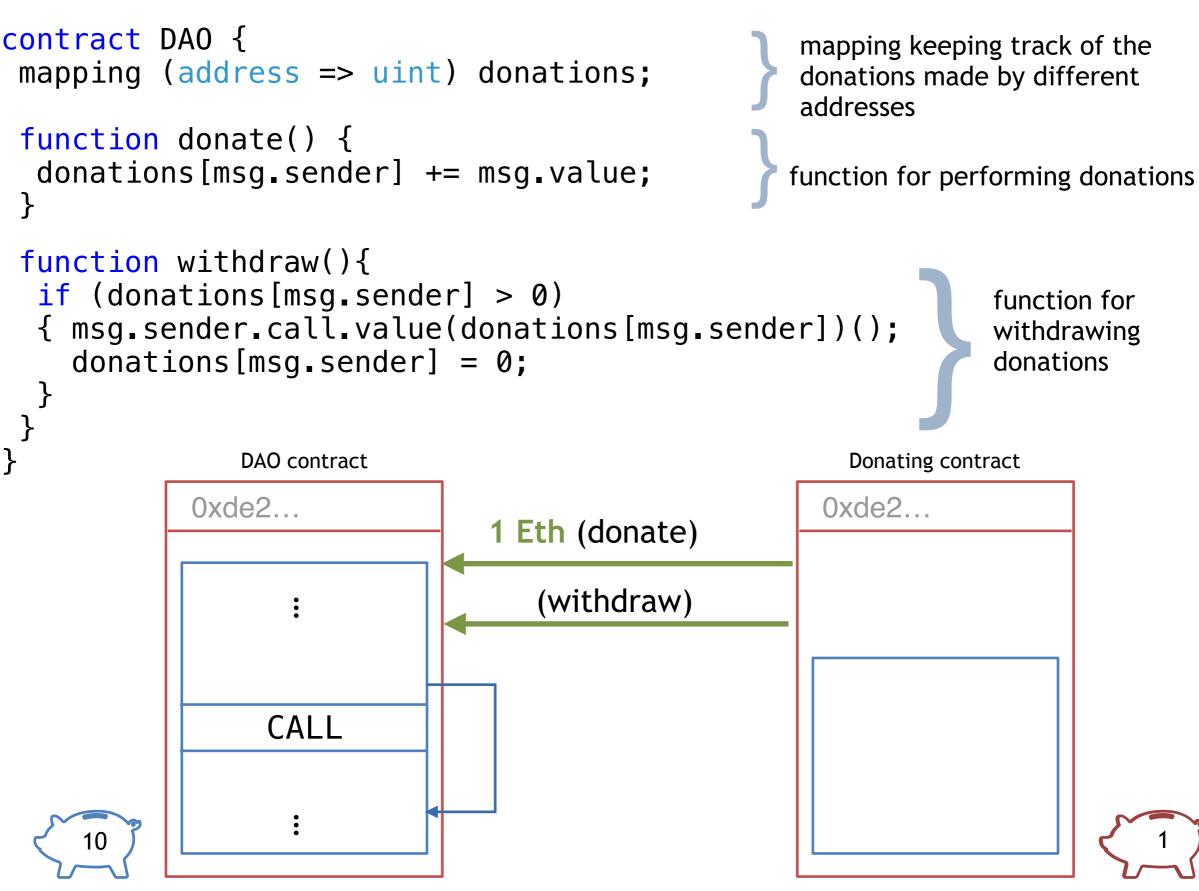
```
contract DA0 {
                                                   mapping keeping track of the
mapping (address => uint) donations;
                                                   donations made by different
                                                   addresses
 function donate() {
  donations[msg.sender] += msg.value;
                                                   function for performing donations
 }
 function withdraw(){
  if (donations[msg.sender] > 0)
                                                                function for
  { msg.sender.call.value(donations[msg.sender])();
                                                                withdrawing
    donations[msg.sender] = 0;
                                                                donations
```

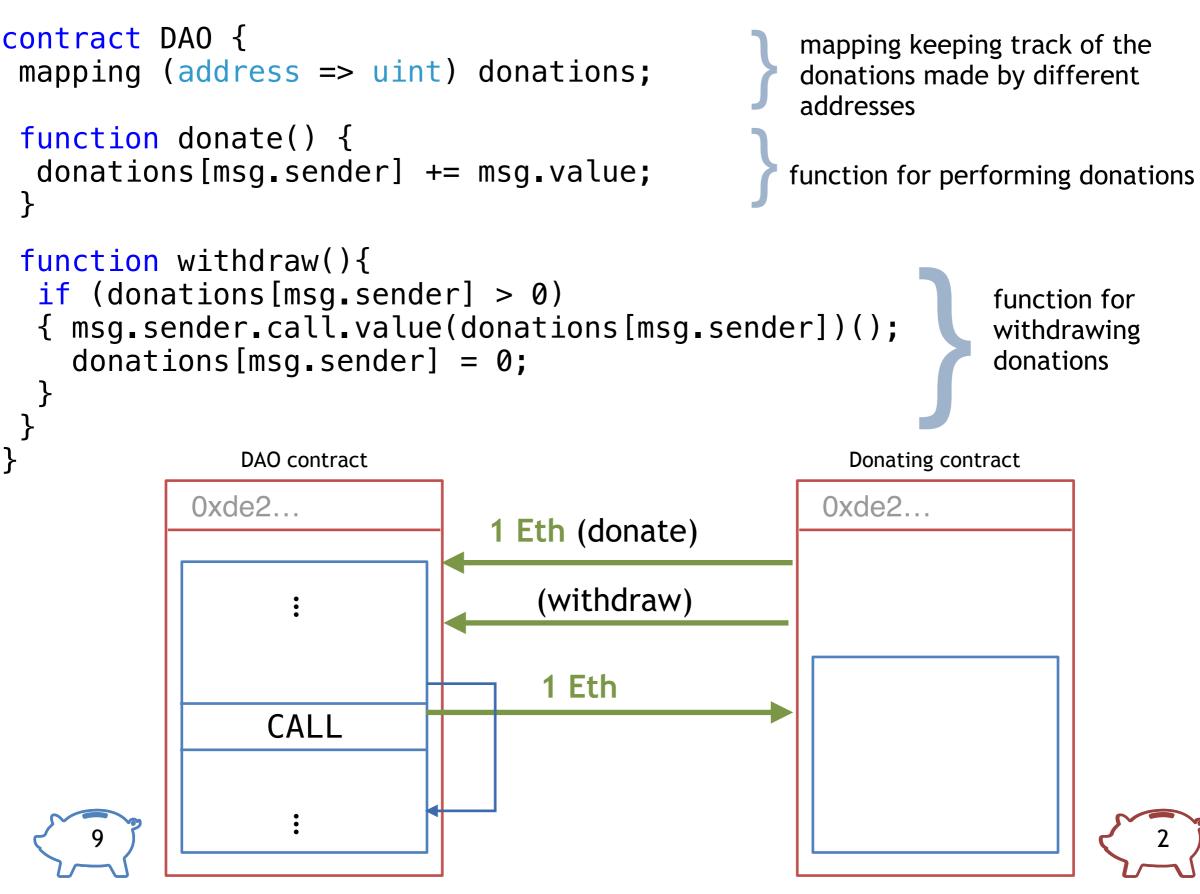


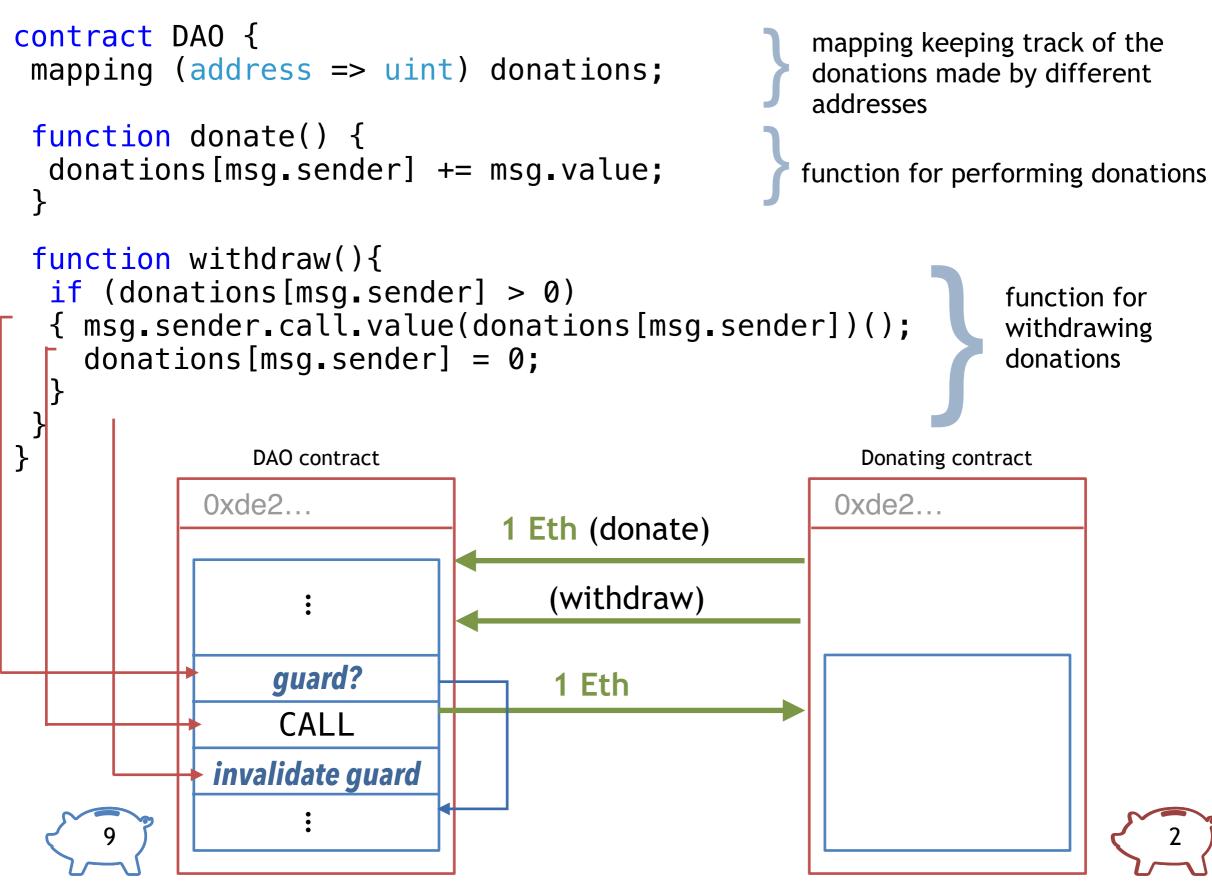






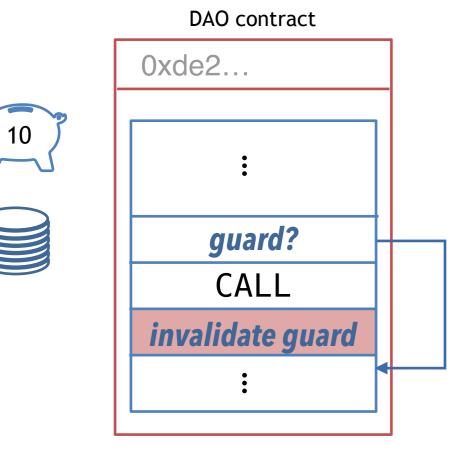






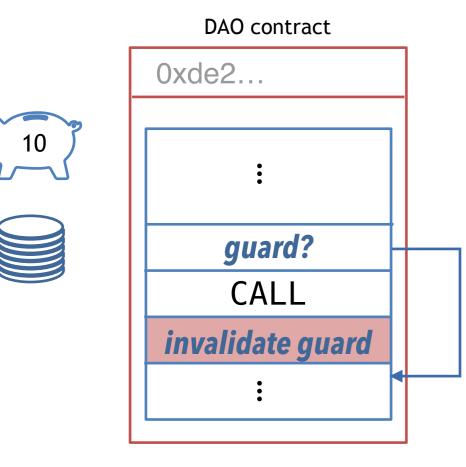
Attack on the DAO

```
contract DAO {
  mapping (address => uint) donations;
  function donate() {
    donations[msg.sender] += msg.value;
  }
  function withdraw(){
    if (donations[msg.sender] > 0)
    { msg.sender.call.value(donations[msg.sender])();
      donations[msg.sender] = 0;
  }
}
```



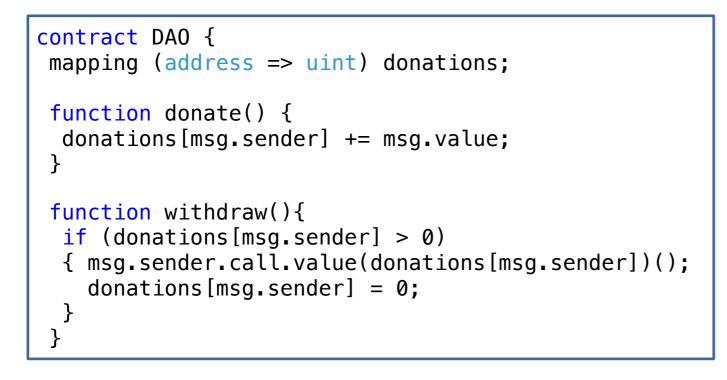
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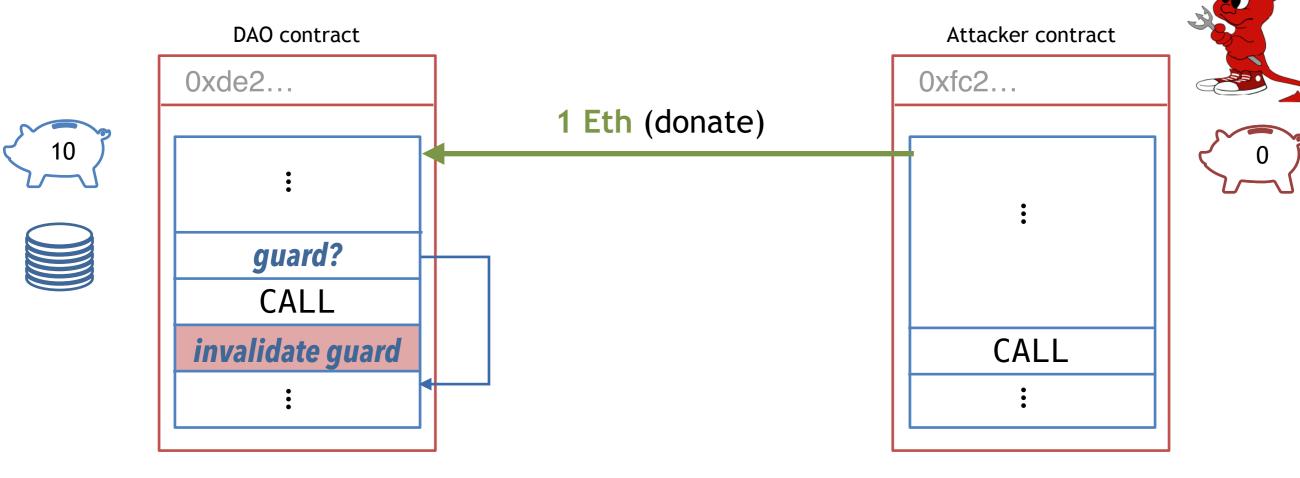
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```

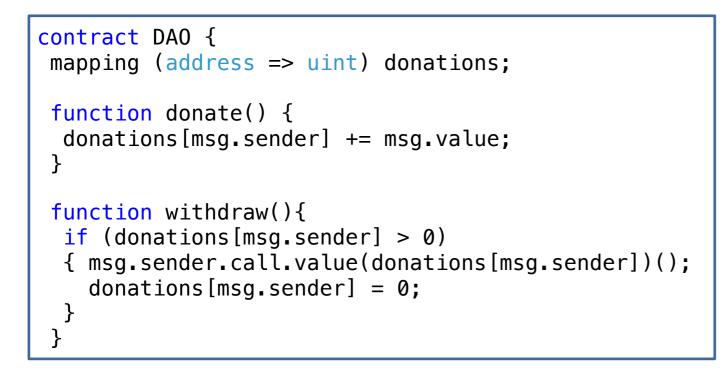


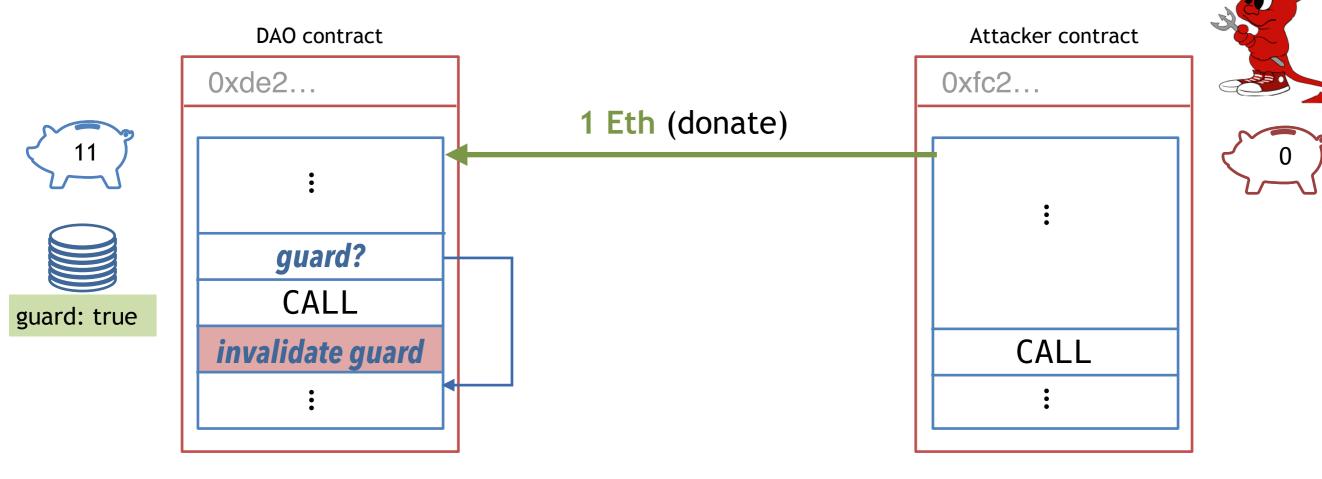
Attacker contract

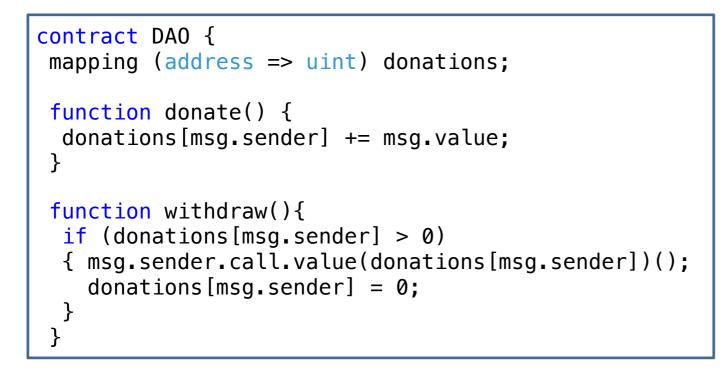


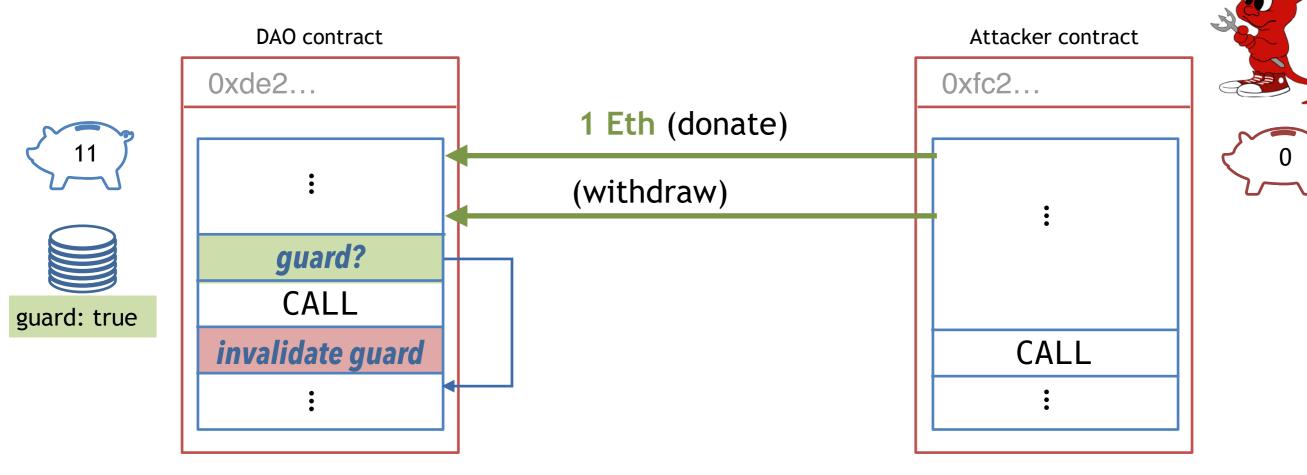


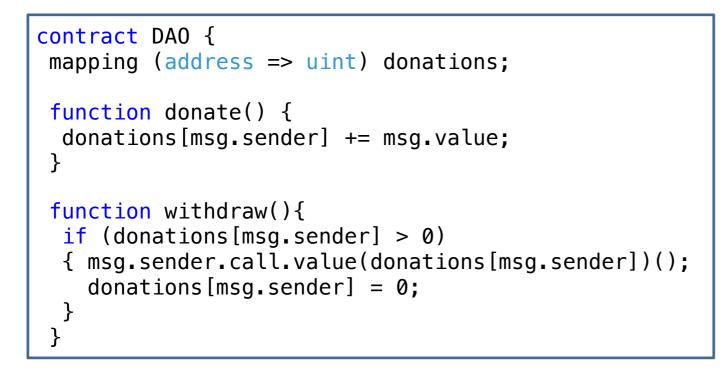


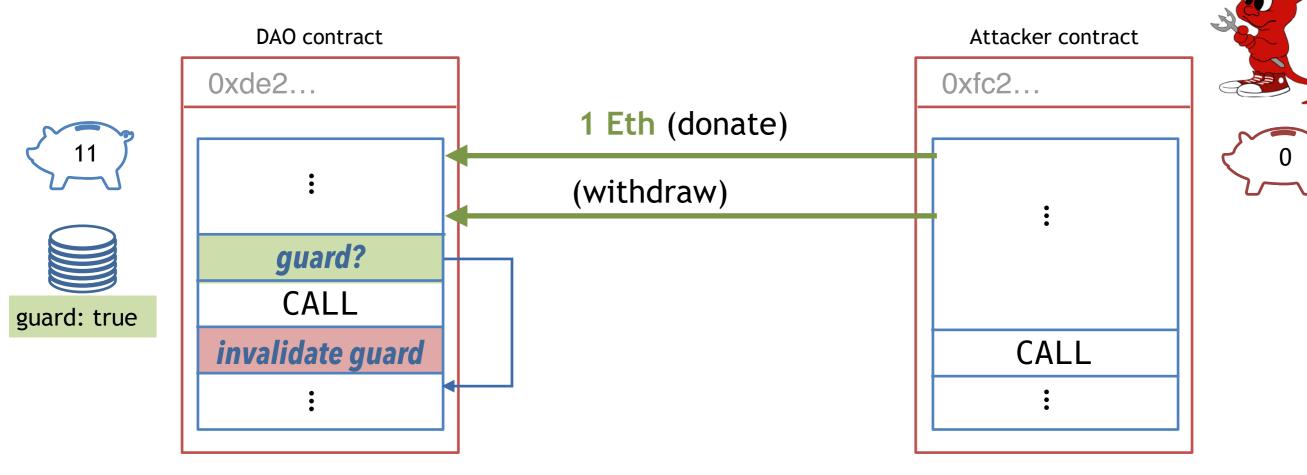


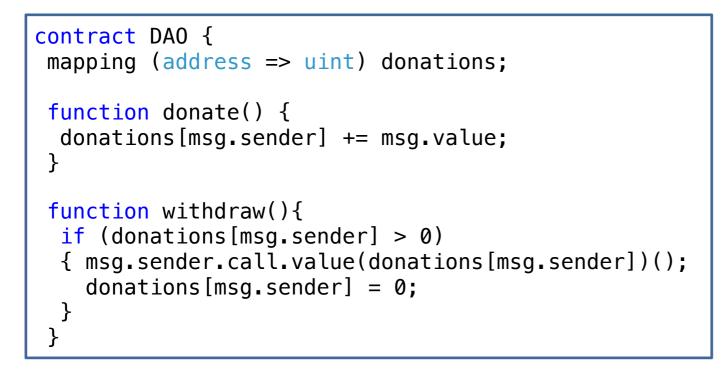


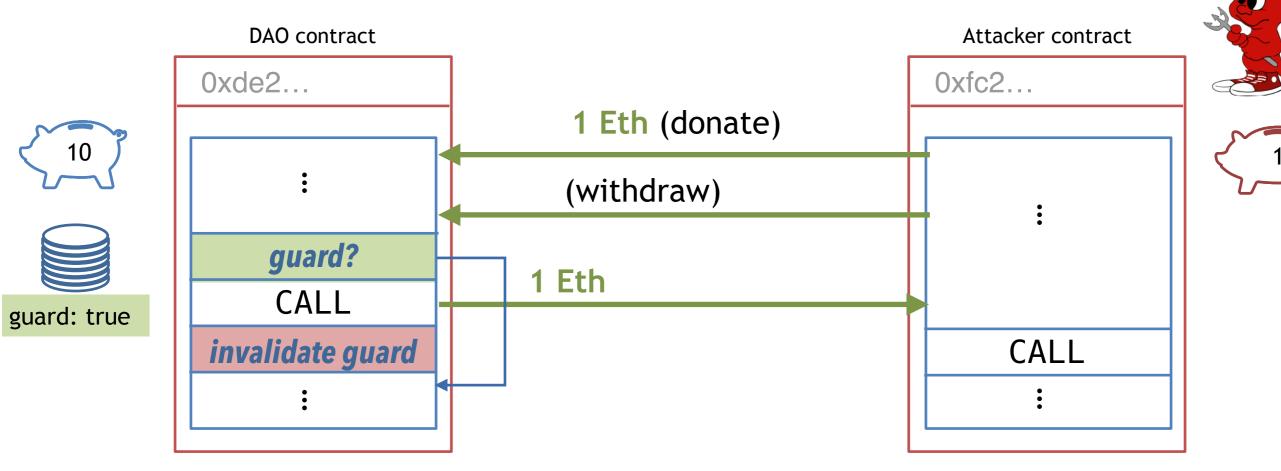


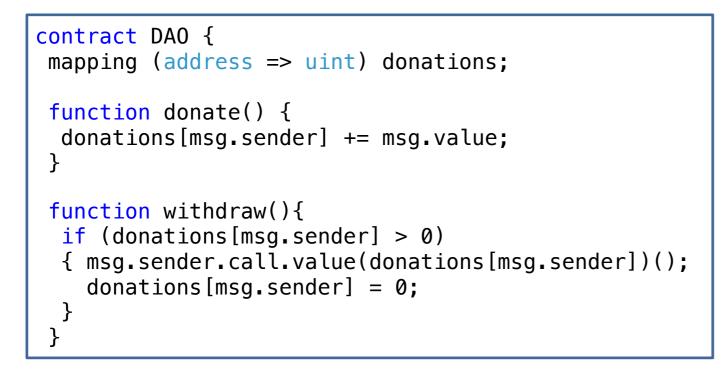


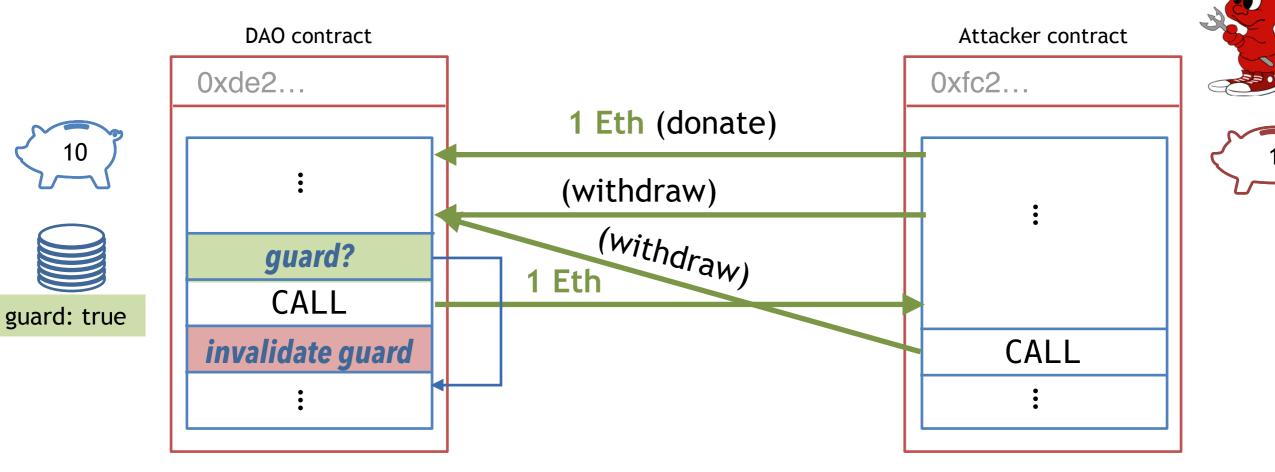


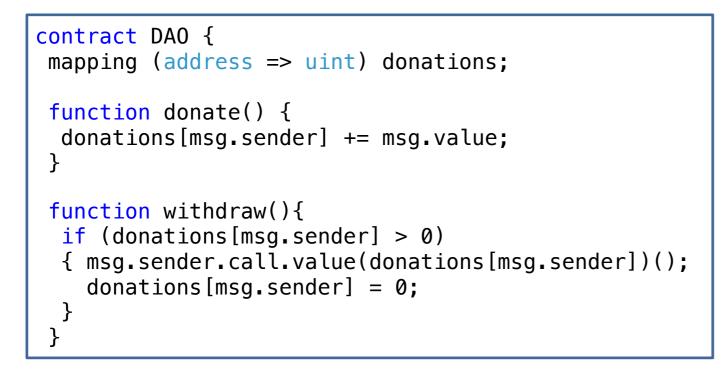


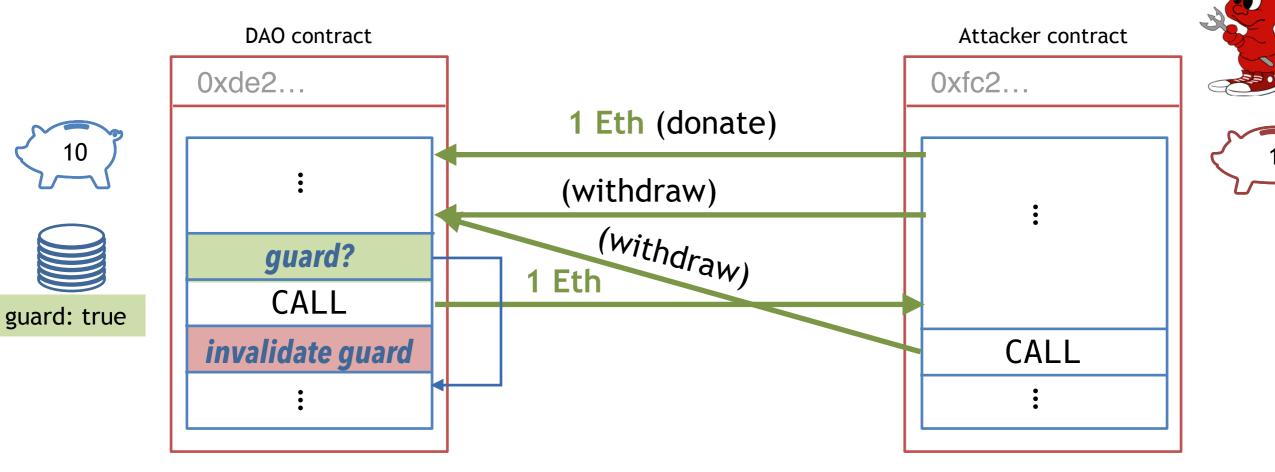


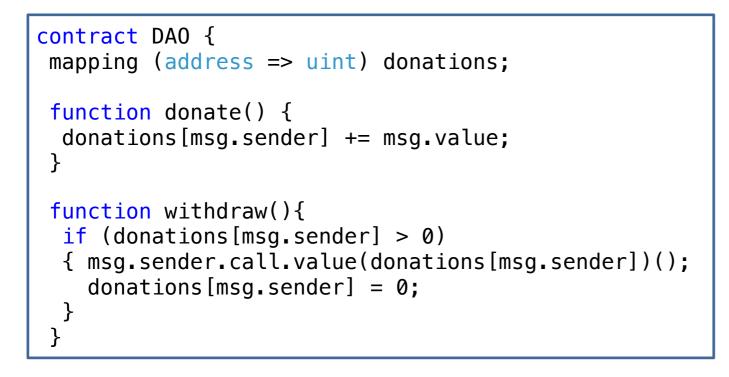


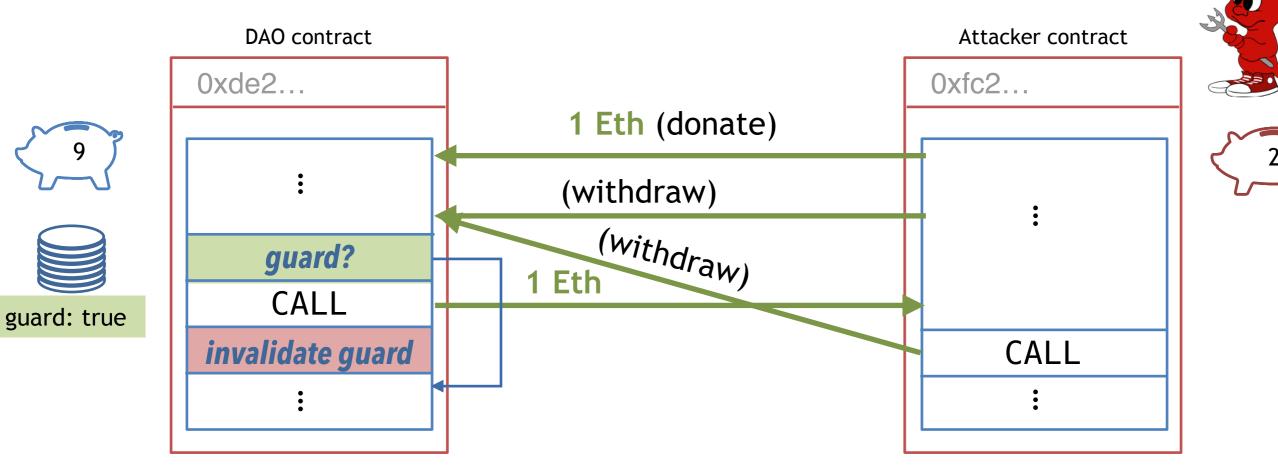


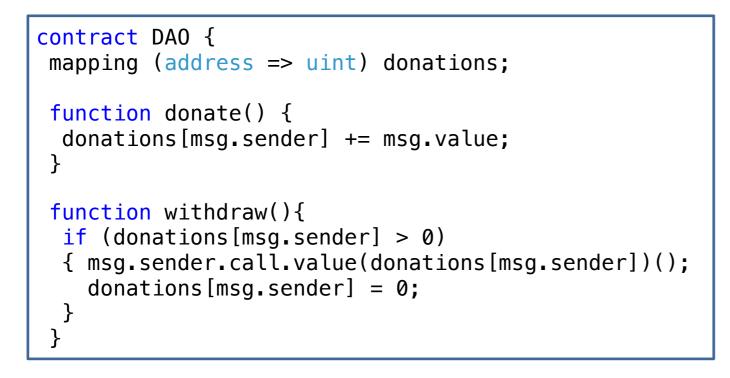


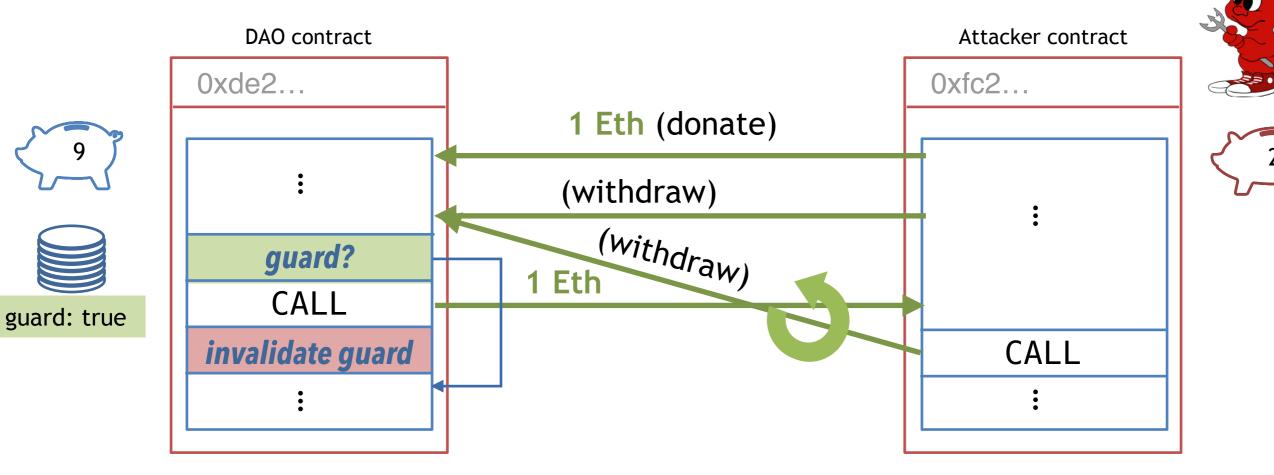








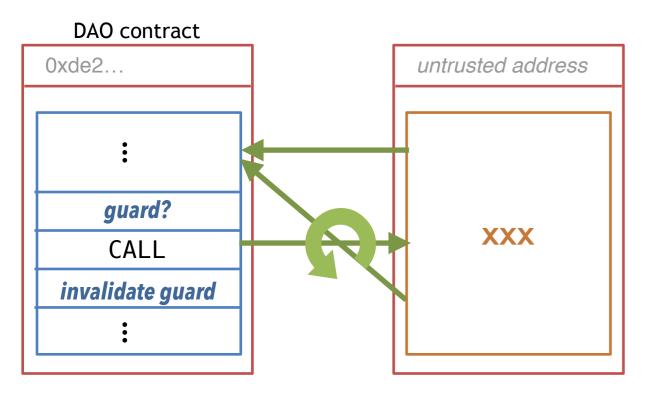


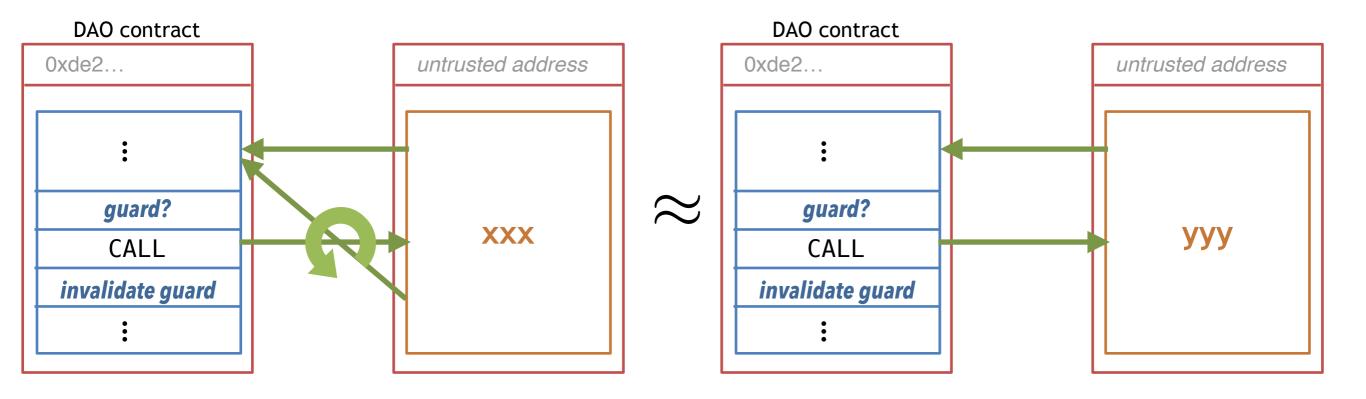


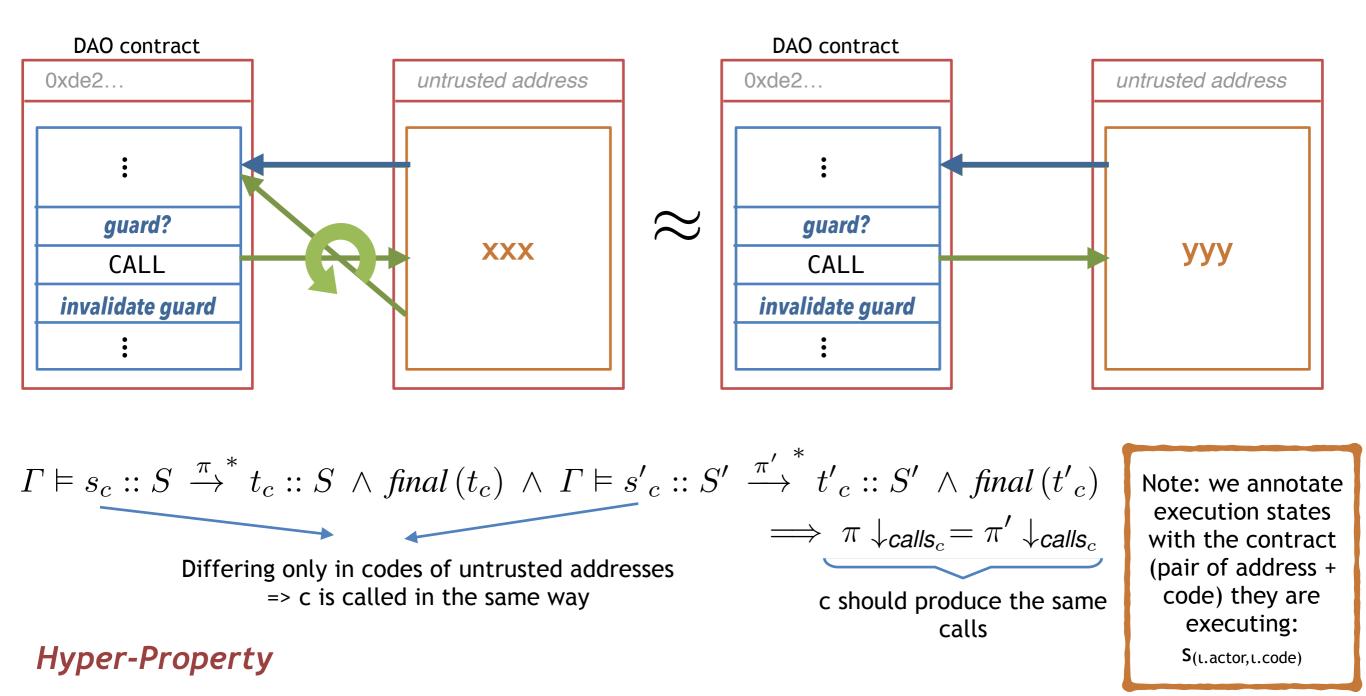
So, what did go wrong here?

Common approch from the literature

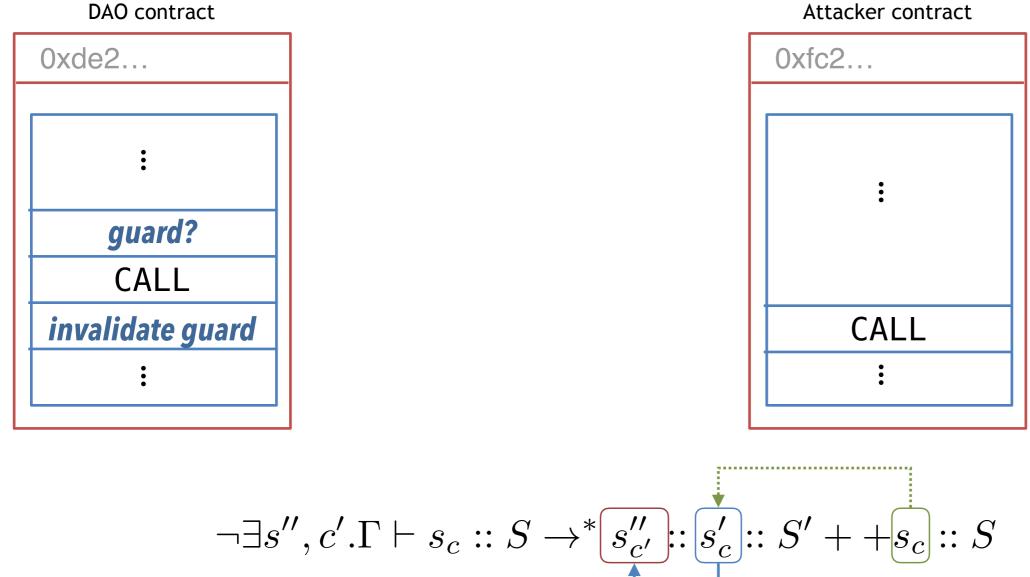
- "the guard should be invalidated before performing the call"
- Syntactic and program specific characterization
- What is the underlying semantic security property?





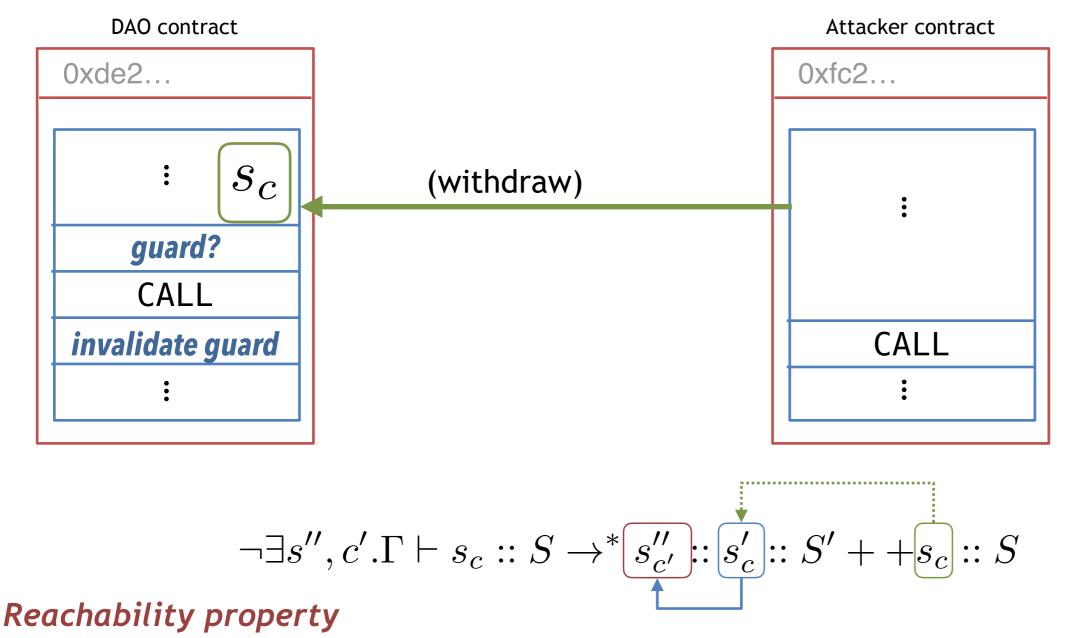


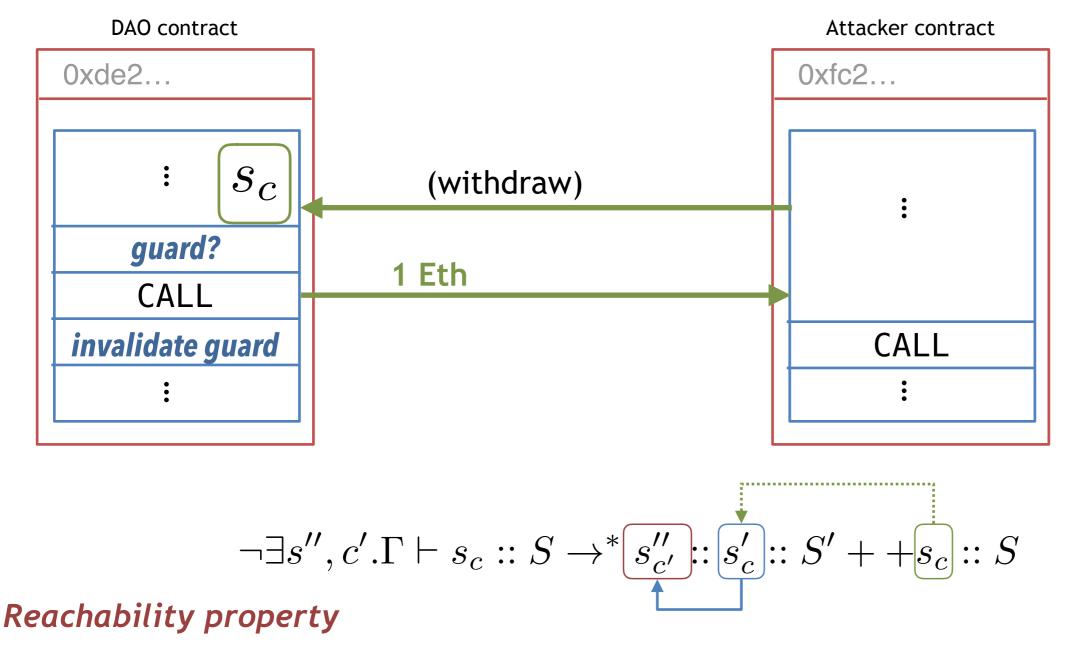
• Single-entrancy for c: "After being re-entered, contract c should perform no more calls"

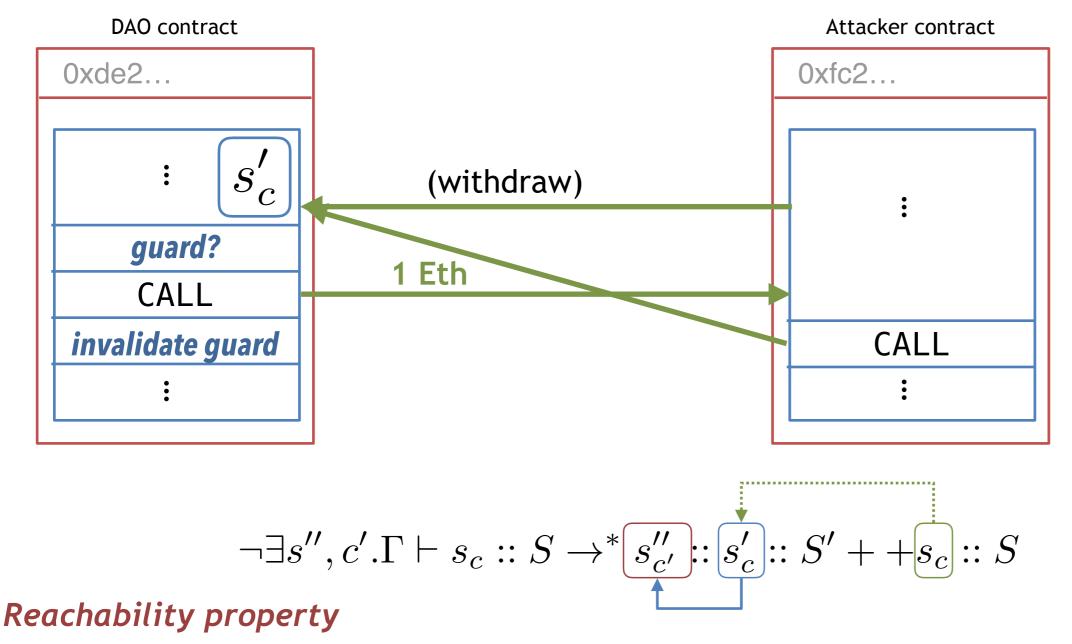


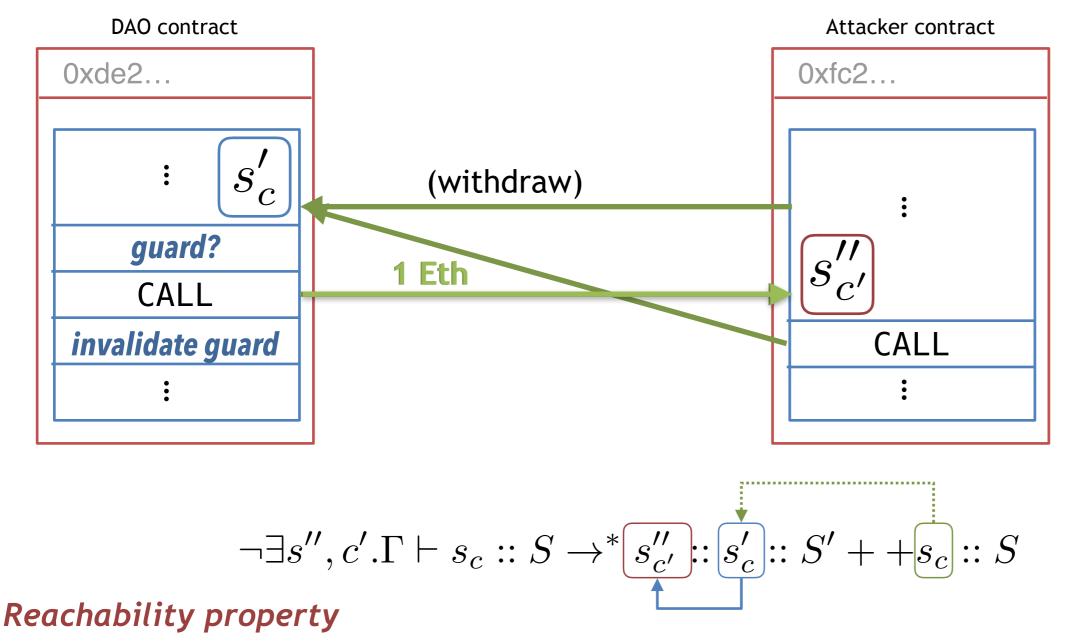
Attacker contract

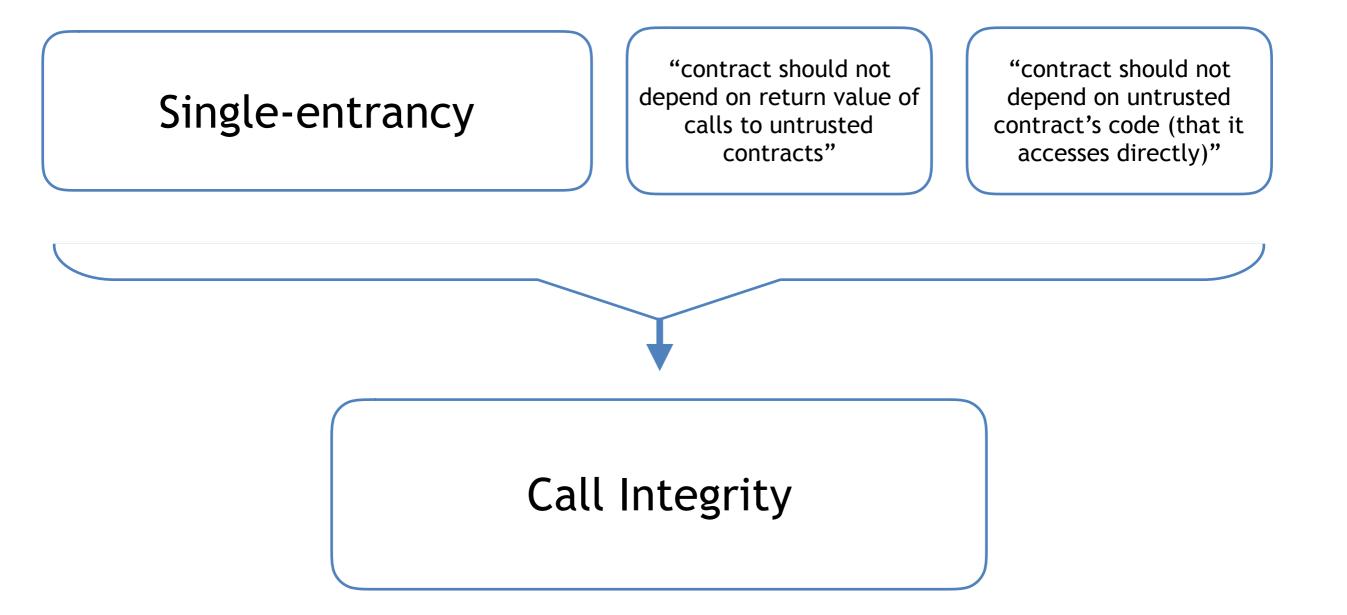
Reachability property

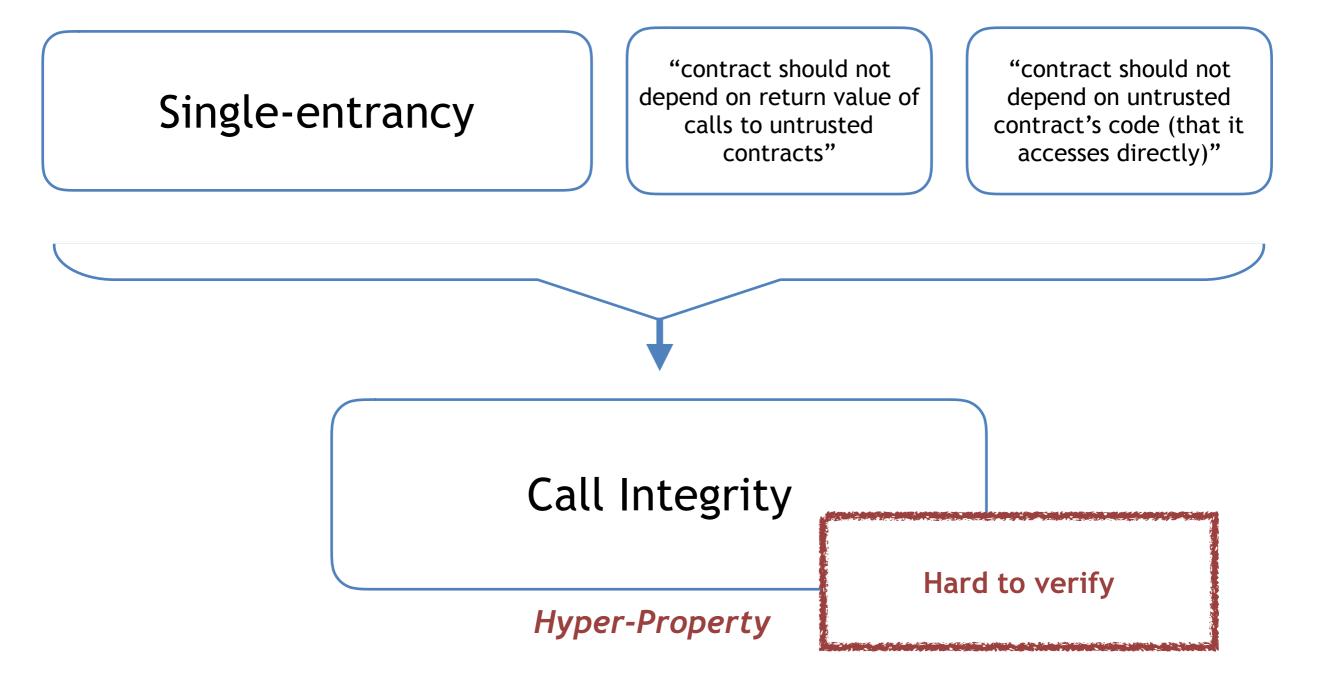


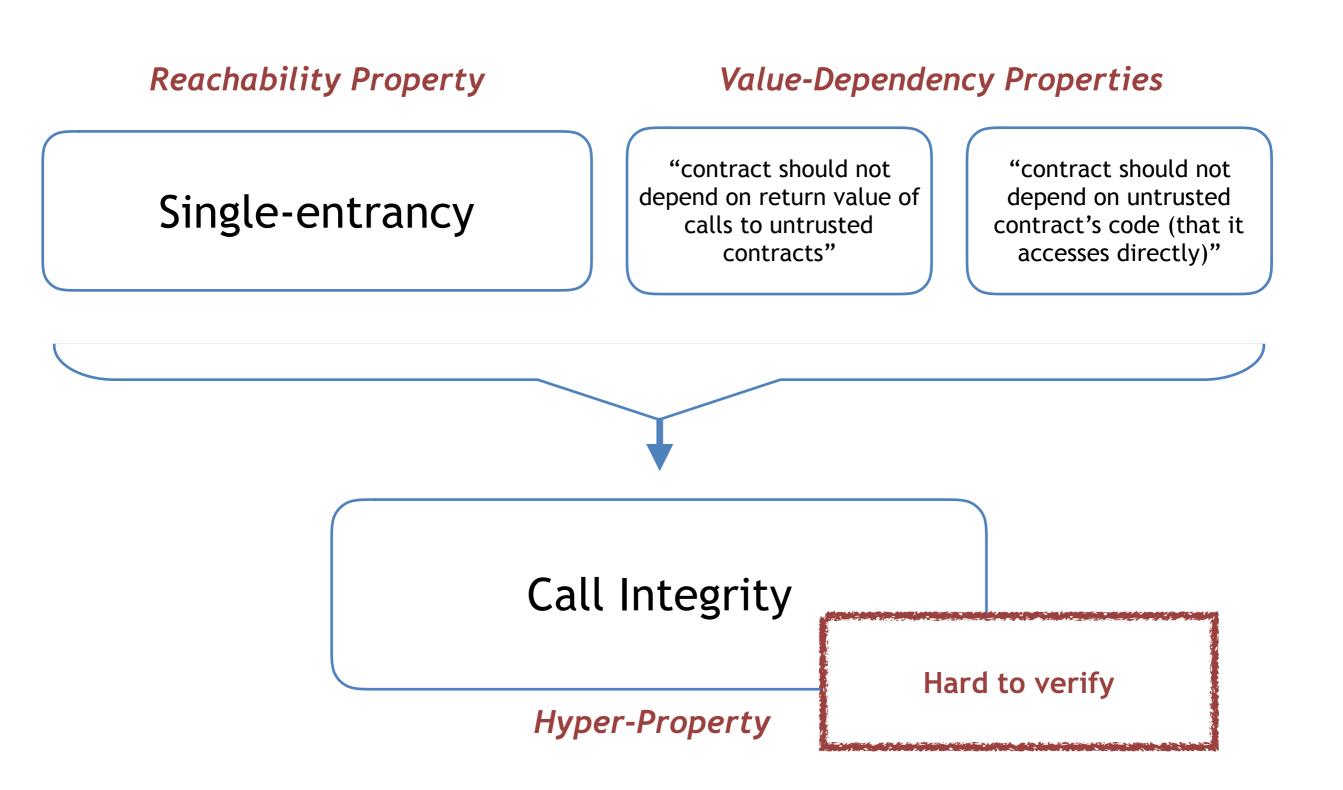


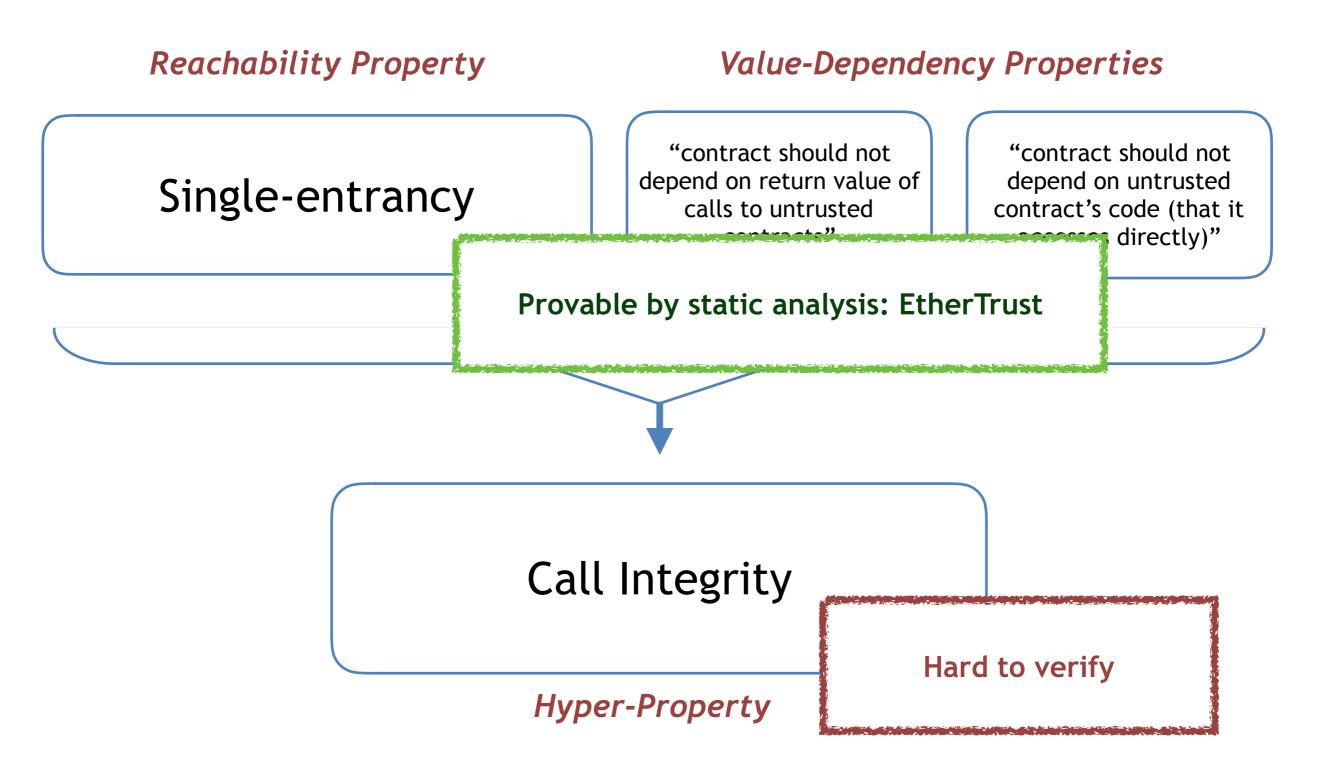












Atomicity

• Inconsistencies due to unhandled gas exceptions

```
contract DAO {
  mapping (address => uint) donations;
  function donate() {
    donations[msg.sender] += msg.value;
  }
  function withdraw(){
    msg.sender.call.value(donations[msg.sender])();
    donations[msg.sender] = 0;
  }
}
```

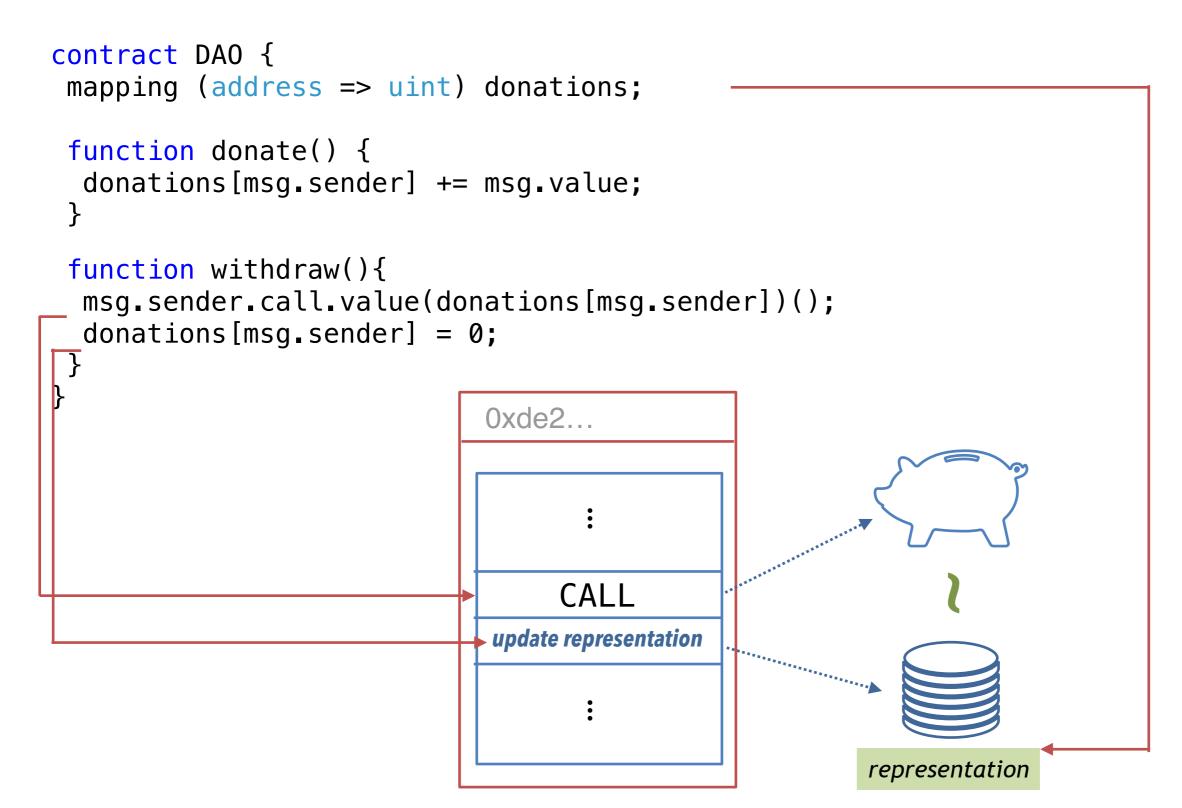
Atomicity

Inconsistencies due to unhandled gas exceptions

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contract DA0 {
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}
                             0xde2...
                                  CALL
                             update representation
                                               *****
                                                       representation
```

Atomicity

• Inconsistencies due to unhandled gas exceptions



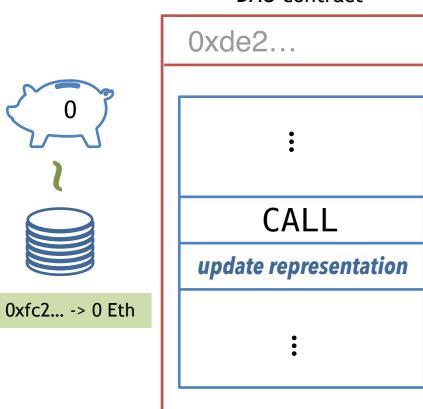
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```



Oxde2... CALL update representation :

DAO contract

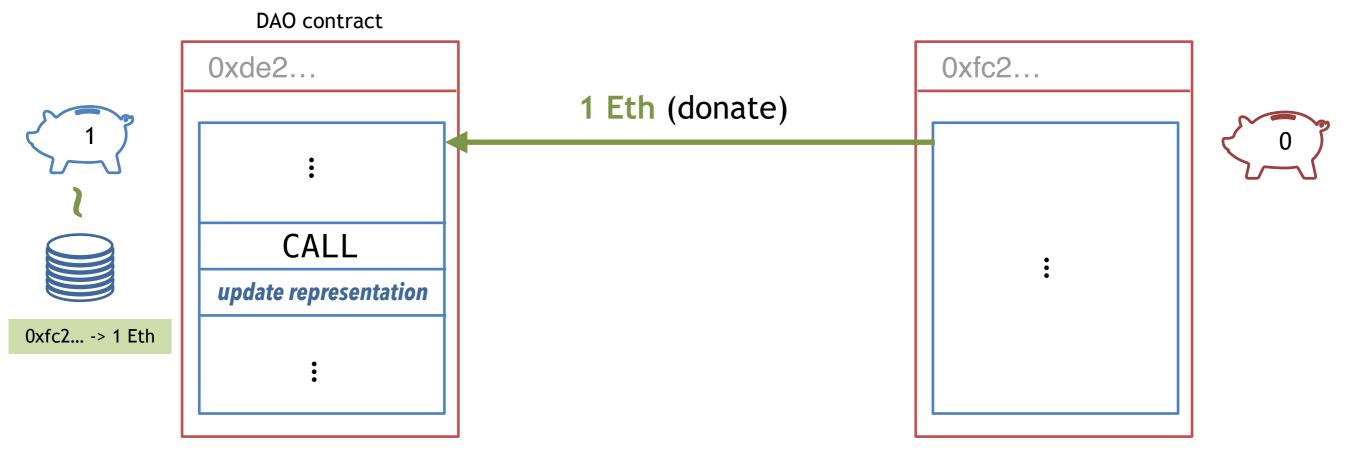
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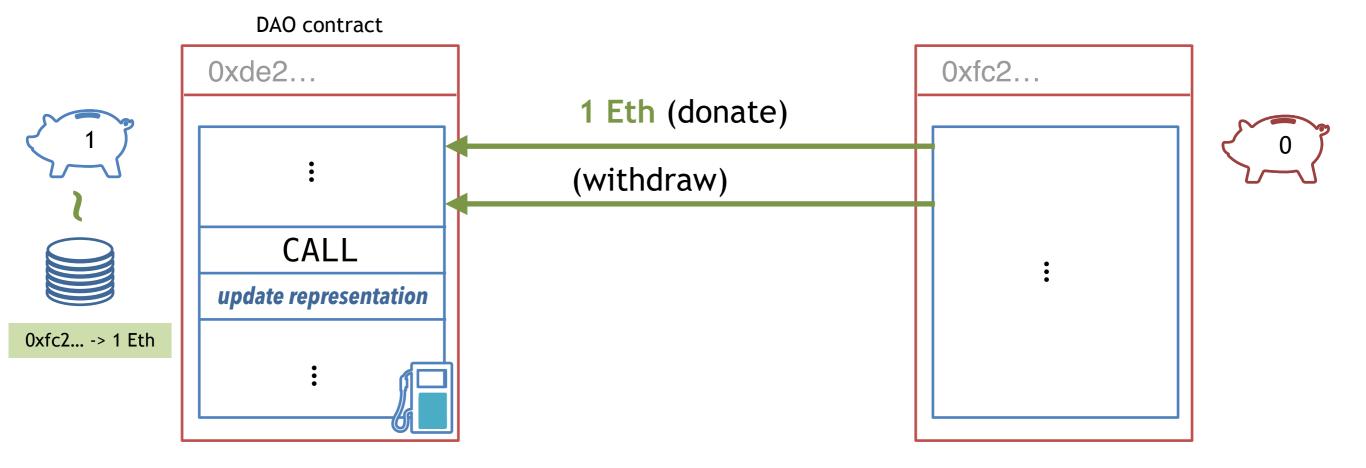
Oxfc2...

DAO contract

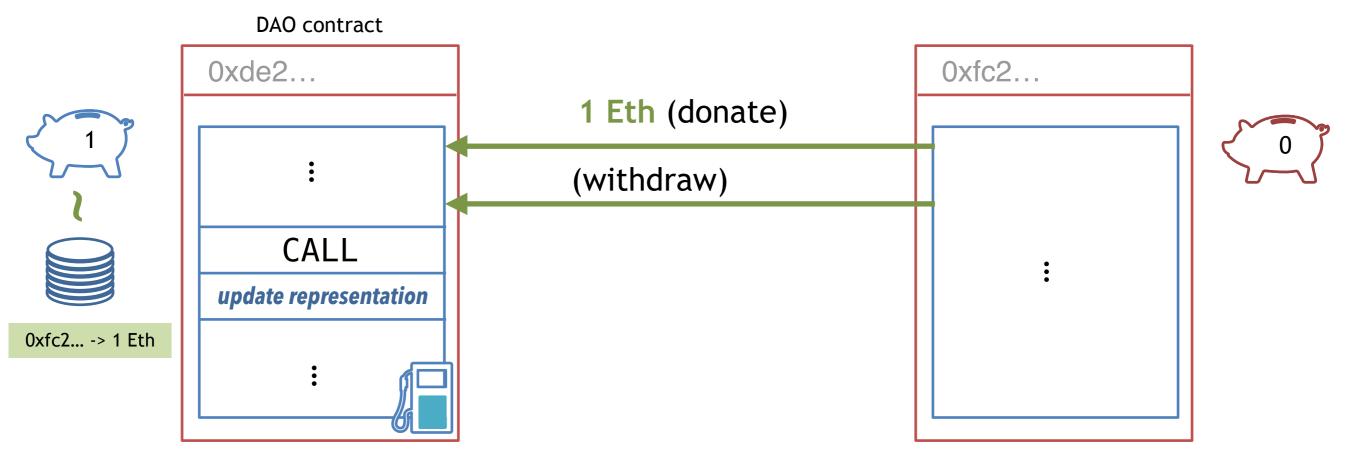
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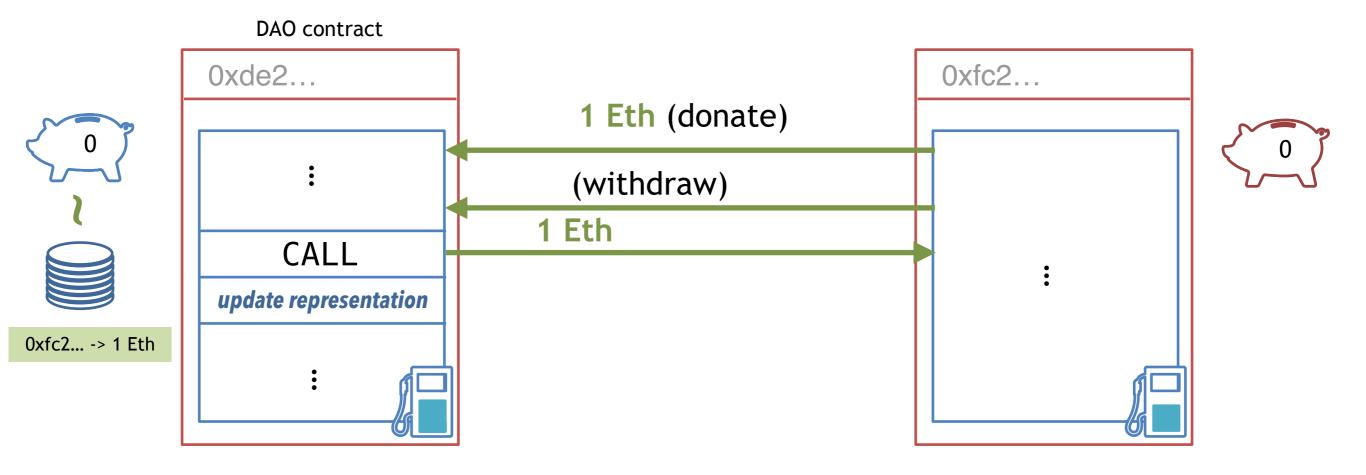
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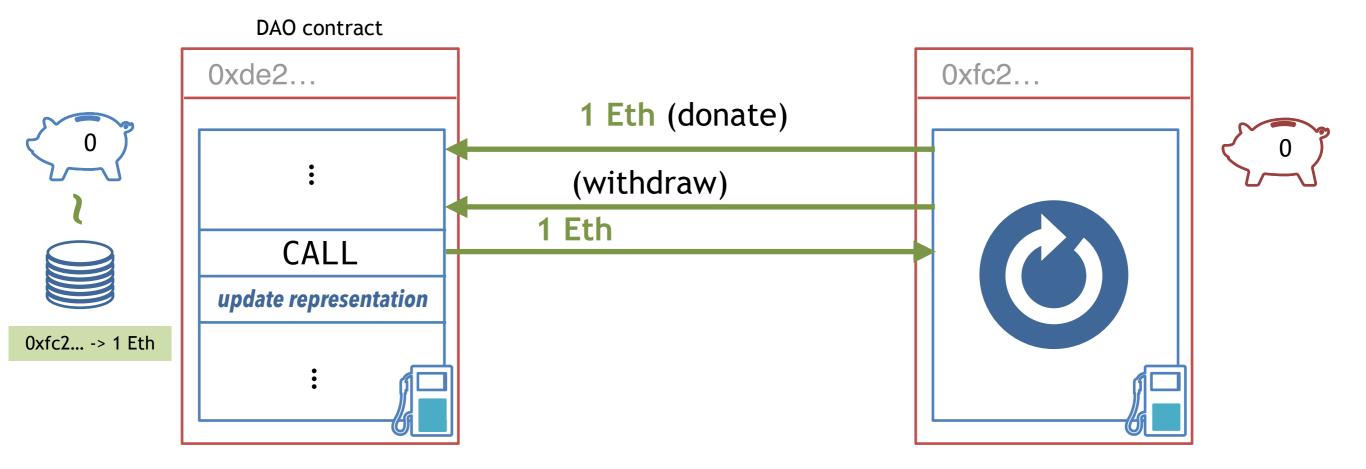
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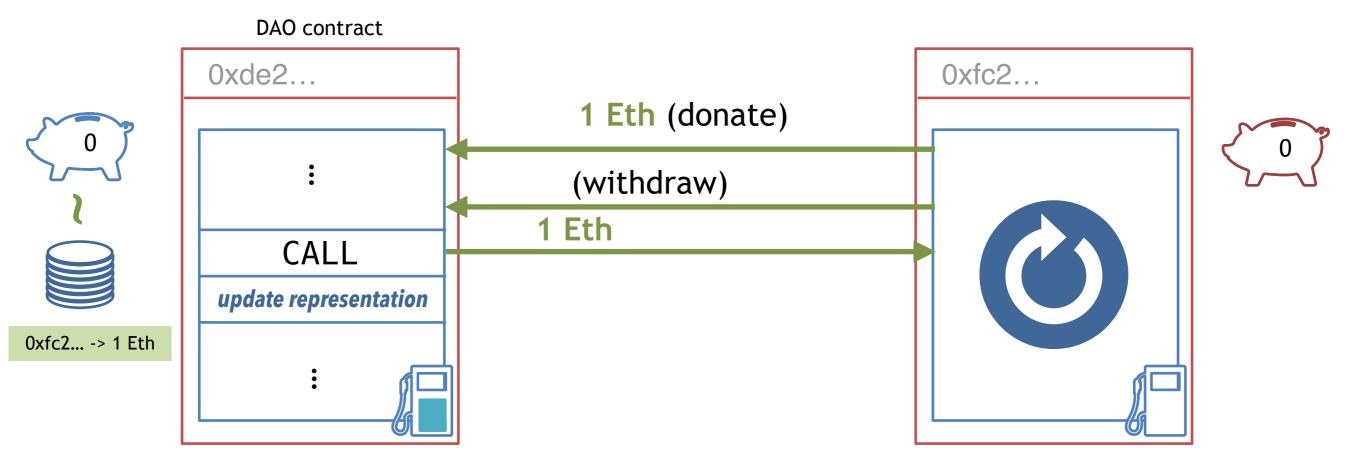
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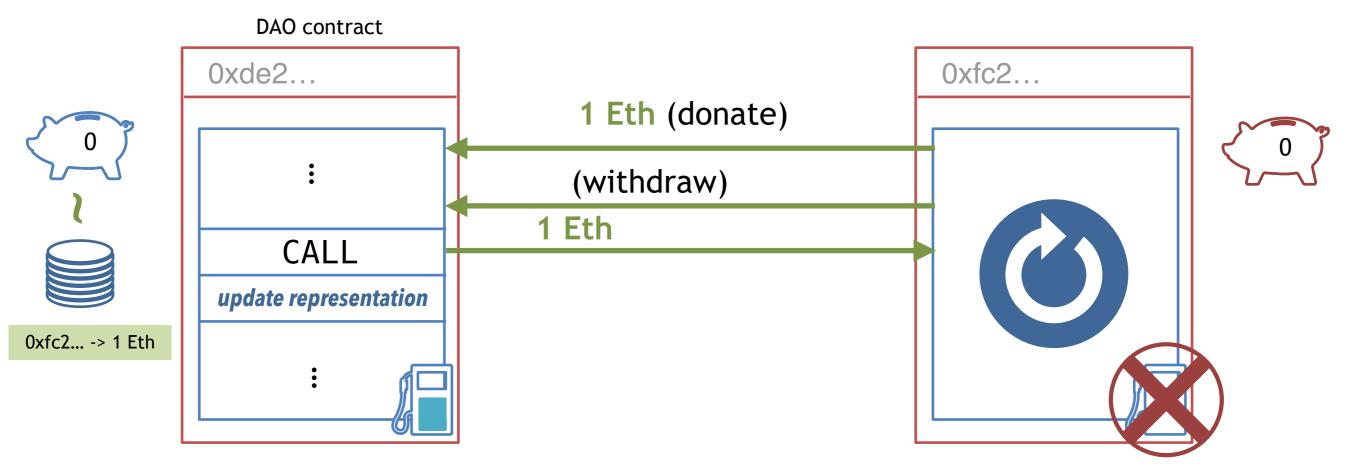
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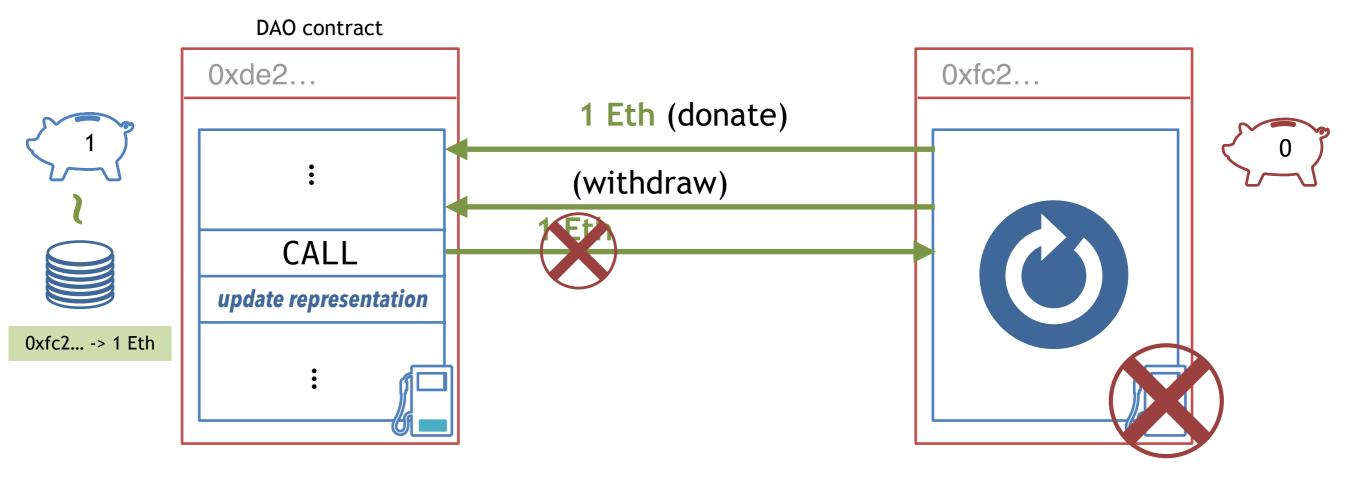
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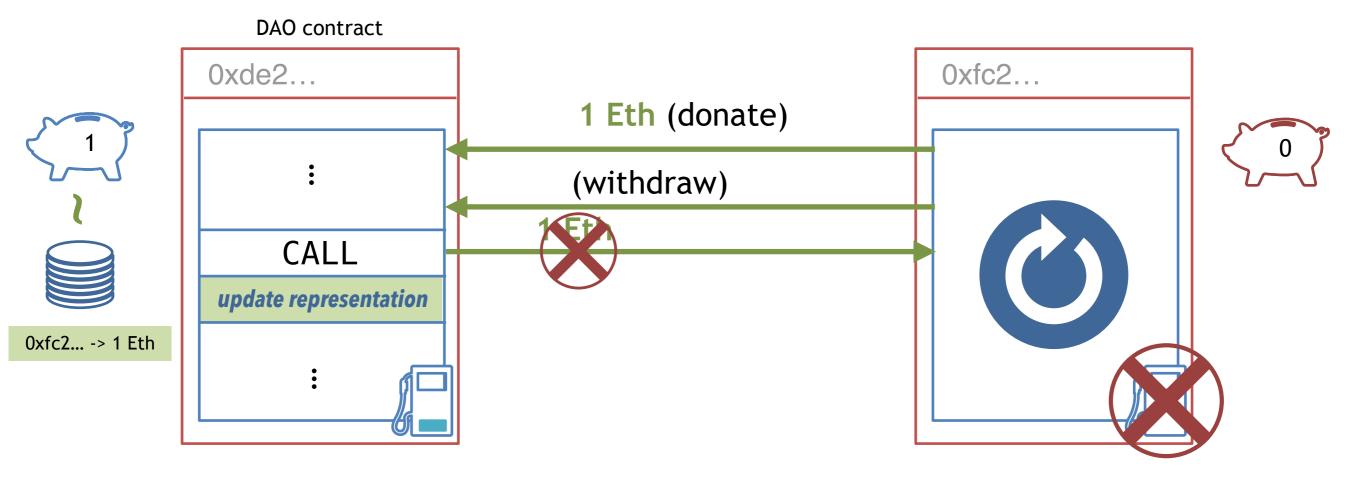
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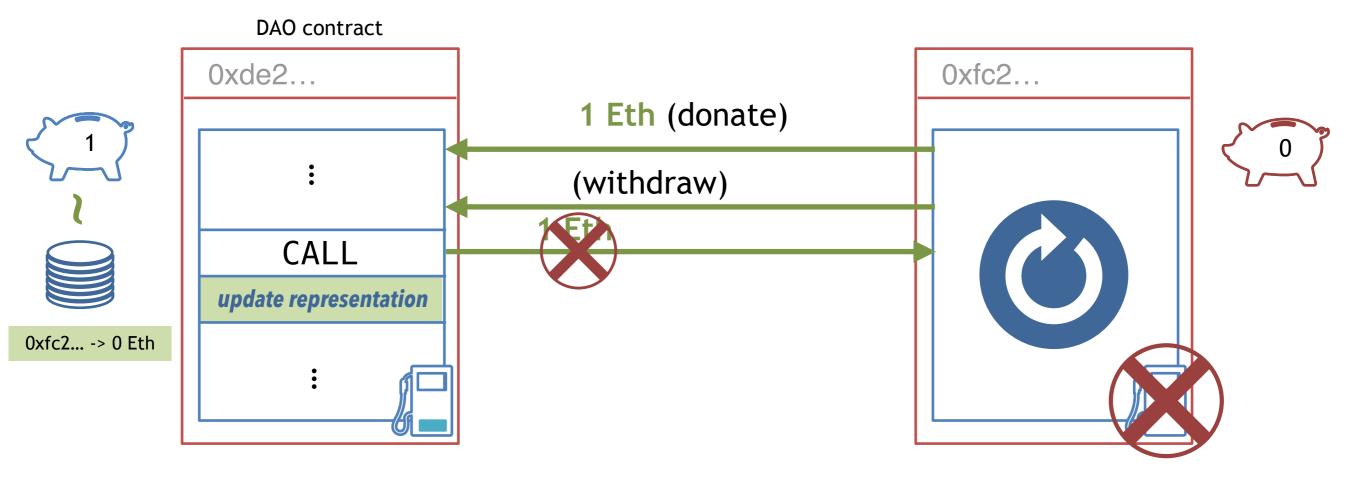
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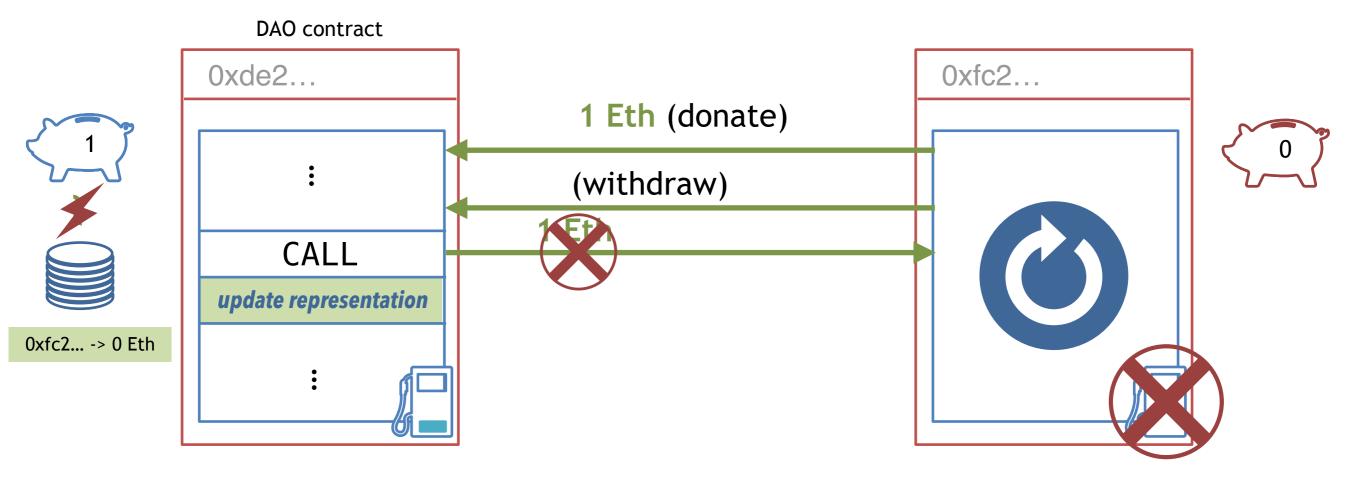
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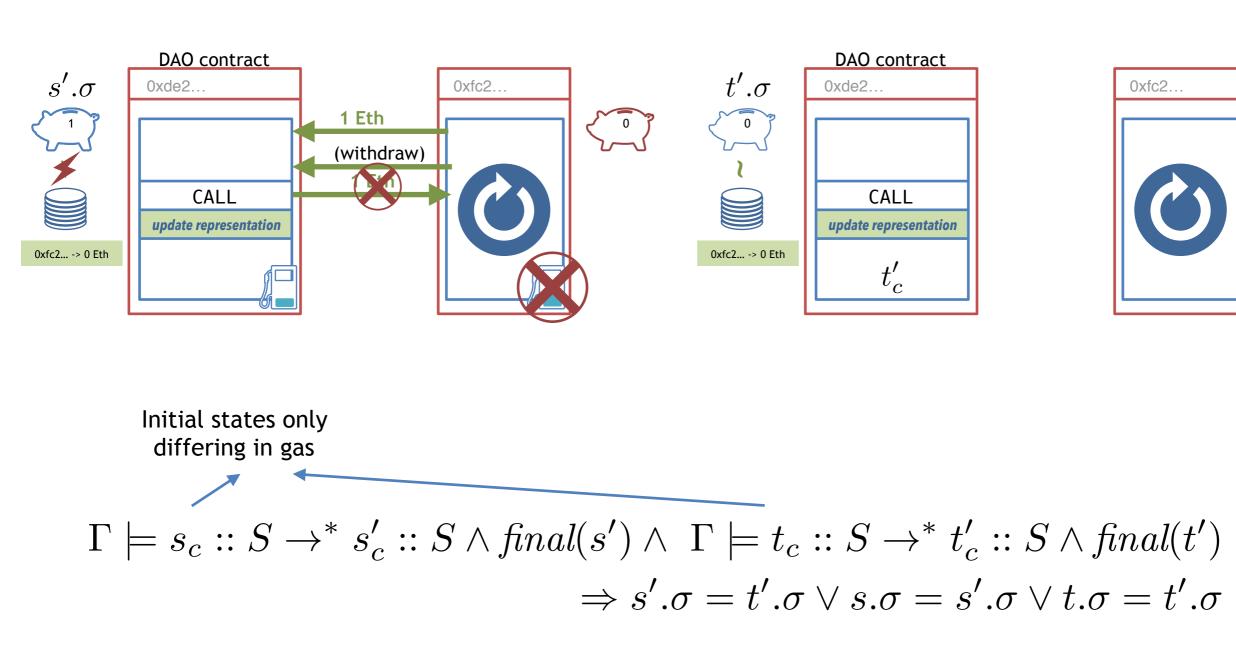


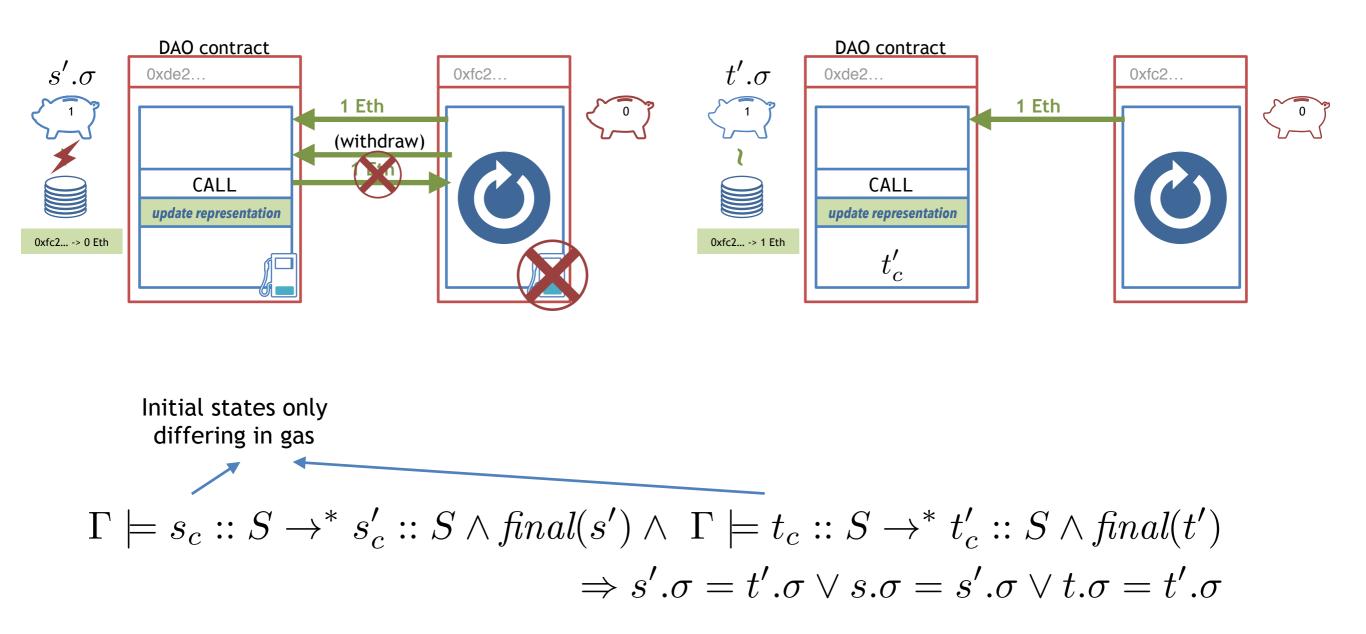
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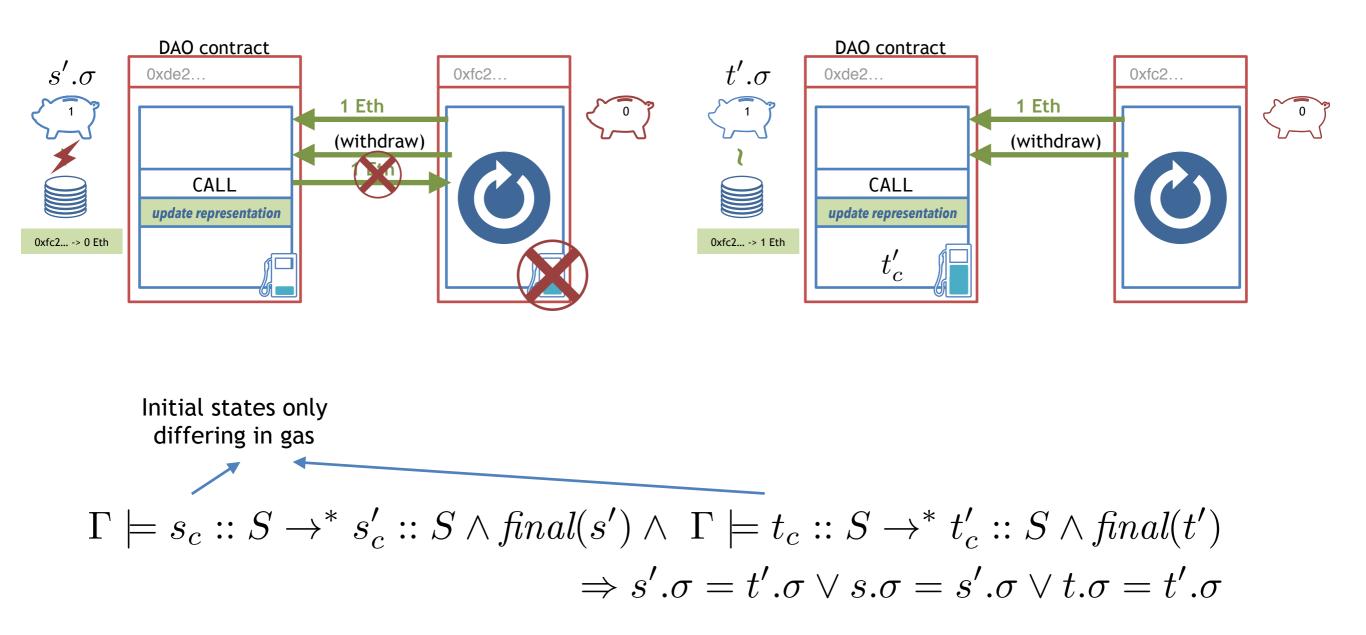


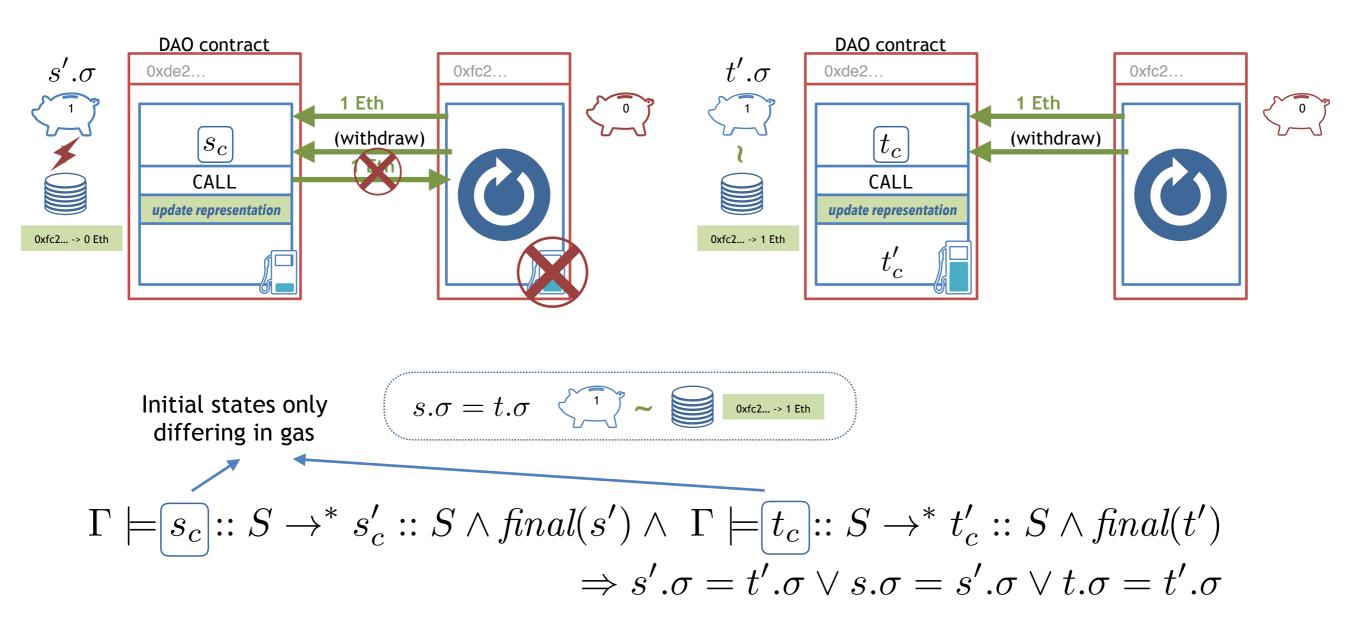
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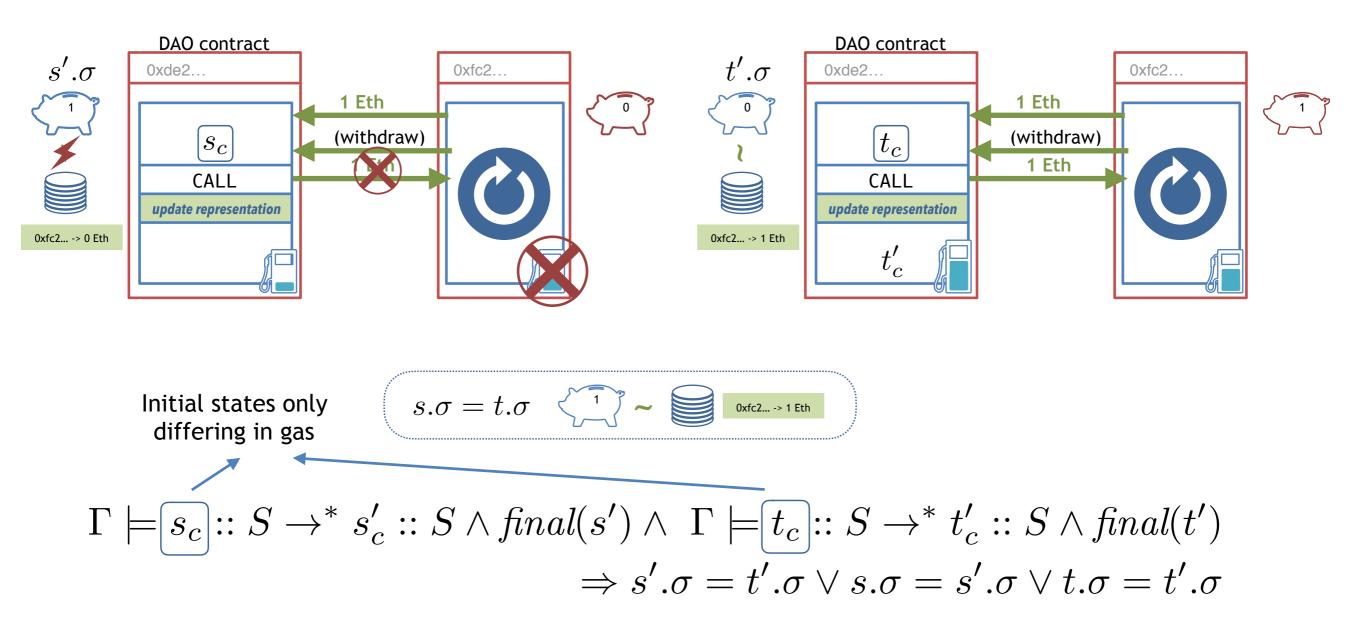


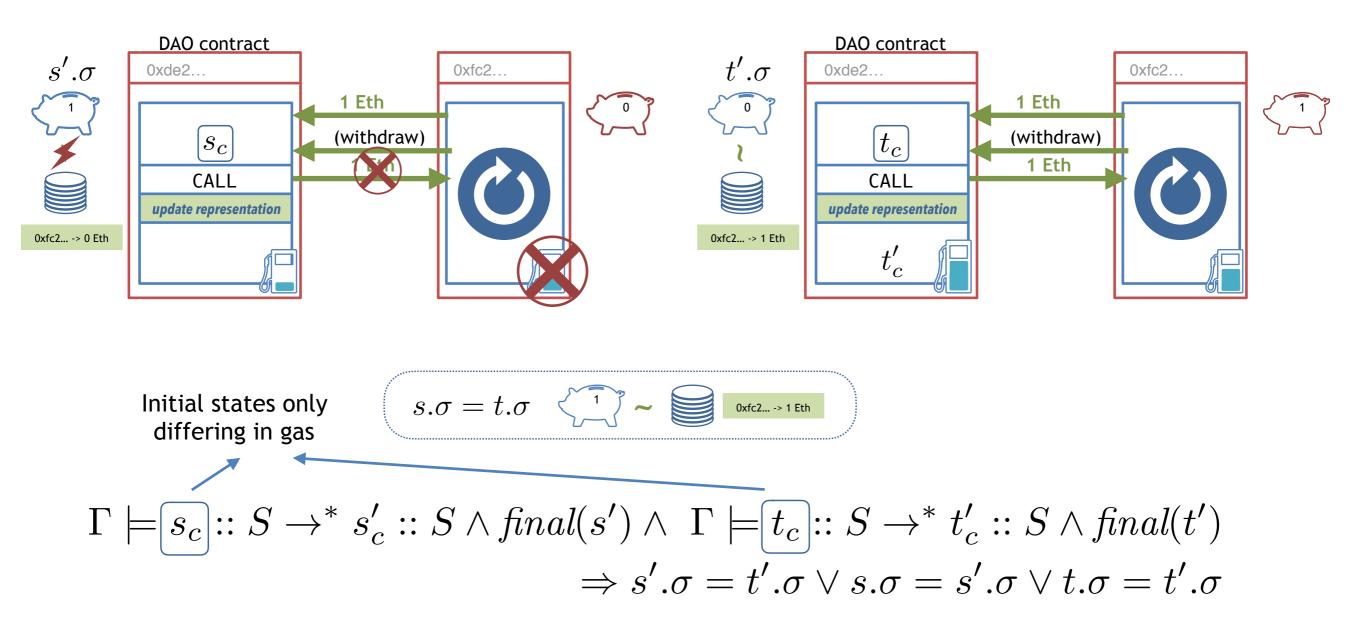


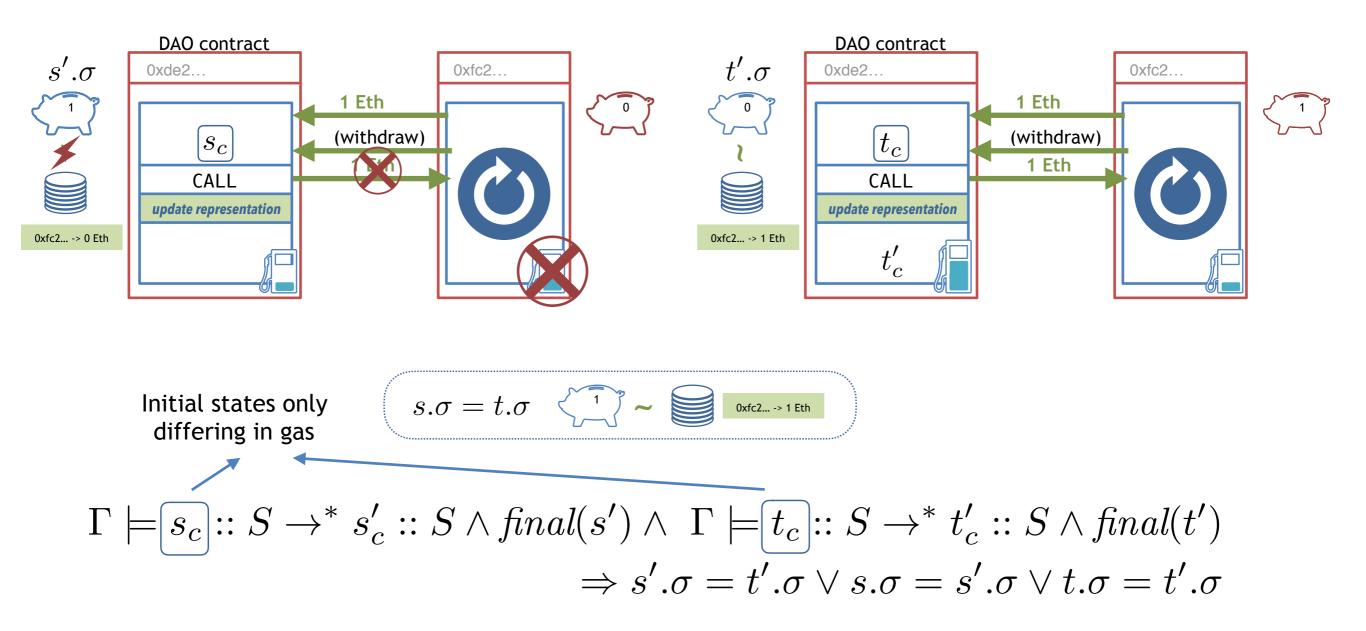


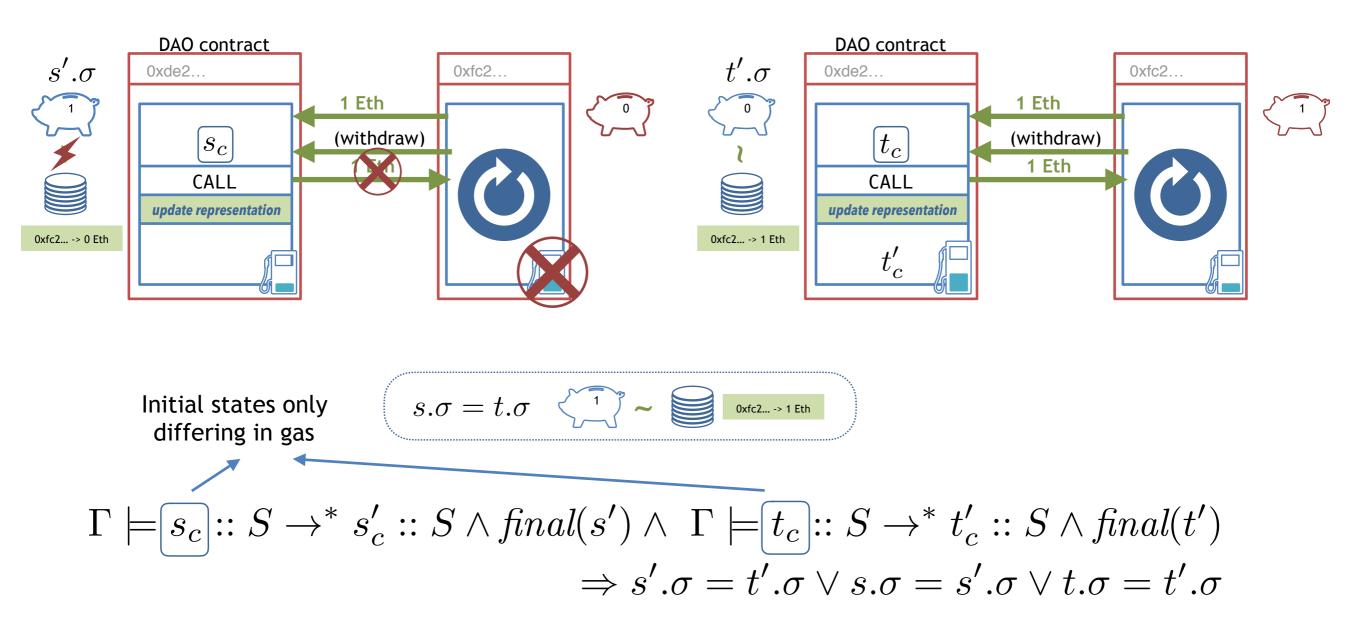


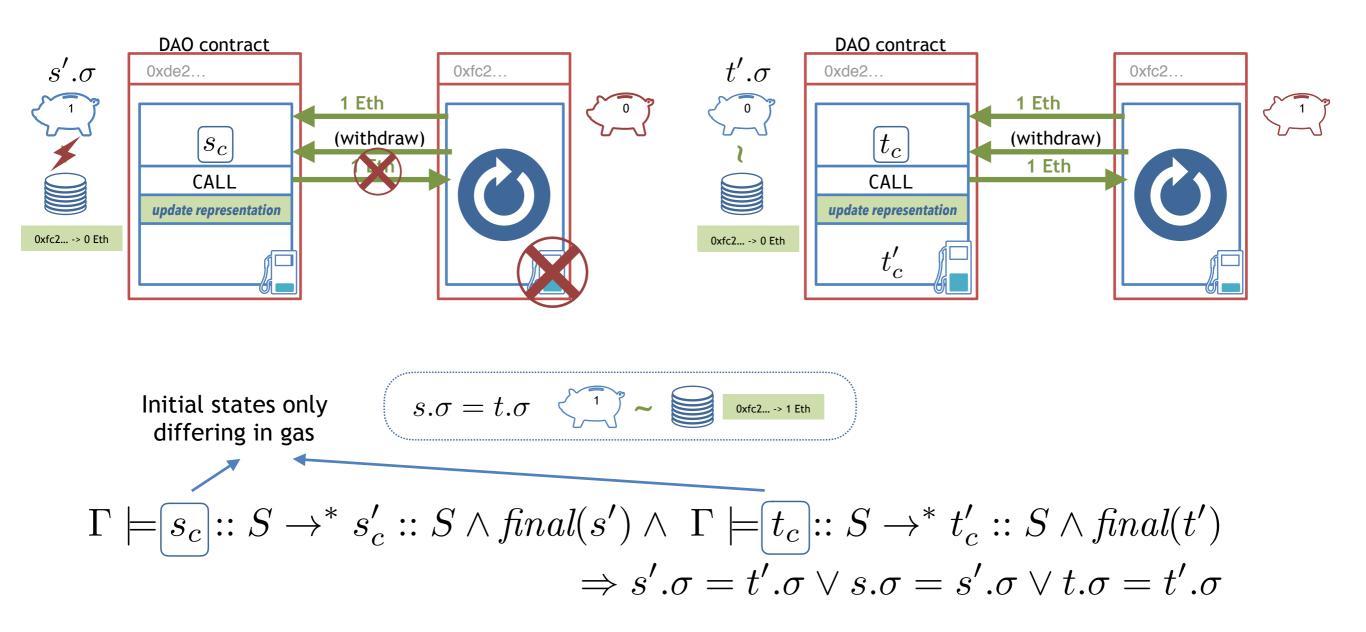


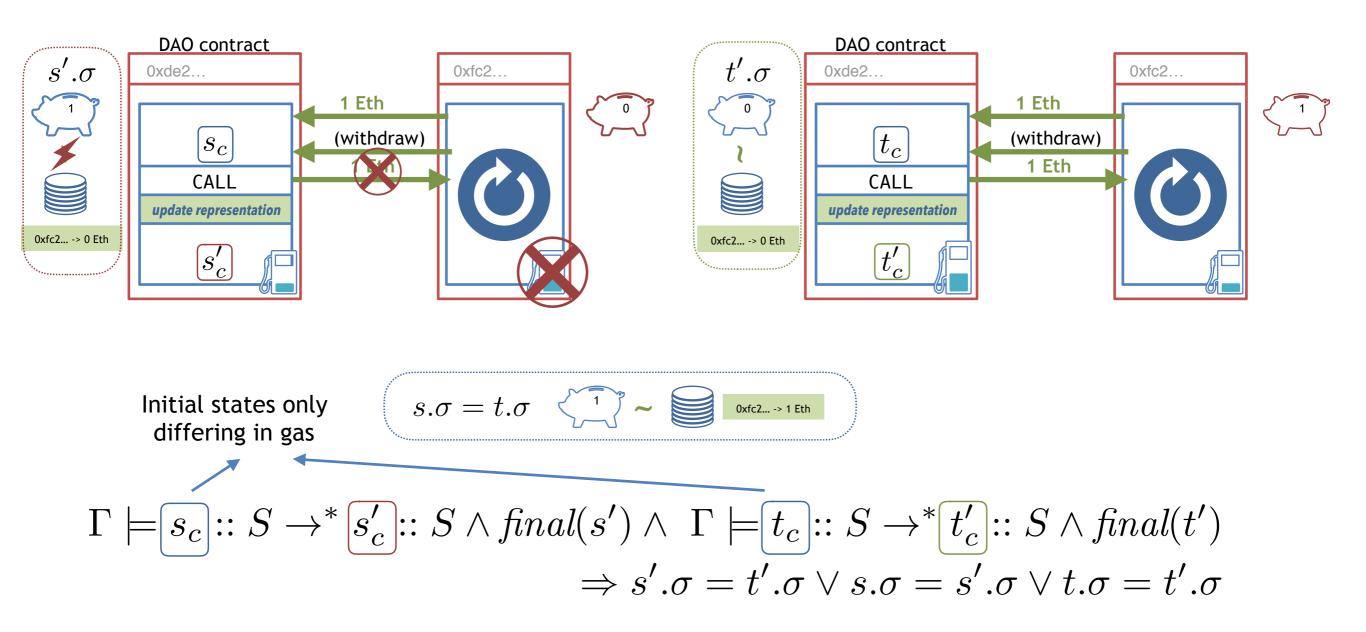


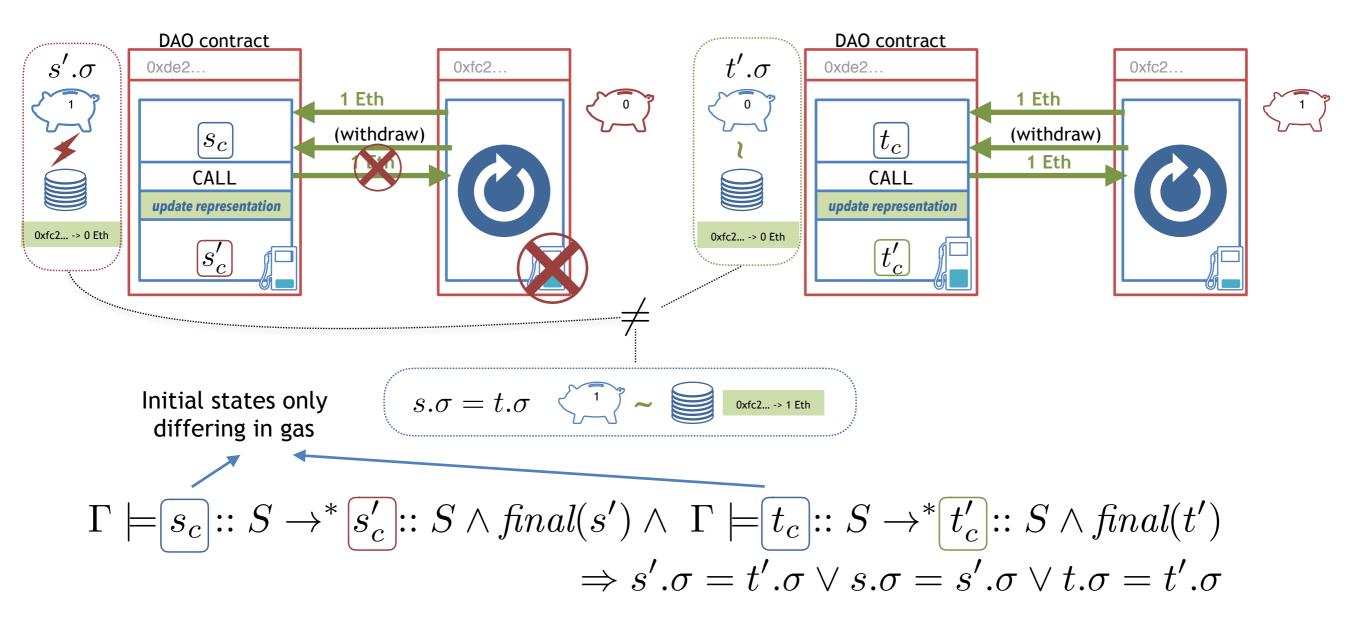












How can all of that be checked automatically?

Outline

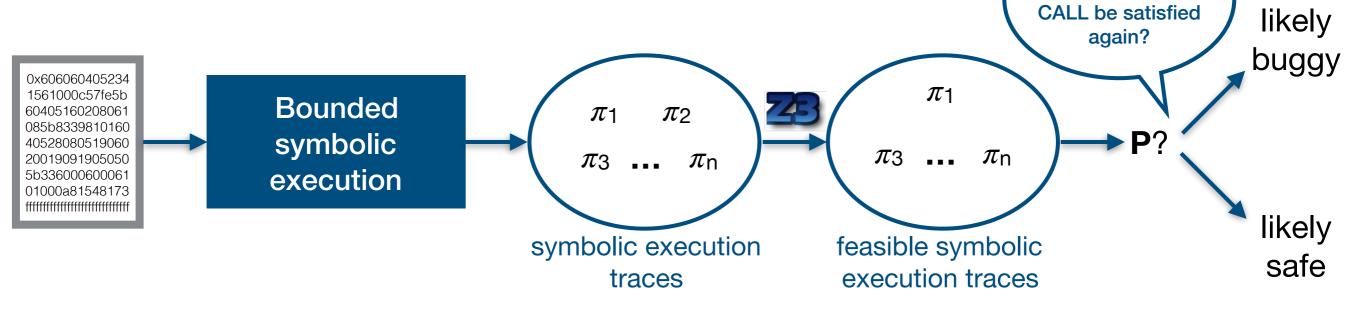
Introduction to Ethereum

Semantics of EVM bytecode

Static Analysis of EVM bytecode

Oyente^[1]

 Tool for finding common smart contract bugs in EVM bytecode (re-entrancy, uncaught exceptions, etc.)



condition before a

 Evaluated on ~19000 real world contracts (low false positive rate: 6,4%)

[1] Luu, Loi, et al. "Making smart contracts smarter." *Proceedings of the 2016 ACM SIGSAC Conference on Computer and Communications Security*. ACM, 2016.

Oyente

· Pros

• Fast + scalable

· Cons

- Only works for pre-defined properties
- Produces false positives + false negatives
- Based on flawed semantics: $\langle S, \sigma \rangle \rightarrow \langle S', \sigma' \rangle$

global state is assumed to be monotonically updated (never reverted) during execution

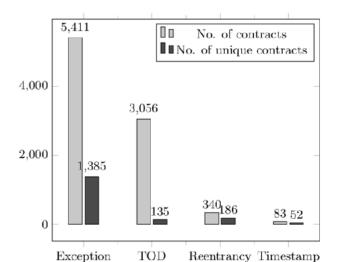
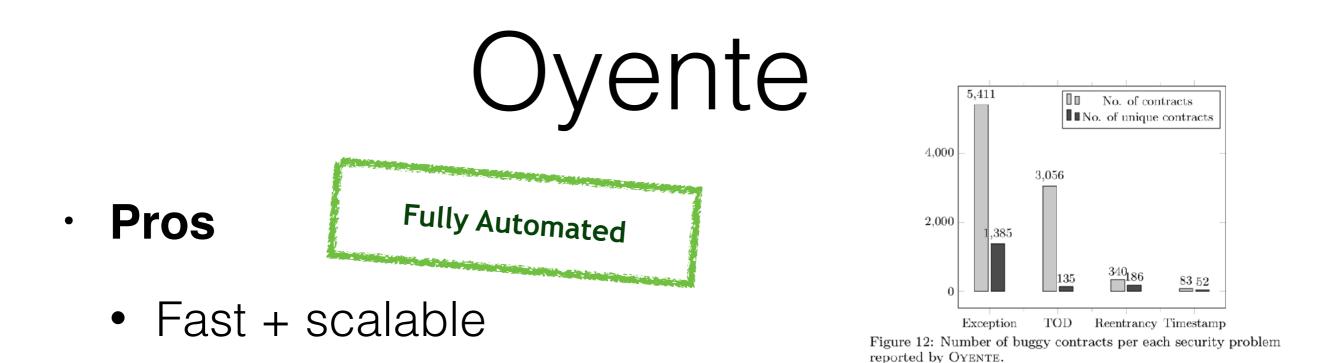


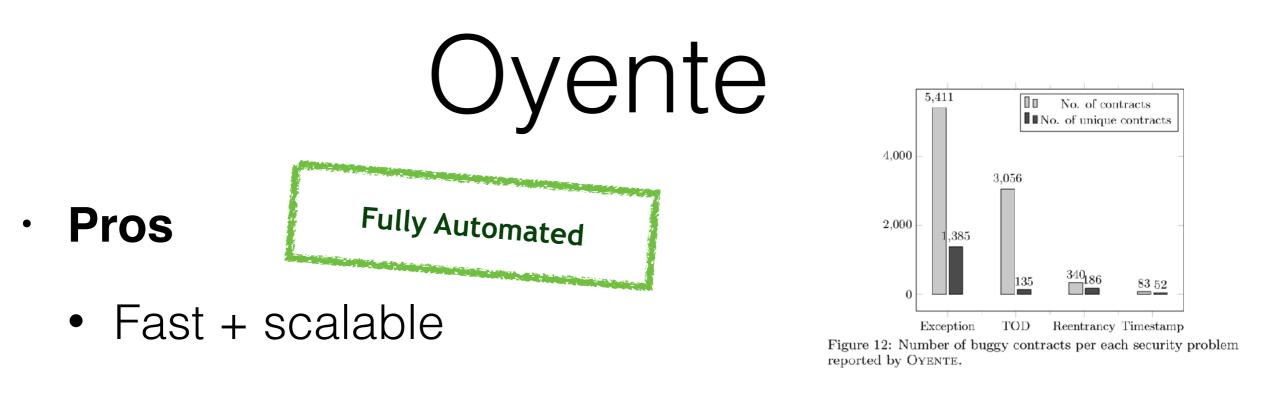
Figure 12: Number of buggy contracts per each security problem reported by OYENTE.



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global state is assumed to be monotonically updated (never reverted) during execution

KEVM[2]

- Implementation of EVM bytecode semantics is in the K framework (rewrite-based executable semantic framework)
- Analysis tools automatically derived from the semantics:
 - Semantic Debugger
 - Program Verifier (for reachability claims)

- · Pros
 - Based on fully fledged (and tested) semantics of EVM bytecode
 - Allows for Hoare-style-like reasoning

· Cons

- Analysis tool requires the user to specify invariants (semi-automated)
- No domain-specific over-approximations (e.g. for calling unknown contracts)

· Pros

Provably sound

- Based on fully fledged (and tested) semantics of EVM bytecode
- Allows for Hoare-style-like reasoning

· Cons

- Analysis tool requires the user to specify invariants (semi-automated)
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· Pros

Provably sound

- Based on fully fledged (and tested) semantics of EVM bytecode
- Allows for Hoare-style-like reasoning

· Cons

Only semi-automated

- Analysis tool requires the user to specify invariants (semi-automated)
- No domain-specific over-approximations (e.g. for calling unknown contracts)

· Pros

Sound by construction

- Based on fully fledged (and tested) semantics of EVM bytecode
- Allows for Hoare-style-like reasoning

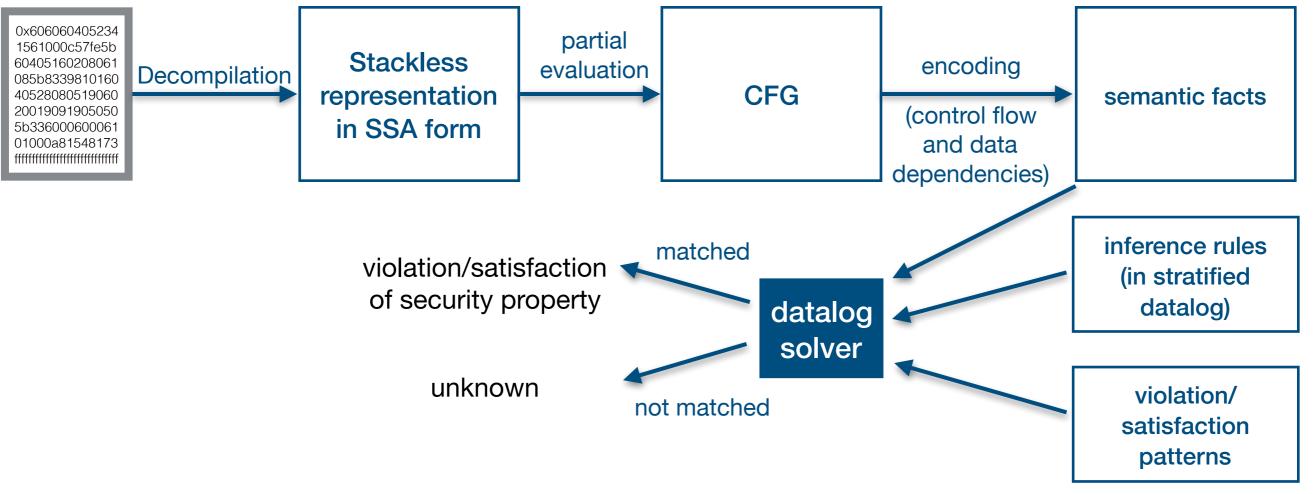
· Cons

Only semi-automated

- Analysis tool requires the user to specify invariants (semi-automated)
- No domain-specific over-approximations (e.g. for calling unknown contracts)

Securify[3]

 Static smart contract analyser for EVM bytecode based on 'semantic fact checking'



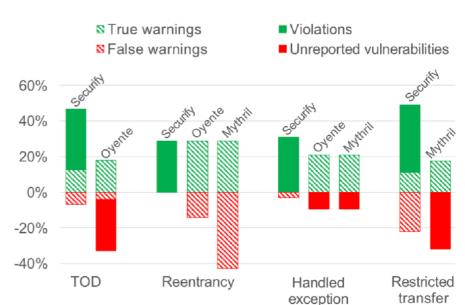
Evaluated on ~25000 real world contracts

[3] Tsankov, Petar, et al. "Securify: Practical Security Analysis of Smart Contracts." arXiv preprint arXiv:1806.01143 (2018).

Securify ^{60%} 40% 20% -20%

· Pros

• Fast + scalable



 Shows good accuracy thanks to classification into (confirmed) violations and compliances

· Cons

- Decompilation is not guaranteed to succeed
- No soundness proof (neither for the dependency analysis nor for the security patterns)



• Shows good accuracy thanks to classification into (confirmed) violations and compliances

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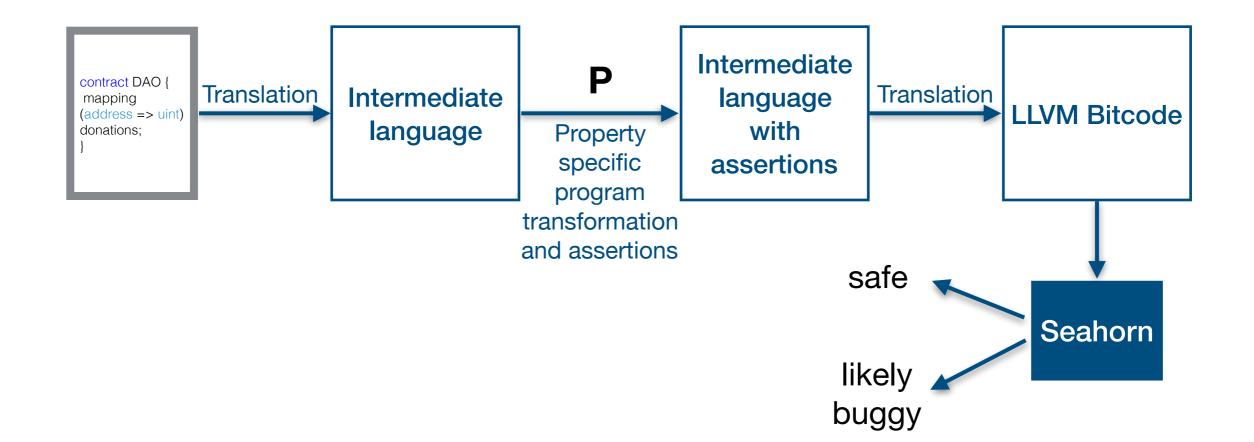
· Cons

No soundness proof

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ZEUS[4]

• Static analyser for Solidity code



Evaluated on ~22500 real-world contracts

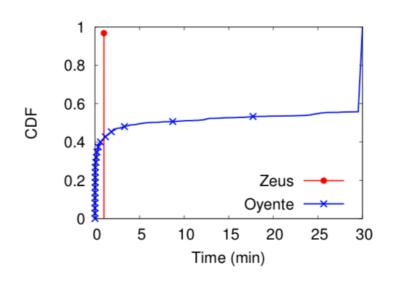
[4] Kalra, Sukrit, et al. "Zeus: Analyzing safety of smart contracts." NDSS, 2018.

ZEUS

· Pros

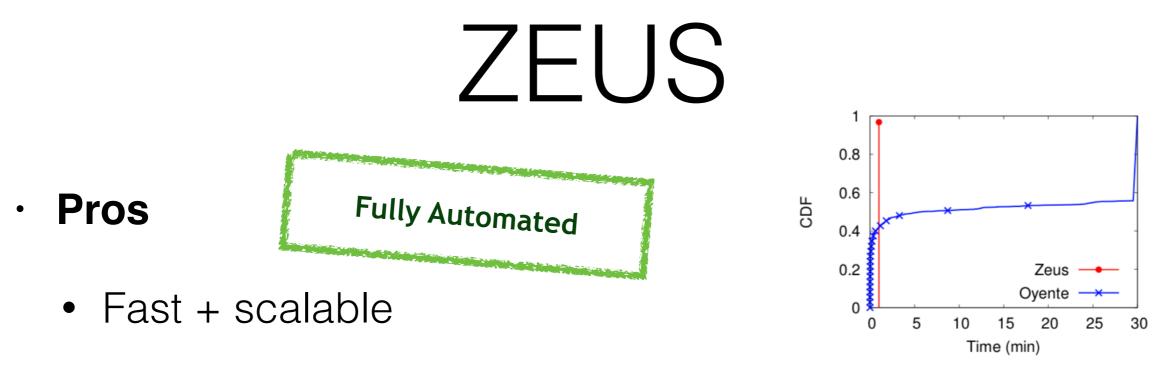
• Fast + scalable

· Cons



(d) Verification time in minutes.

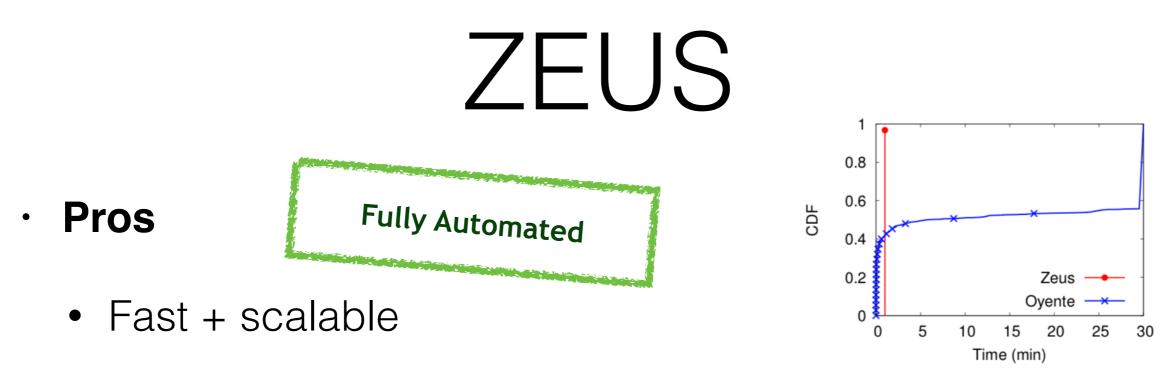
- Only works on Solidity code (not on bytecode)
- Only works for pre-defined properties
- Does not give soundness guarantees (transformations are not semantics preserving + security invariants are not proven sound)
- Based (as Oyente) on flawed semantics



· Cons

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EtherTrust

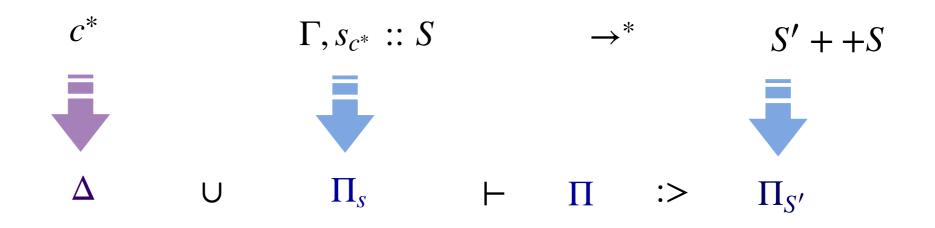
https://www.netidee.at/ethertrust

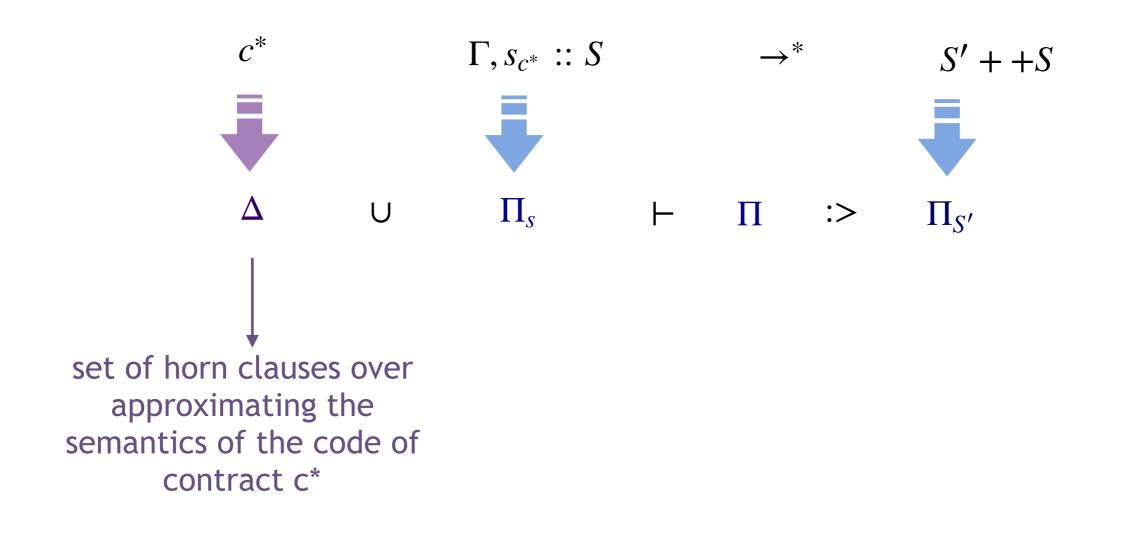
- First provably sound static analyzer for Ethereum smart contracts (i.e., it returns security guarantees)
 - previous ones focus on bug finding
- Outperforms the competitors in precision and performance
- Reachability analysis: suffices to check various interesting security properties

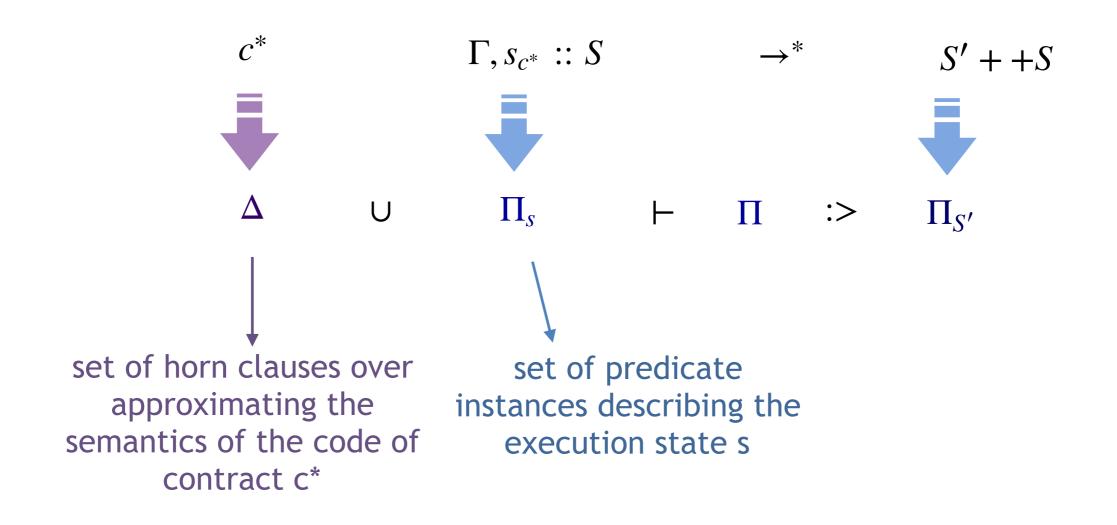
Specific application domain abstractions: T for unknown values, a for address of running contract, abstract memory representation, and most notably *calls to unknown contracts*

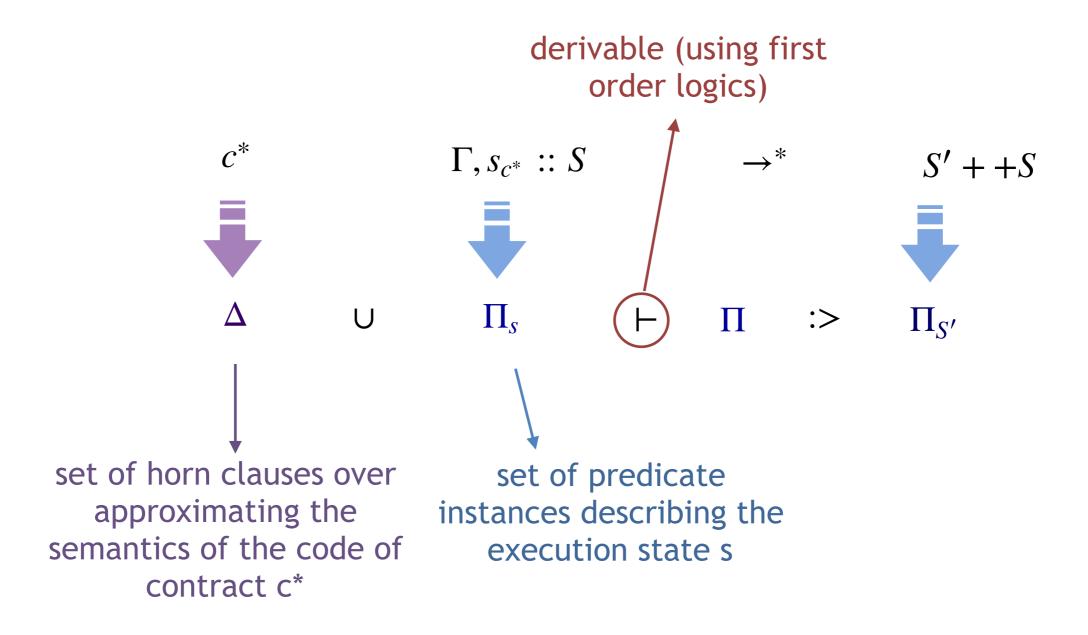
Static analysis for Ethereum smart contracts

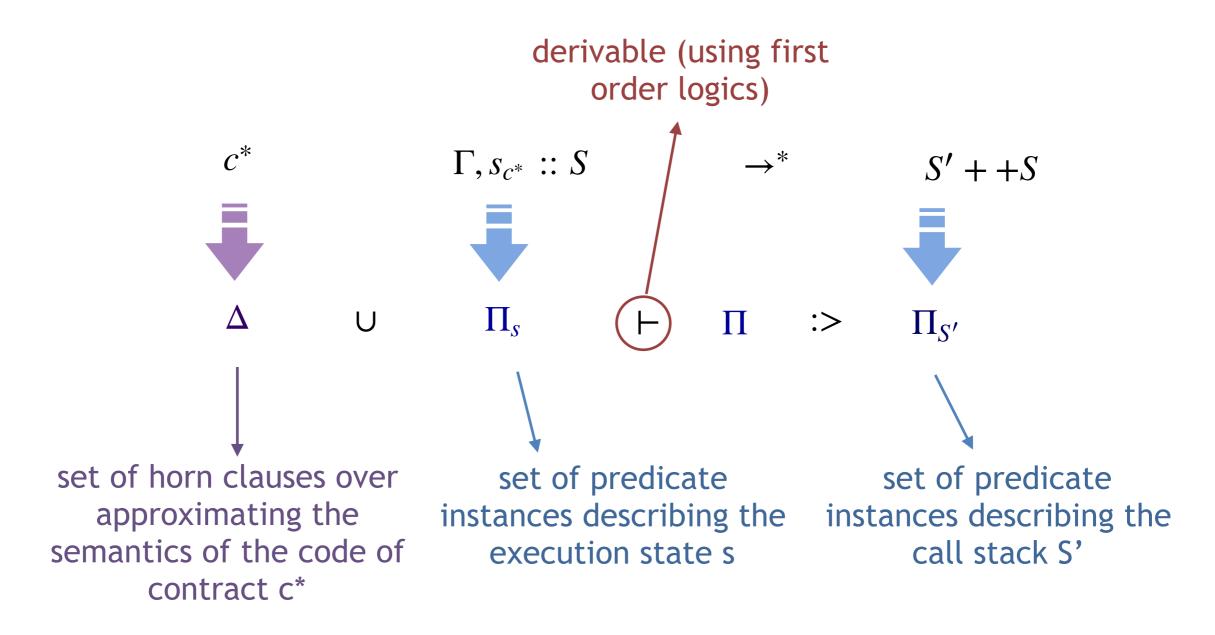
• Approach: abstract the EVM small-step semantics into Horn clauses that can be analysed using Z3

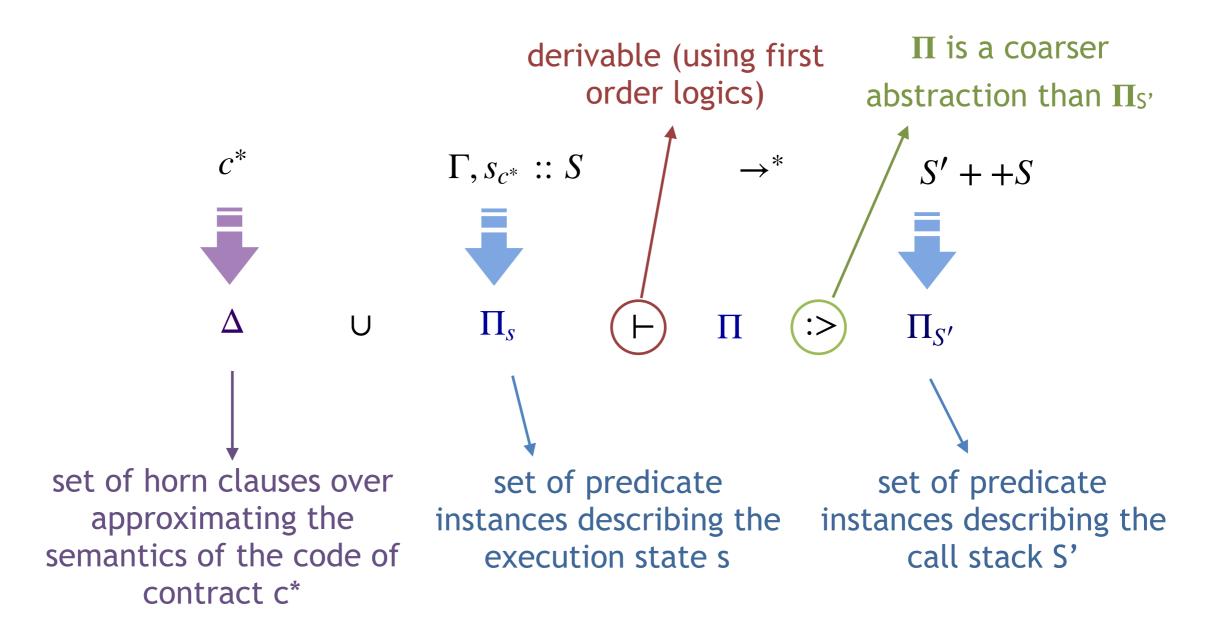




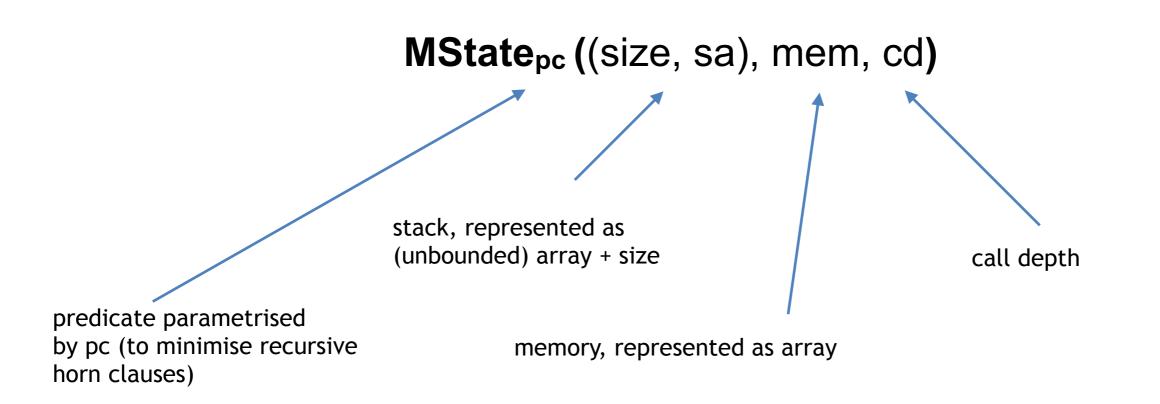








State abstraction



- Similar predicates for
 - global state
 - execution environment

- Execution steps modelled as Horn clauses
 - Horn clauses are generated according to the opcodes located at each pc
 - Example: Machine state rule for pc with opcode **ADD**

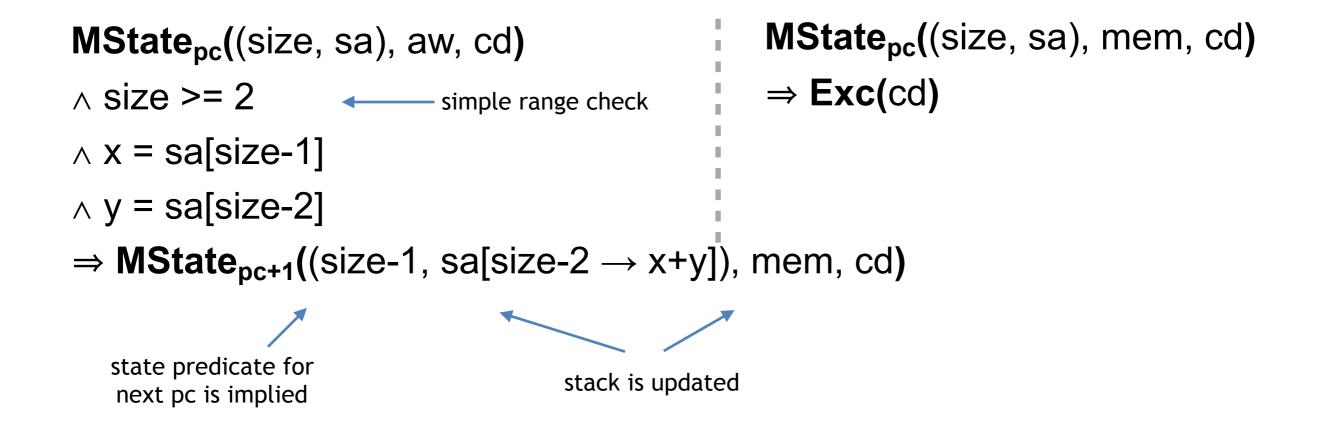
- Execution steps modelled as Horn clauses
 - Horn clauses are generated according to the opcodes located at each pc
 - Example: Machine state rule for pc with opcode ADD

```
\begin{aligned} &\mathsf{MState}_{\mathsf{pc}}((\mathsf{size}, \mathsf{sa}), \mathsf{aw}, \mathsf{cd}) \\ &\wedge \mathsf{size} \geq 2 \\ &\wedge \mathsf{x} = \mathsf{sa}[\mathsf{size-1}] \\ &\wedge \mathsf{y} = \mathsf{sa}[\mathsf{size-2}] \\ &\Rightarrow \mathsf{MState}_{\mathsf{pc+1}}((\mathsf{size-1}, \mathsf{sa}[\mathsf{size-2} \to \mathsf{x+y}]), \mathsf{mem}, \mathsf{cd}) \end{aligned}
```

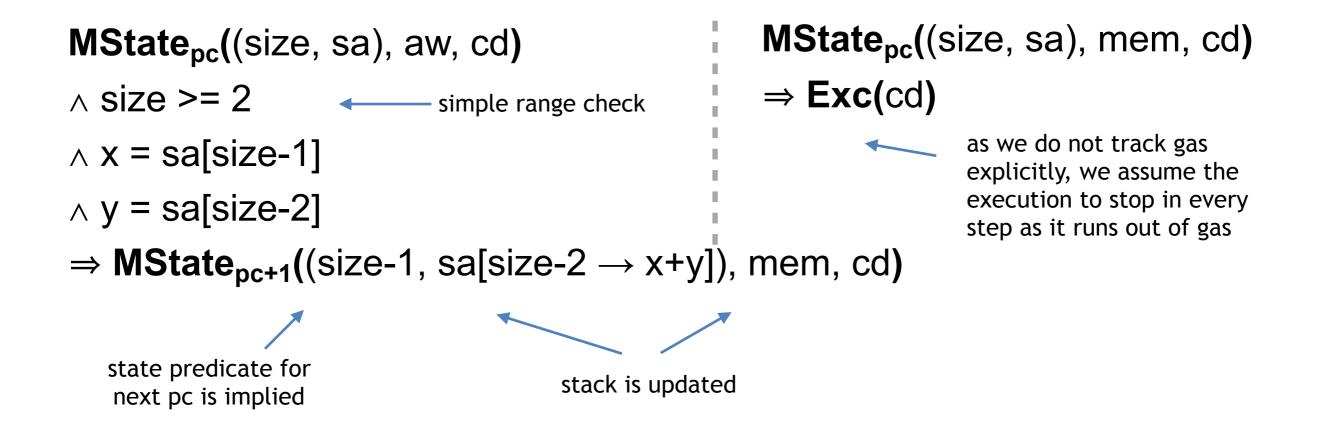
- Execution steps modelled as Horn clauses
 - Horn clauses are generated according to the opcodes located at each pc
 - Example: Machine state rule for pc with opcode ADD

 $MState_{pc}((size, sa), aw, cd)$ $\land size \ge 2 \qquad \qquad simple range check$ $\land x = sa[size-1]$ $\land y = sa[size-2]$ $\Rightarrow MState_{pc+1}((size-1, sa[size-2 \rightarrow x+y]), mem, cd)$ $state predicate for next pc is implied \qquad stack is updated$

- Execution steps modelled as Horn clauses
 - Horn clauses are generated according to the opcodes located at each pc
 - Example: Machine state rule for pc with opcode ADD



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- Execution steps modelled as Horn clauses
 - Horn clauses are generated according to the opcodes located at each pc
 - Example: Machine state rule for p

tt's a bit than that **MState_{pc}(**(size, sa), aw, cd) \wedge size >= 2 \wedge x = sa[size-1] \wedge y = sa[size-2] \Rightarrow **MState**_{pc+1}((size-1,

state predicate for next pc is implied

stack is updated

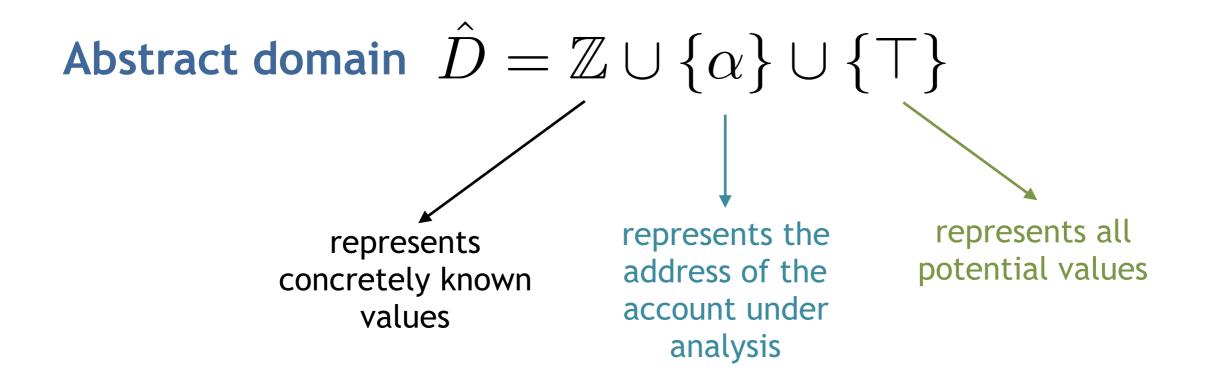
ba), mem, cd**)**

as we do not track gas explicitly, we assume the execution to stop in every step as it runs out of gas

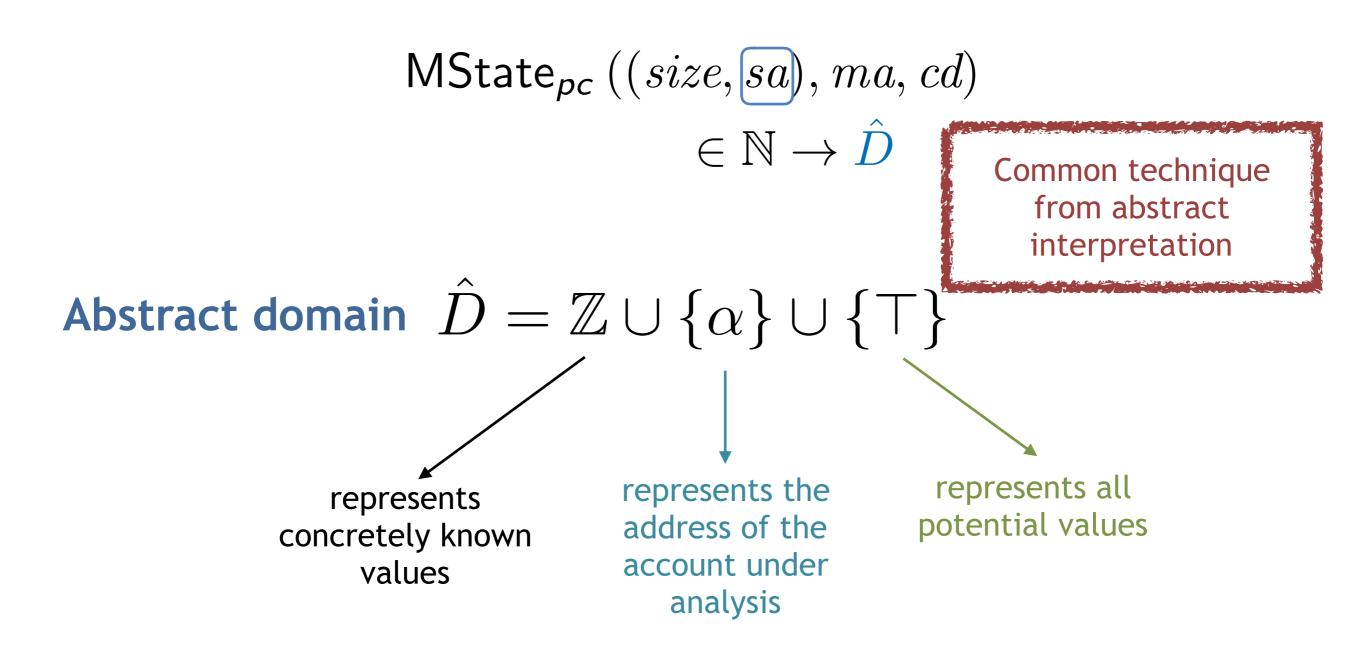
ode ADD

Abstract Domain

$$\mathsf{MState}_{pc} ((size, sa), ma, cd) \\ \in \mathbb{N} \to \hat{D}$$



Abstract Domain



• There are a lot of values that we do not know statically:

TIMESTAMP, PUSH 2, ADD **?**

• There are a lot of values that we do not know statically:

only known when TIMESTAMP, PUSH 2, ADD ? contract is called on blockchain

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only known when TIMESTAMP, PUSH 2, ADD
$$7 T \Rightarrow 7 T T T T T T T$$

• Sometimes we still want to be precise:

ADDRESS, BALANCE

• There are a lot of values that we do not know statically:

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$$7$$
 T \Rightarrow T \Rightarrow T \Rightarrow T \Rightarrow T

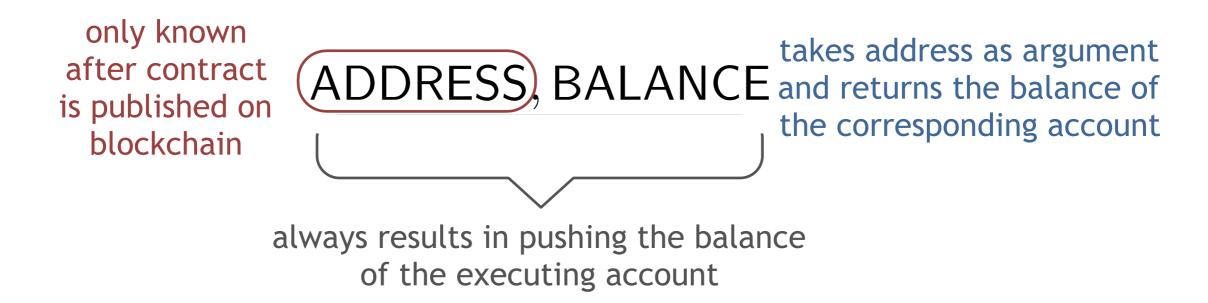
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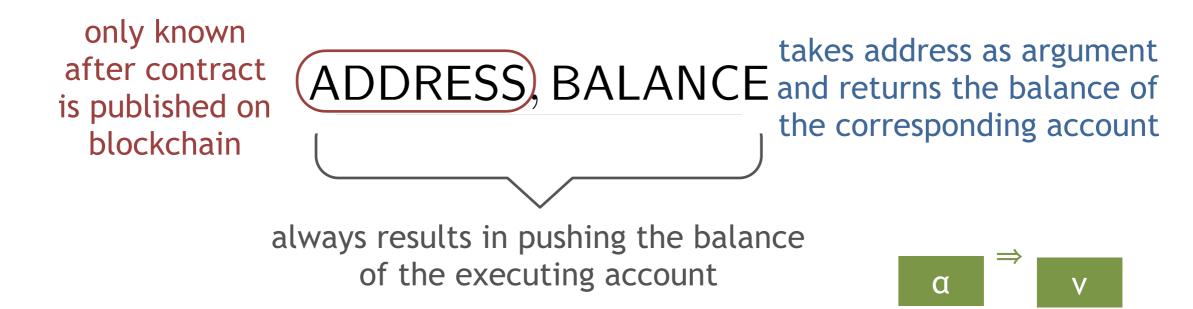
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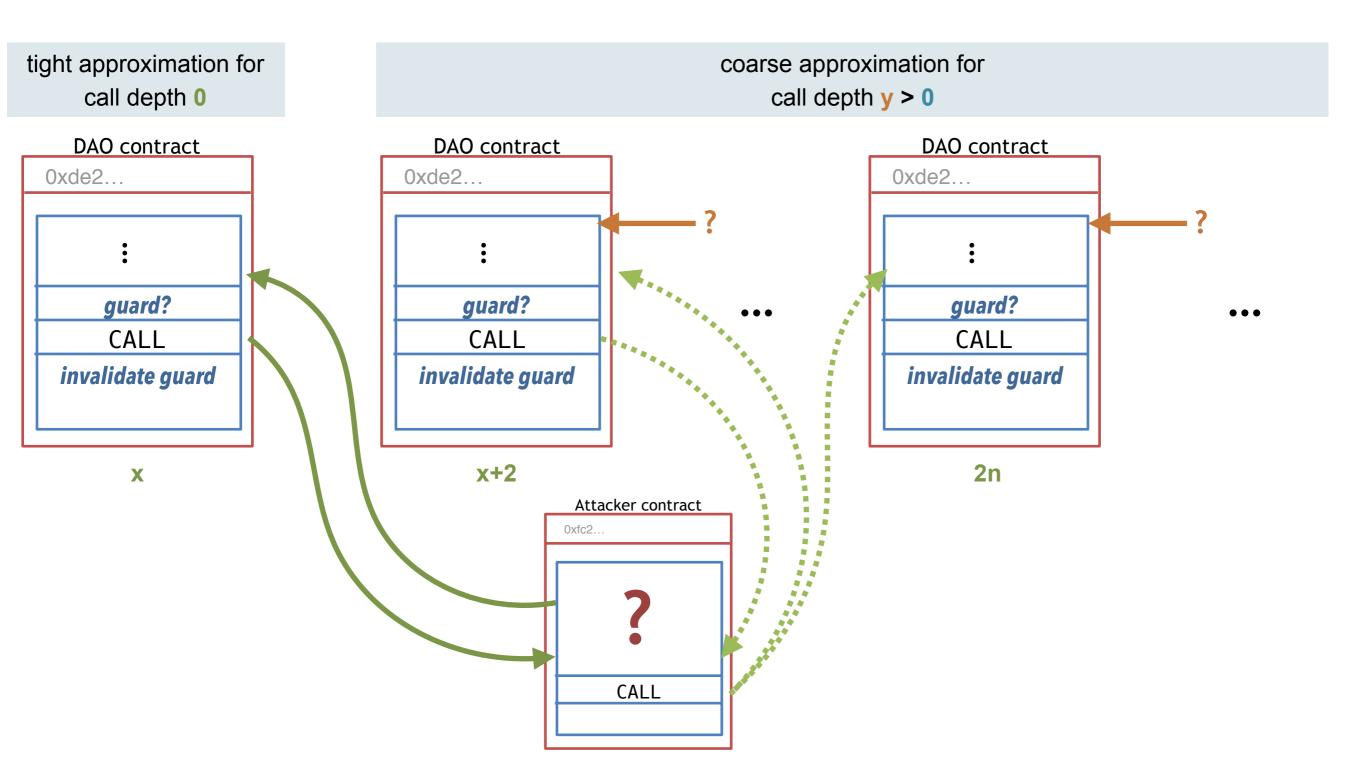
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 T \Rightarrow T \Rightarrow T \Rightarrow T \Rightarrow T

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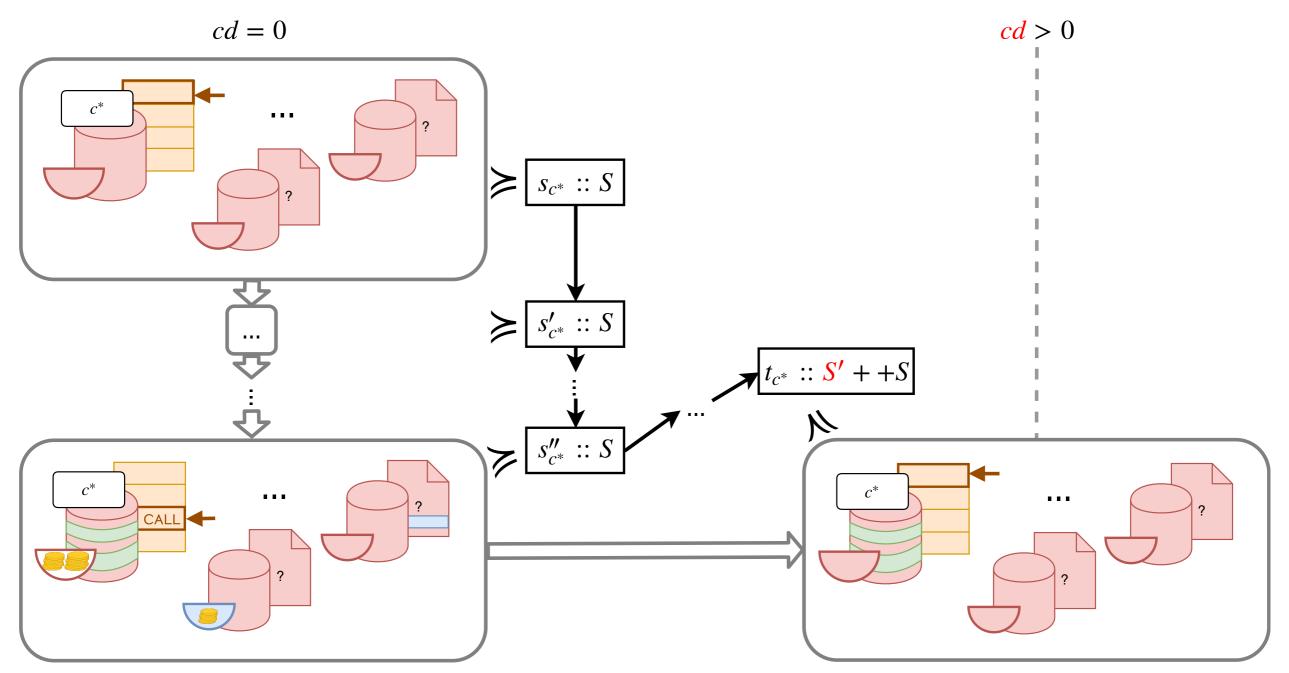


Abstracting calls - Intuition

 For analysing a specific contract all its executions need to be approximated



Abstract semantics - Call rule



Abstract semantics - Call rule

preconditions are checked: enough elements on the stack, enough gas

 $\mathsf{MState}_{pc} \left((size, sa), ma, cd \right) \land size > 3 \land \hat{va} = sa[size - 2] \land \hat{va} \stackrel{\frown}{\leq} \hat{b} \\ \land \mathsf{GState}_{pc} \left(\alpha, \hat{b}, sta, cd \right) \land cd' > cd \Rightarrow \mathsf{MState}_{0} \left((0, \lambda x.\top), \lambda x.0, cd' \right) \\ \end{cases}$

contract might be reentered execution starts at pc 0 in fresh at an arbitrarily higher call machine state: depth empty stack + memory initialised to all zeros

$$\mathsf{MState}_{pc} ((size, sa), ma, cd) \land size > 3 \land \hat{va} = sa[size - 2] \land va \stackrel{\frown}{\leq} \hat{b} \land \mathsf{GState}_{pc} (\alpha, \hat{b}, sta, cd) \land cd' > cd \Rightarrow \mathsf{ExEnv} (\alpha, \Box, cd')$$

when reentering the active account at the the input to the reentering point of calling is (still) the actor call is unknown

Abstract semantics - Call rules

 $\mathsf{MState}_{pc} \left((size, sa), ma, cd \right) \land size > 3 \land \hat{va} = sa[size - 2] \land \hat{va} \stackrel{\geq}{\leq} \hat{b} \\ \land \mathsf{GState}_{pc} \left(\alpha, \hat{b}, sta, cd \right) \land cd' > cd \Rightarrow \mathsf{GState}_0 \left(\alpha, \top, sta, cd' \right) \\ \end{cases}$

the global storage of the active account is preserved

the balance might be arbitrarily changed

 $\mathsf{MState}_{pc} \left((size, sa), ma, cd \right) \land size > 3 \land \hat{va} = sa[size - 2] \land \mathsf{GState}_{pc} \left(\alpha, \hat{b}, sta, cd \right) \land \hat{va} \leq \hat{b} \land \mathsf{GState}_{pc} \left(\dot{a}, \hat{b}^*, sta^*, cd \right) \land \dot{a} \neq \alpha \land cd' > cd \Rightarrow \mathsf{GState}_0 \left(\dot{a}, \top, [\top], cd' \right)$

all addresses different from the actor can have arbitrary storage (all positions mapped to T)

This is actually an artefact: the storage of other accounts but the active account cannot be accessed anyways given that only plain calls are executed

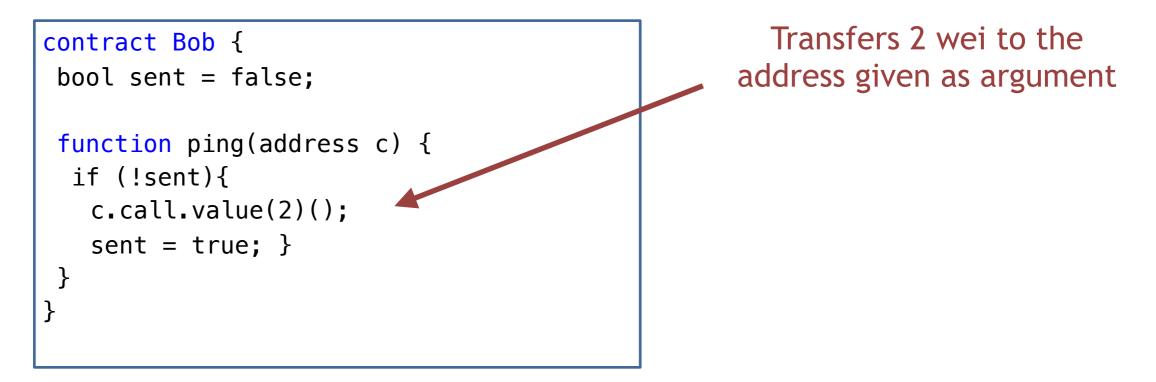
Checking for singleentrancy

- How to check for single-entrancy now?
- Simple example:

```
contract Bob {
  bool sent = false;
  function ping(address c) {
    if (!sent){
      c.call.value(2)();
      sent = true; }
  }
}
```

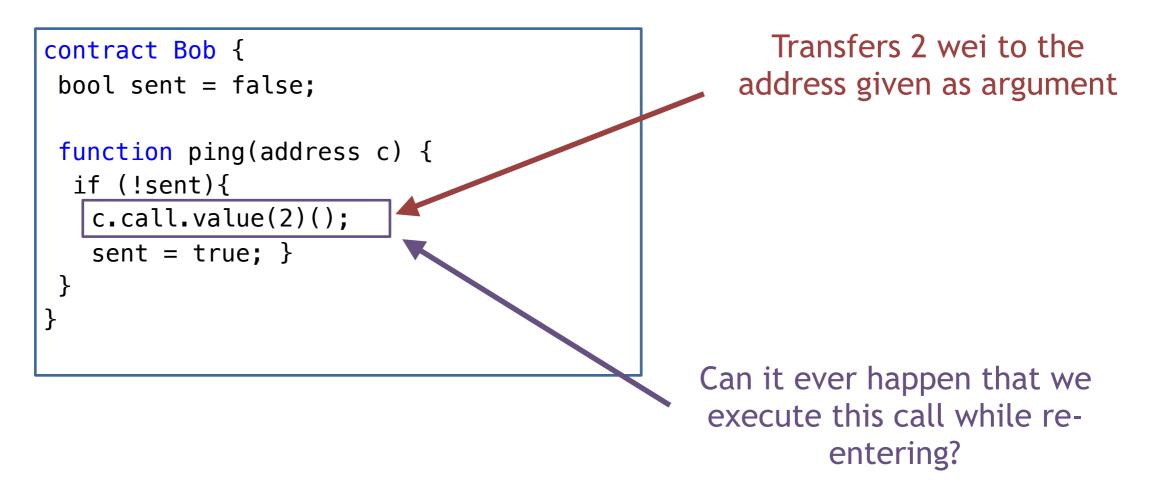
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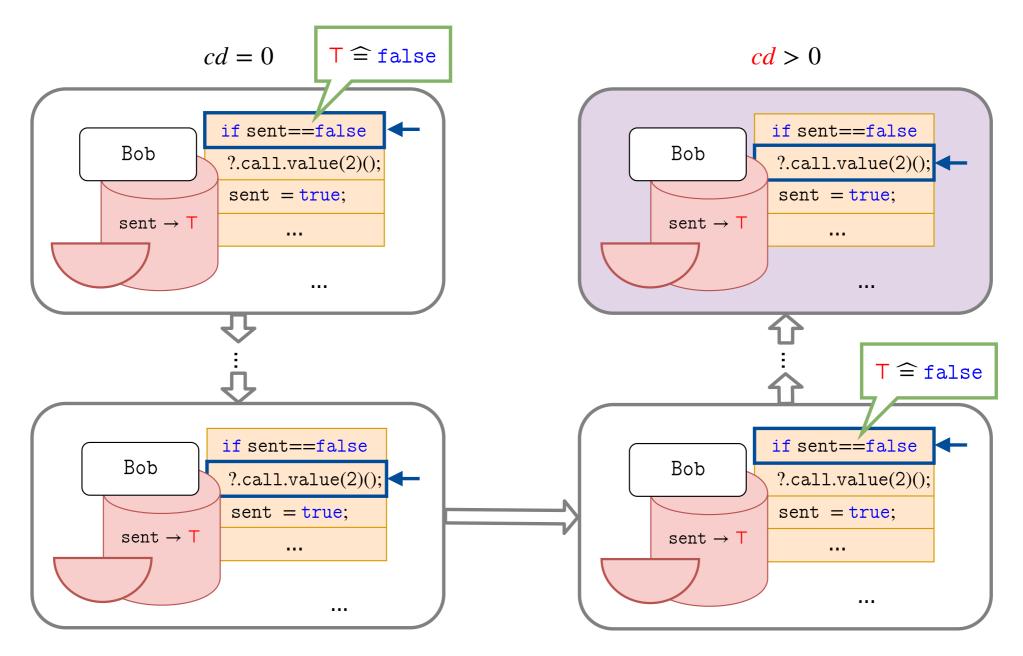


Checking for singleentrancy

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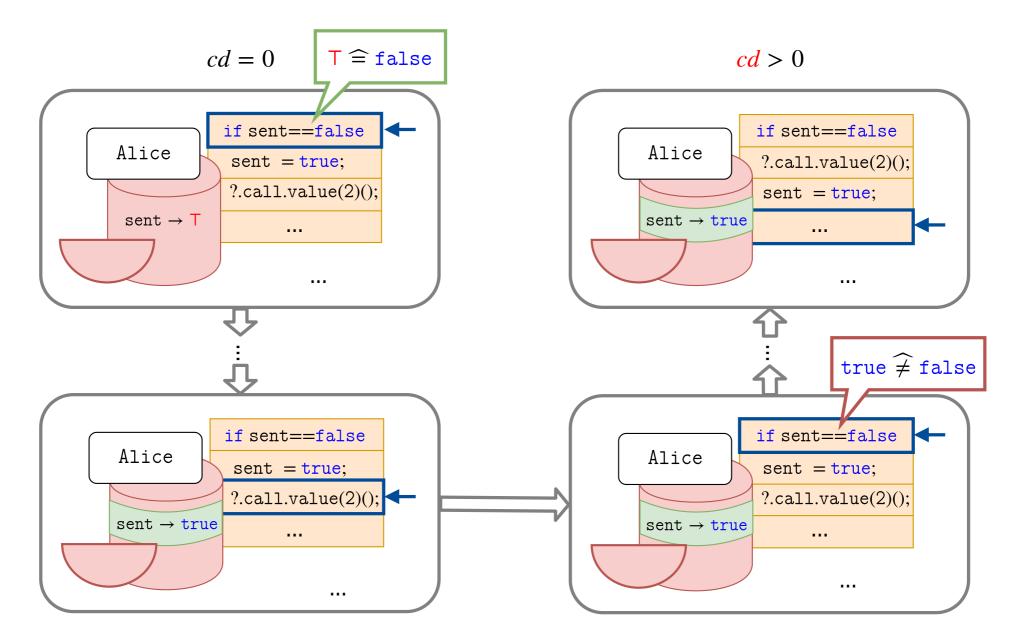
Detecting reentrancy



Reachability query

$$cd > 0$$
 \land $(2)();$

Proving single-entrancy



Reachability query

$$cd > 0$$
 \land $(2)();$

EtherTrust

- Approach scales to full EVM bytecode!
- We implemented EtherTrust a tool for static analysing Ethereum bytecode



EtherTrust

- Approach scales to full EVM bytecode!
- We implemented EtherTrust a tool for static analysing Ethereum bytecode



Average running time: much faster than the best state-ofthe art bug finding tool... and sound!

10k	\sum	# ter. SE	# SE	# ter. MI	$\# \overline{\mathrm{MI}}$	Øt	
0	148	18	12	(18)	3	26,5	
ET	140	100	4	107	2	2,8	

- SE: Single entrancy
- MI: Independence of miner controlled state
- #X: Number of contracts reported to violate X

#ter. X: Number of contracts for which the analysis terminates

O: Oyente (state-of-the-art) bug finder ET: EtherTrust

Simplifications in this tutorial

- Simplified gas treatment (constant gas cost of 1)
- Inherent exception propagation (all available gas is given to the caller)
- Simplified memory treatment (only memory cells are accessed, never fragments; word indexed memory)
- computations on logical (instead of bounded) integers
- No limits on call stack and machine stack
- Some interesting opcodes are omitted (DELEGATECALL, CALLCODE, **CREATE**, ...)

Simplifications in this tutorial

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security and	cyber-physical	distributed
privacy	systems	systems

THE PROGRAM

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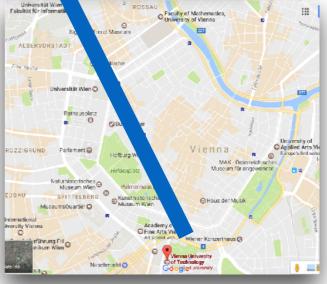




FFG Österreichische Forschurzsfärd











• Abstract operations:

• Abstract operations:

$$n \stackrel{\frown}{+} m := n + m$$
$$\hat{v} \stackrel{\frown}{+} \top := \top$$
$$\top \stackrel{\frown}{+} \hat{v} := \top$$
$$\hat{v} \stackrel{\frown}{+} \alpha := \top$$
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No constraints are collected for computations with T

Abstract address is 'supertyped' once it is modified

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$$n \widehat{=} m := \{n = m\}$$

$$\alpha \widehat{=} \alpha := \{true\}$$

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Comparisons with unknown values evaluate to both true and false

Abstract ADD - revisited

 $\begin{aligned} \mathsf{MState}_{pc} \left((size, sa), ma, cd \right) & \mathsf{MState}_{pc} \left((size, sa), ma, cd \right) \\ & \wedge size > 1 & \Rightarrow \mathsf{Exc} \left(cd \right) \\ & \wedge \hat{x} = sa[size - 1] \\ & \wedge \hat{y} = sa[size - 2] \\ & \Rightarrow \mathsf{MState}_{pc+1} \left((size - 1, sa[size - 2 \rightarrow \hat{x} + \hat{y}]), ma, cd \right) \\ & & \uparrow \end{aligned}$

Abstract Memory access

 $ma \in \hat{D}/\{\alpha\} \to \hat{D}$ \swarrow Memory positions
can't be a
Memory values
come from the
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Abstract Memory access

 $ma \in \hat{D}/\{\alpha\} \to \hat{D}$

Memory positions can't be α Memory values come from the abstract domain

MSTORE

$$\begin{split} \mathsf{MState}_{pc} \left((size, sa), ma, cd \right) \\ \wedge \ size > 1 \\ \wedge \ \hat{x} &= sa[size - 1] \\ \wedge \ \hat{p} &= (\hat{x} = \alpha) \ ? \ \top \ : \ \hat{x} \\ \wedge \ \hat{y} &= sa[size - 2] \\ \Rightarrow \mathsf{MState}_{pc+1} \left((size - 2, sa), ma[\hat{p} \to \hat{y}], cd \right) \end{split}$$

Abstract Memory access

 $ma \in \hat{D}/\{\alpha\} \to \hat{D}$

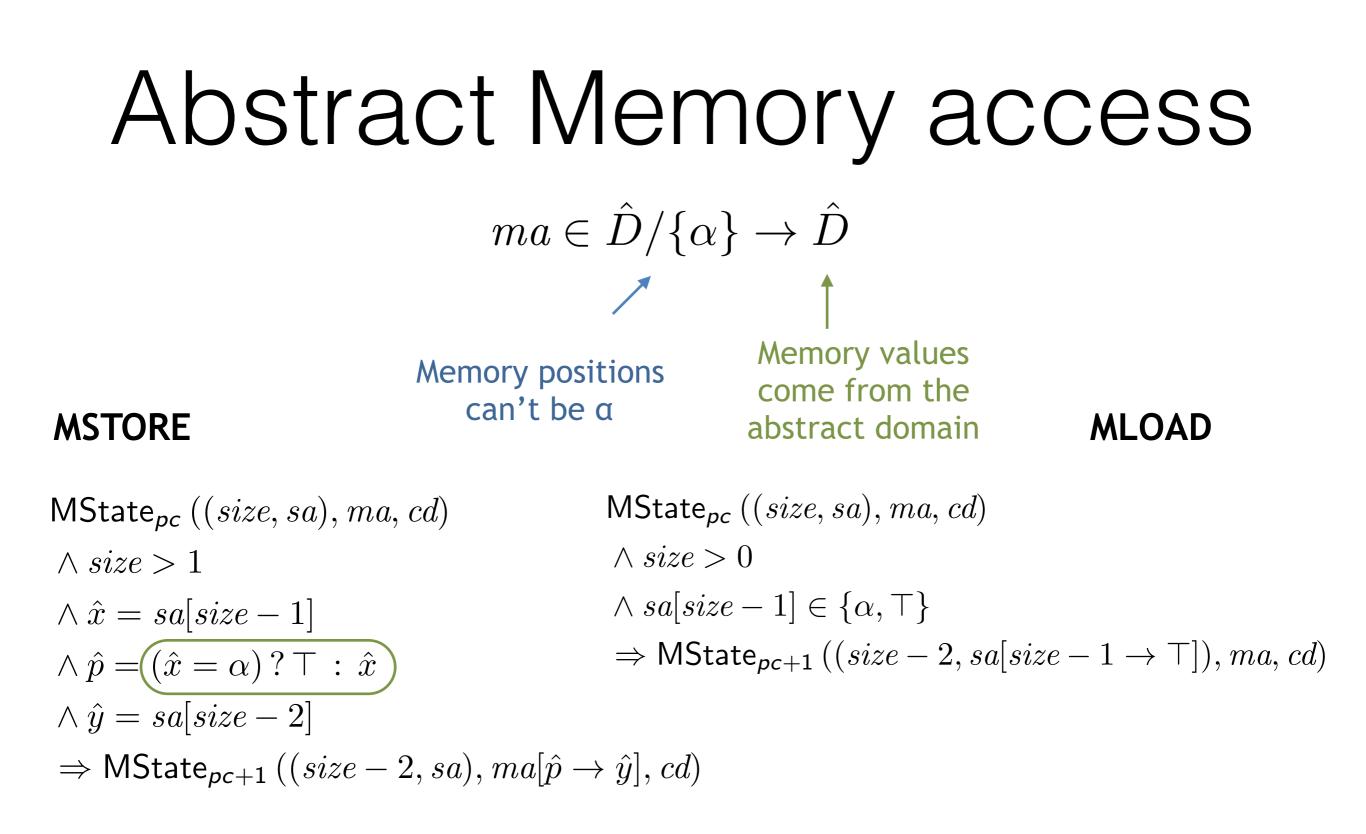
Memory positions can't be α Memory values come from the abstract domain

MSTORE

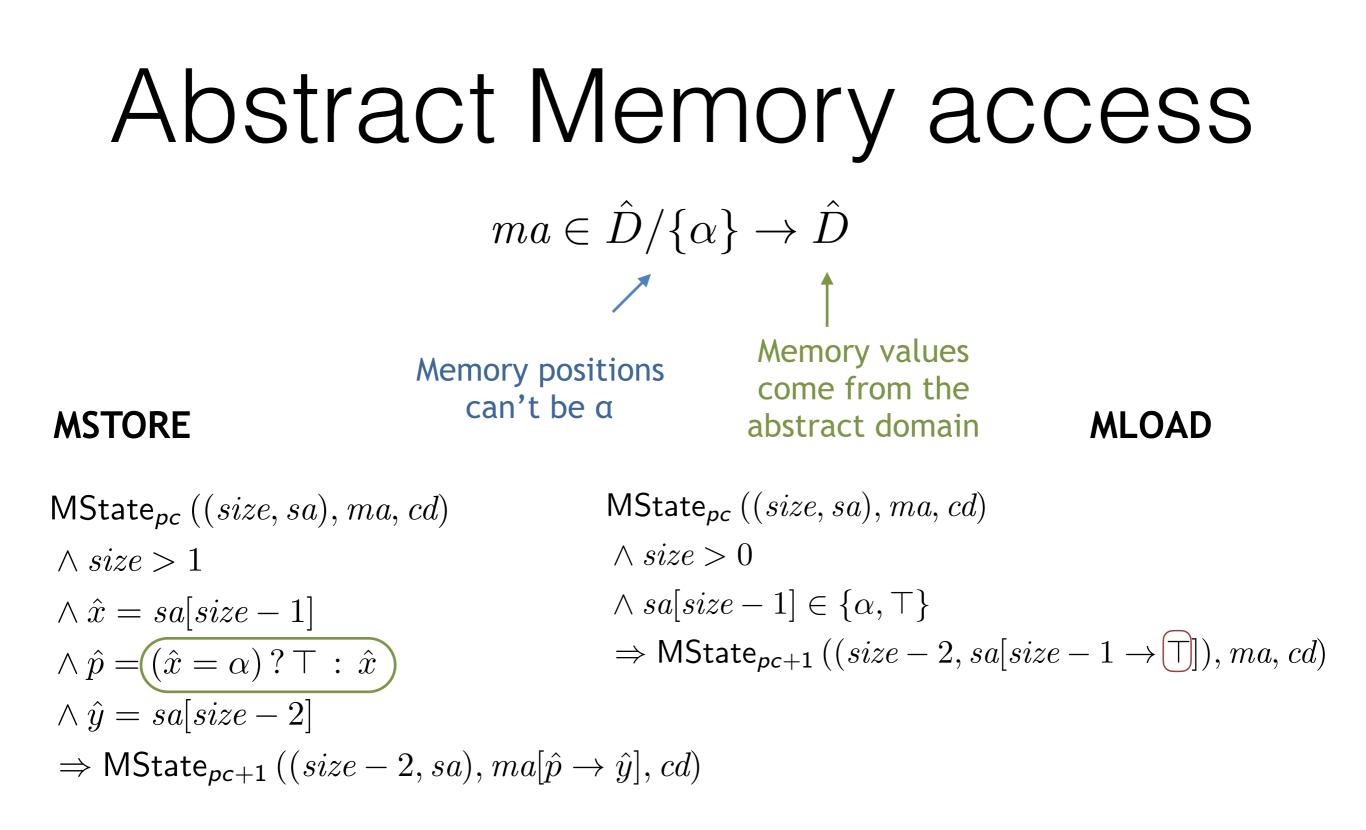
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Instead of writing to α, we write to T

writing to T means "writing everywhere"



Instead of writing to α , writing to T means we write to T "writing everywhere"



Instead of writing to α, we write to T

writing to T means "writing everywhere" Instead of "reading from everywhere", we simply read T

Abstract Memory access - continued

 $\begin{aligned} \mathsf{MState}_{pc} \left((size, sa), ma, cd \right) \\ \wedge size &> 0 \\ \wedge n &= sa[size - 1] \\ \Rightarrow \mathsf{MState}_{pc+1} \left((size, sa[size - 1 \rightarrow ma[n]]), ma, cd \right) \end{aligned}$

MLOAD

$$\begin{aligned} \mathsf{MState}_{pc} \left((size, sa), ma, cd \right) \\ \wedge size &> 0 \\ \wedge n &= sa[size - 1] \\ \Rightarrow \mathsf{MState}_{pc+1} \left((size, sa[size - 1 \rightarrow ma[\top]]), ma, cd \right) \end{aligned}$$

Abstract Memory access - continued

 $\begin{aligned} \mathsf{MState}_{pc} \left((size, sa), ma, cd \right) \\ \wedge size &> 0 \\ \wedge n &= sa[size - 1] \\ \Rightarrow \mathsf{MState}_{pc+1} \left((size, sa[size - 1 \rightarrow ma[n]]), ma, cd \right) \end{aligned}$

MLOAD

When reading the memory at a concrete position, we additionally need to read from T, as there we can find the values that have been written everywhere

 $\Rightarrow \mathsf{MState}_{\textit{pc}+1} \left((\mathit{size}, \mathit{sa[size-1 \rightarrow \mathit{ma[T]}]}), \mathit{ma, cd} \right)$

 MState_{pc} ((size, sa), ma, cd)

 \wedge size > 0

 $\wedge n = sa[size - 1]$