

# Smart Contract Security and Fairness

## *A Tale of Two Contending Parties*

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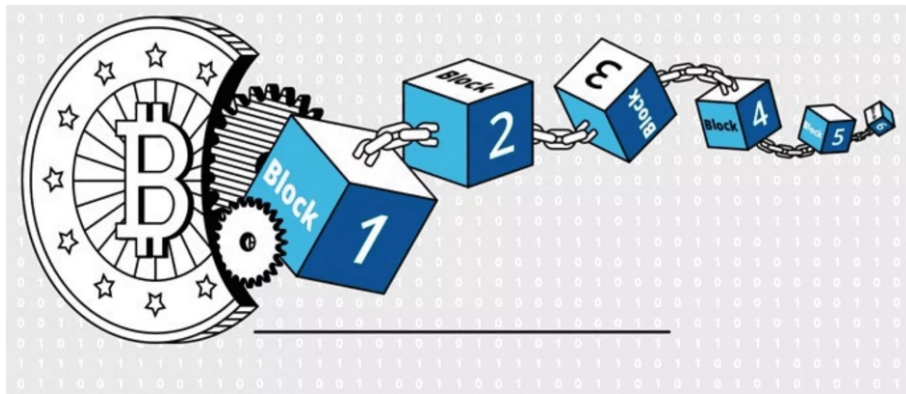
Online  
May 13, 2021



# Why is blockchain such a big thing?

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Internet is the information superhighway



Blockchain is the Internet of value (trust)

# Smart Contracts

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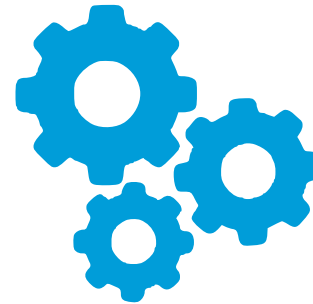
User-defined computer programs running on top of blockchain



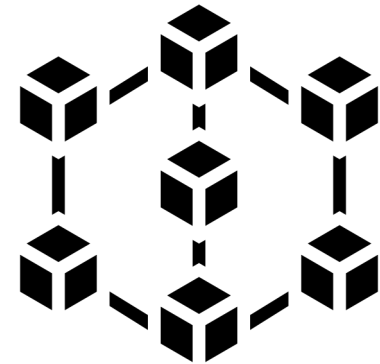
**Users**



**Smart Contract**



**Execution**



**Blockchain**

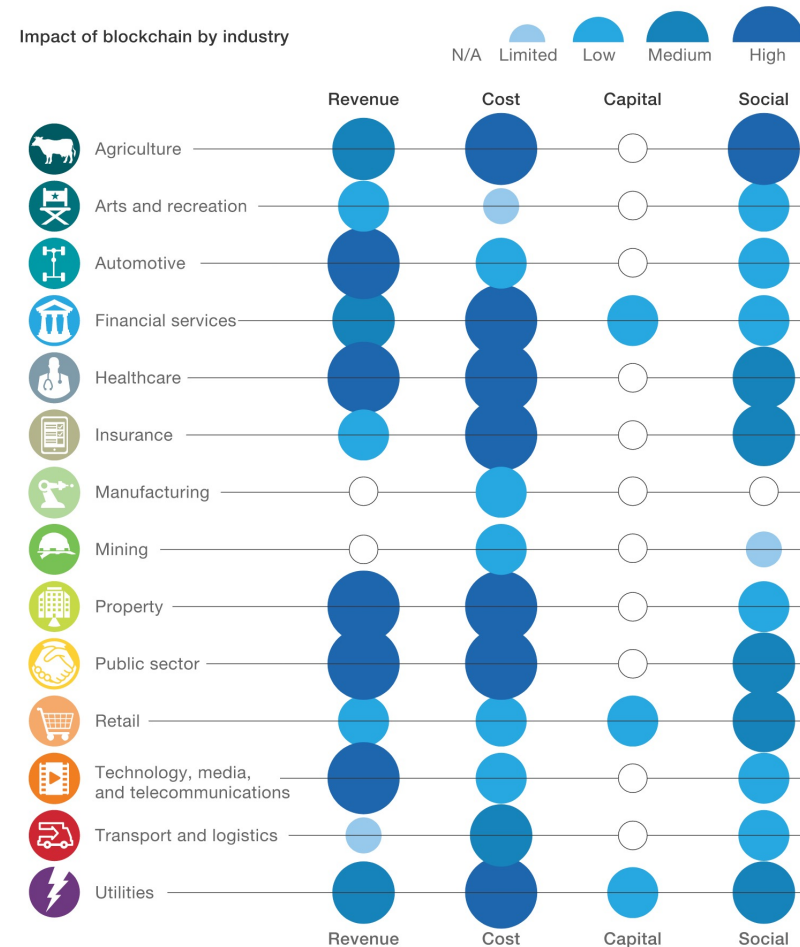
# Smart Contracts

- Managing exchange of digital assets
- Applications across many different sectors
- **Ethereum** in 2020:
  - **825,895** smart contracts created in February
  - **2,855** DApps
  - **31.59K** active users / Day
  - **1.143M (\$670M)** transactions / Day

Sources:

Ethereum Statistics: [https://ycharts.com/indicators/reports/ethereum\\_statistics](https://ycharts.com/indicators/reports/ethereum_statistics)

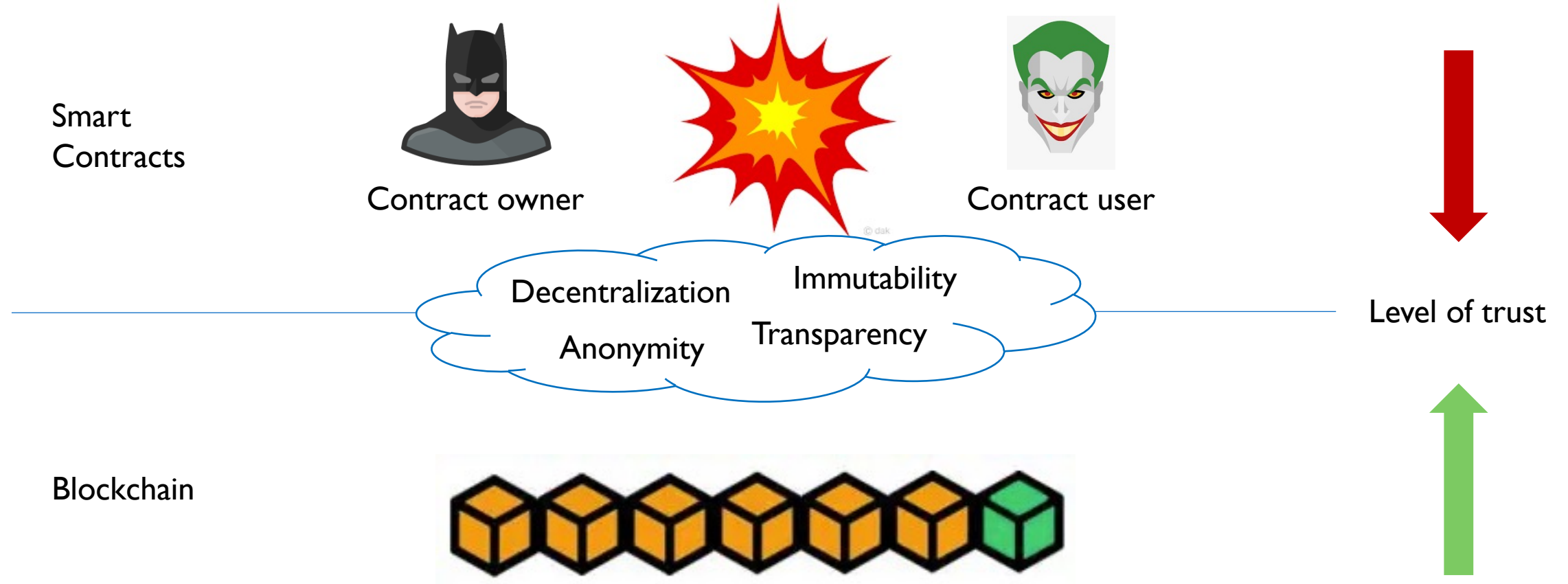
Consensys: <https://consensys.net/blog/news/ethereum-by-the-numbers-may-2020/>



McKinsey&Company

# In code we trust? No!

Problem: establishing trust between parties with conflicting interests





# Story I

Who moved my Ether?

# Blockchain/Smart Contracts Security Incidents

- 2019/01 51% attack on Ethereum Classic, \$200K of Loss
- 2018/06 Bithumb Hacks with \$31 Million Dollars Stolen
- 2018/05 **EDU, BAIC Smart Contracts Bugs**
- 2018/04 **BEC, SMT Smart Contracts Bugs**
- 2018/04 Myetherwallet Suffer from DNS Hijacking
- 2018/02 BitGrail Hacks with Stolen Nano Tokens of 170 Milli
- 2018/01 Dollars Coincheck Hacks with 530 Million Dollars S
- 2017/12 Nicehash Hacks with 4700 BTC Missing with 62 Million Dollars
- 2017/06 **Bithumb Hacks with 1 Billion Korean Yuan Loss and 30 Thousand User**
- 2016/08 Info. Leaked Bitfinex Hacks with 120,000 BTC Stolen of 75 Million Dollars
- 2016/01 **Cryptsy Hacks with 13,000 BTC and 300,000 LTC**
- 2015/01 Stolen Bitstamp Hacks with 19,000 BTC Stolen
- 2014/03 Poloniex Hacks with 12.3% BTC Lost
- 2014/02 Mt.Gox Hacks with Followed Bankruptcy



# Example: the DAO attack



## Attacker's Contract

```
function moveBalance() {  
    dao.withdraw();  
}  
...  
function () payable {  
    dao.withdraw();  
}
```



## DAO Contract

```
mapping(address => uint) balances;  
function withdraw() {  
    uint amount = balances[msg.sender];  
    msg.sender.call.value(amount)();  
    balances[msg.sender] = 0;  
}
```

Calls the default "fallback" function

withdraw()

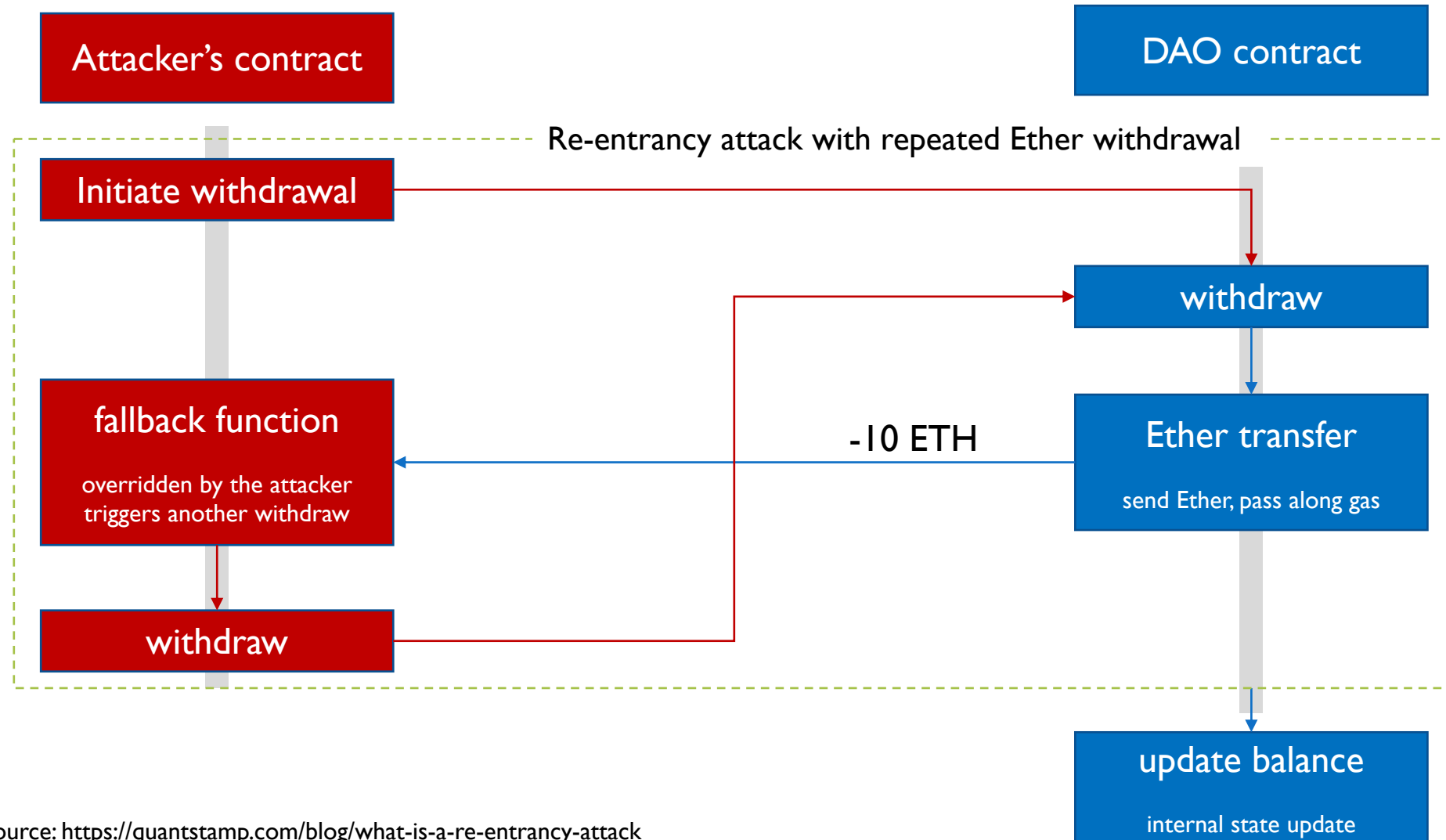
10 ether

withdraw()

.....



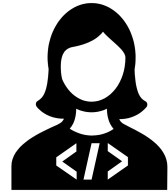
# Example: the DAO attack



# Moral of the story

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Contract developers' expectations  $\neq$  how the contract code actually works



Contract Developer

$\neq$



Attacker



# Story 2

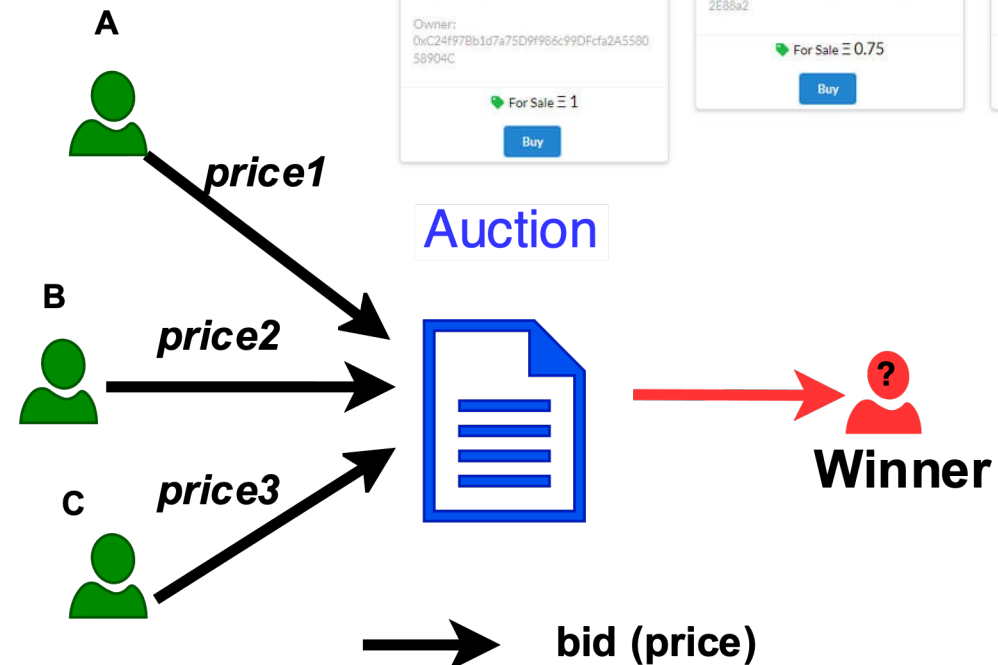
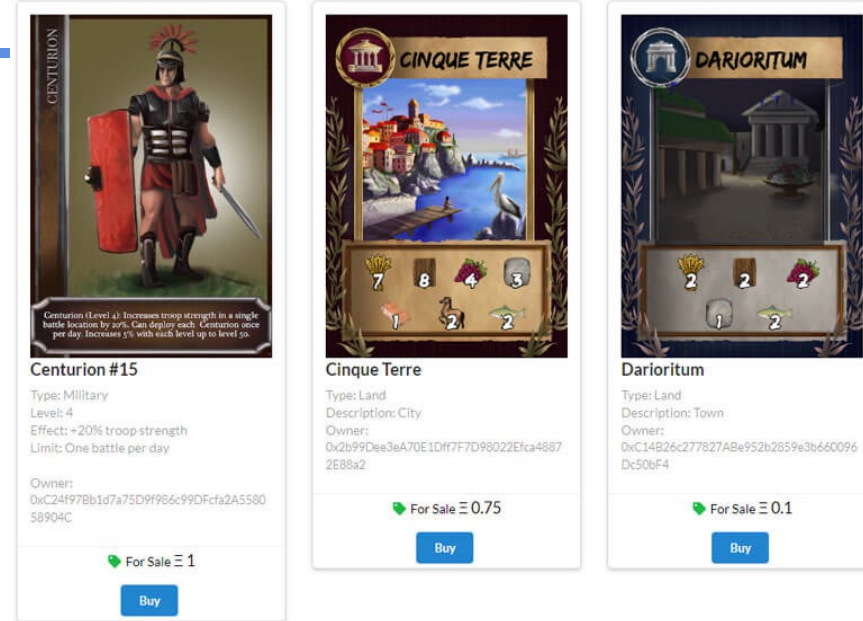
All I want is my fair share

# An Auction Smart Contract

- Open to all bidders
- *highestBidder* wins the bid
- Latecomer wins when bidding **\$1** more than the *highestBid*

```

contract CryptoRomeAuction {
    uint256 public highestBid = 0;
    address payable public highestBidder;
    mapping(address=>uint) refunds;
    function bid() public payable{
        uint duration = 1;
        if (msg.value < (highestBid + duration)){
            revert();
        }
        if (highestBid != 0) {
            refunds[highestBidder] += highestBid;
        }
        highestBidder = msg.sender;
        highestBid = msg.value;
    }
}
    
```

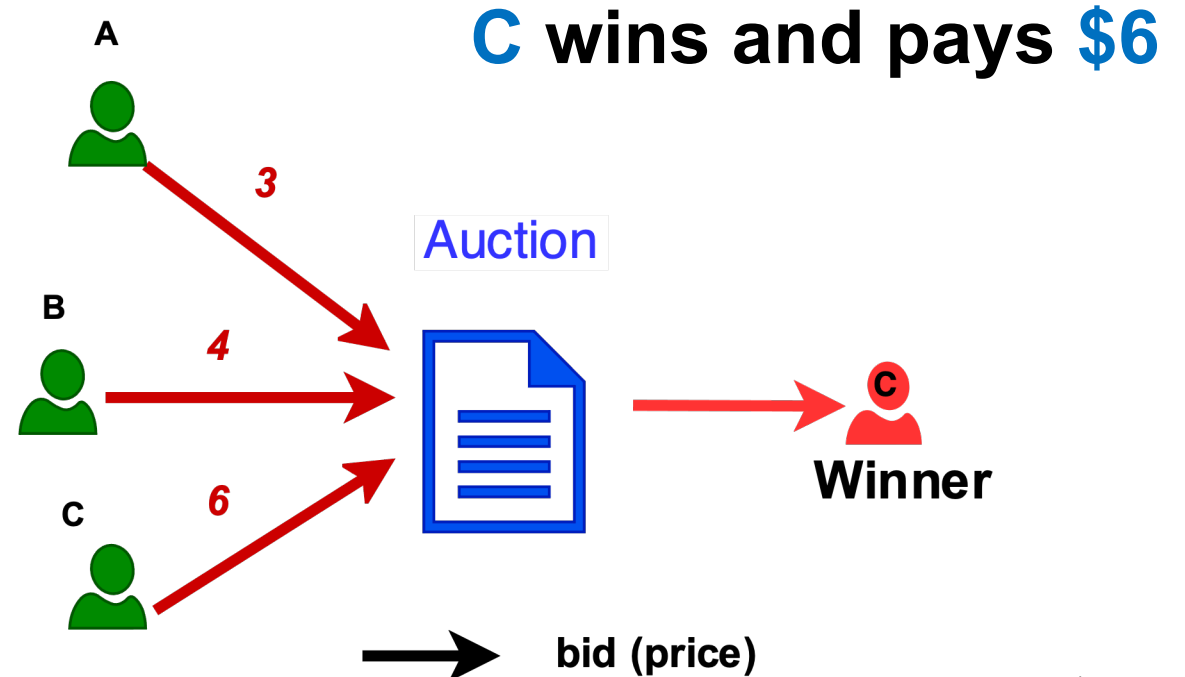


# An Auction Smart Contract

- Open to all bidders
- *highestBidder* wins the bid
- Latecomer wins when bidding **\$1** more than the *highestBid*

Bidder	Valuation	Bid Price
A	3	3
B	4	4
C	6	6

```
contract CryptoRomeAuction {
  uint256 public highestBid = 0;
  address payable public highestBidder;
  mapping(address=>uint) refunds;
  function bid() public payable{
    uint duration = 1;
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    }
    if (highestBid != 0) {
      refunds[highestBidder] += highestBid;
    }
    highestBidder = msg.sender;
    highestBid = msg.value;
  }
}
```



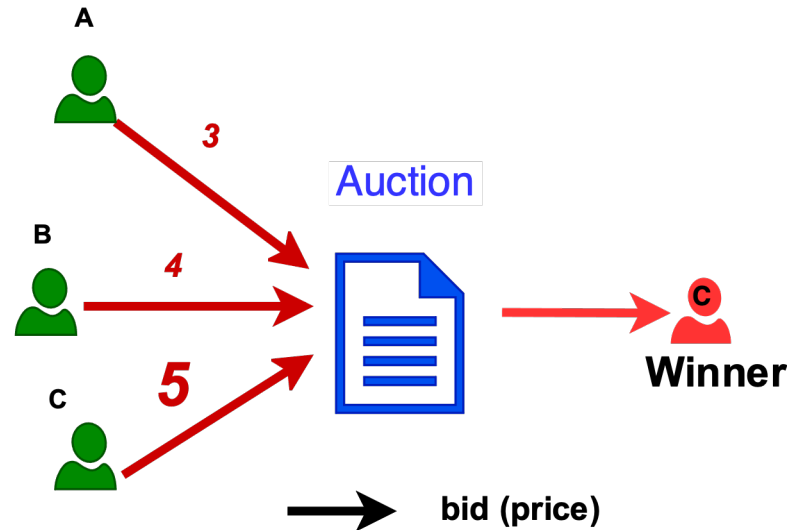
# Threats to “Smart” Auction Fairness



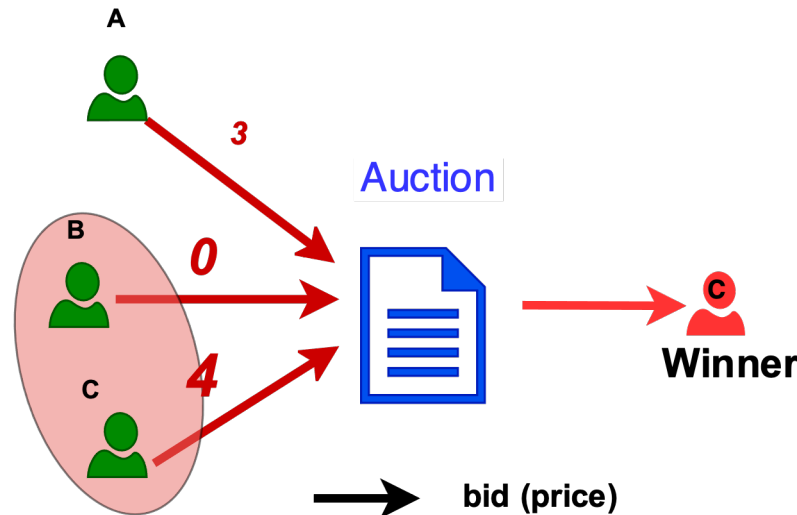
Untruthful behaviors



Collusion among bidders

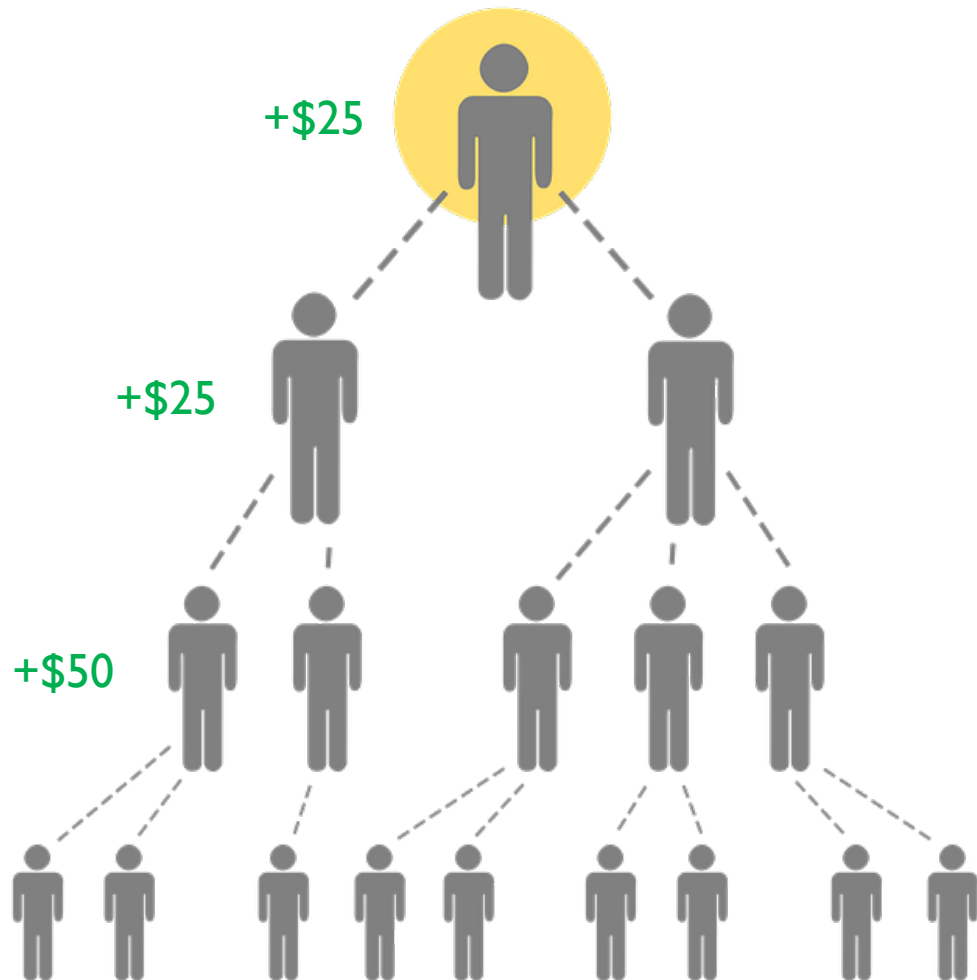


- **C** wins but pays only **\$5**
- Auctioneer **loses**



- **B and C** win and only pay **\$4** in total
- Both auctioneer and other bidders **lose**

# A “Smart” Ponzi Scheme



```
16 function enter(address inviter) public {
17     if ((msg.value < 1 ether) ||
18         (tree[msg.sender].inviter != 0x0) ||
19         (tree[inviter].inviter == 0x0)) throw;
20
21     tree[msg.sender] = User({itself: msg.sender,
22                             inviter: inviter});
23     address current = inviter;
24     uint amount = msg.value;
25     while (next != top) {
26         amount = amount/2;
27         current.send(amount);
28         current = tree[current].inviter;
29     }
30     current.send(amount);
31 }
```

# Moral of the story

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Contract participants' interpretation  $\neq$  how the game rules are actually written



Malicious  
contract owner (or  
other participants)

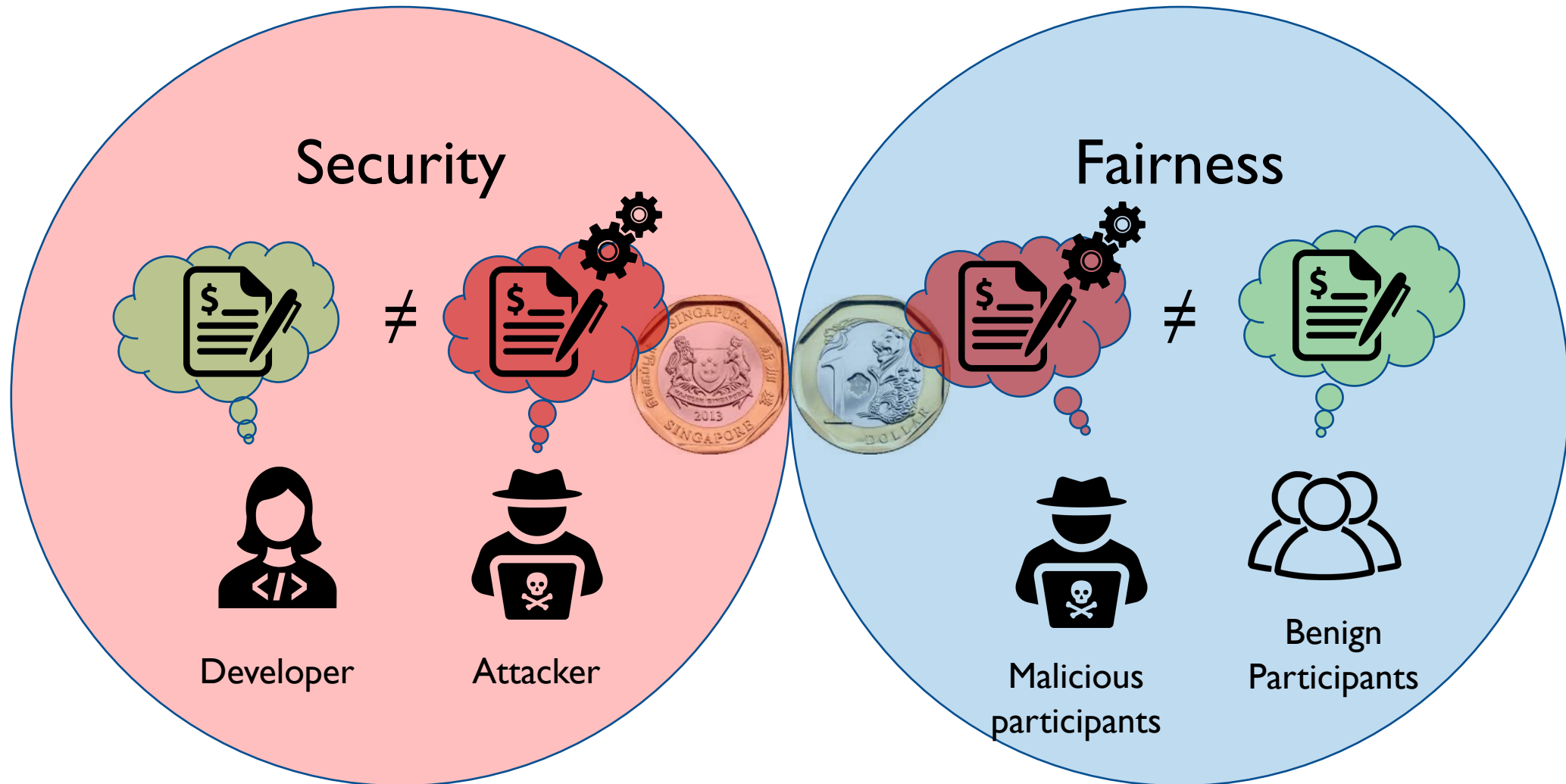
$\neq$



Benign  
Participants

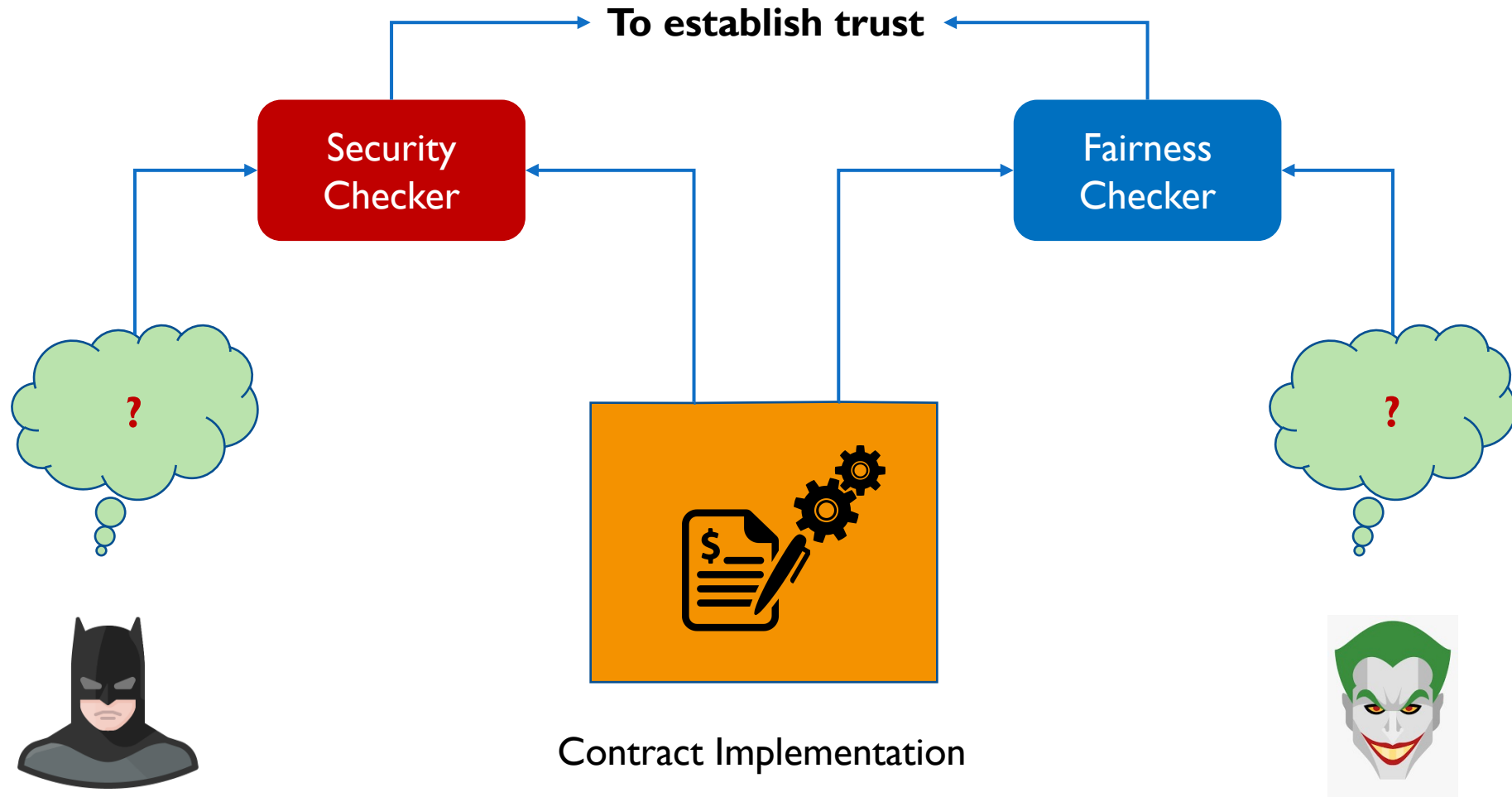


# Smart Contracts: Security vs Fairness



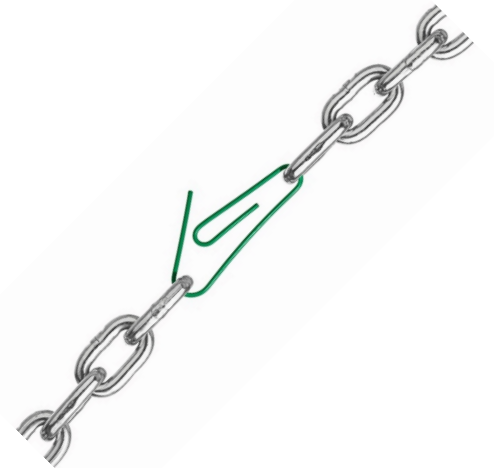
# Establishing Trust between Contending Parties

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# A Typical Security Checker

- Check for pre-defined (high-profile) *attack patterns*
  - Reentrancy
    - The DAO attack (3.5 million Ether stolen, worth \$45 million USD)
  - Exception Disorder
  - Gasless Send
  - Integer Overflow/underflow
    - The Proof of Weak Hand (PoWH) coin
      - 866 Ether stolen
  - ...
- Easy to miss real issues or find a lot of spurious bugs



# Pattern-Based Security Checkers



## Attacker Contract

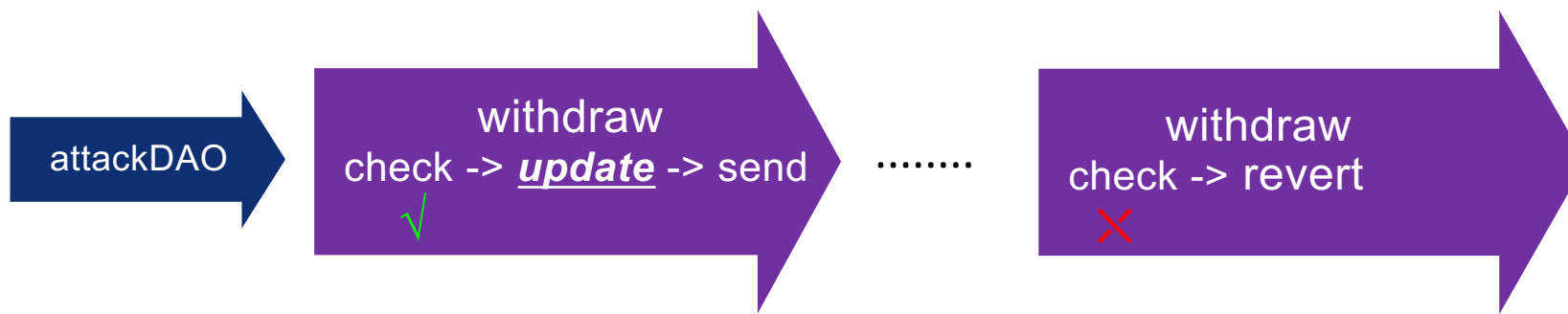
```
function attackDao(){  
  dao.withdraw(...);  
}  
...  
function() payable{  
  dao.withdraw(...);  
}
```



## DAO Contract

```
mapping(address => uint) balances;  
function withdraw(uint amount) {  
  require(balances[msg.sender] ≥ amount);  
  msg.sender.call.value(amount)();  
  balances[msg.sender] -= amount;  
}
```

Throw exception



Non-exploitable reentrancy – withdraw cannot go beyond authorization

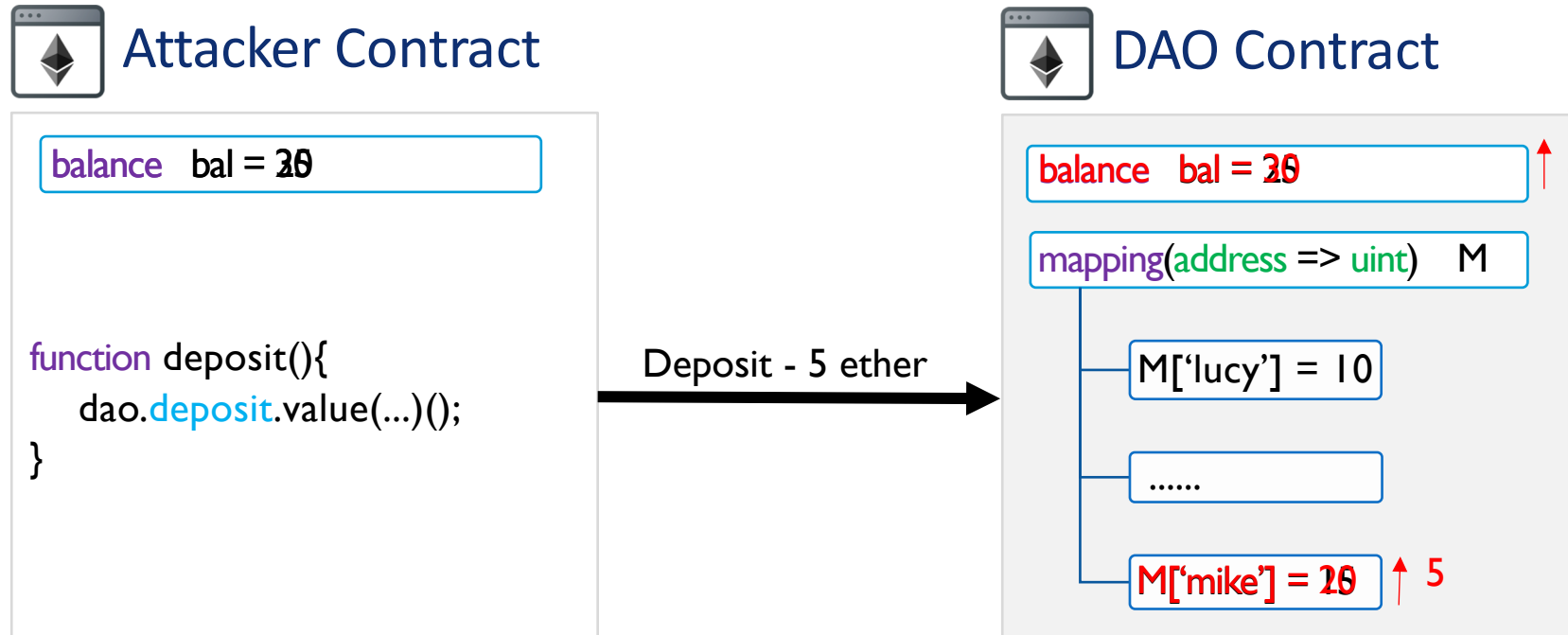
# Security checker that knows you well

Security  
Checker

- Key insights:
  - Vulnerabilities happen due to the mismatch between the **externally visible balance** and the **internal bookkeeping**
  - This applies to many types of vulnerabilities
- Two invariants to hold for all “reasonable” contracts:
  - **Balance invariant (intra-contract)**
  - **Transaction invariant (inter-contract)**
  - These include but are not limited to all ERC-20 contracts

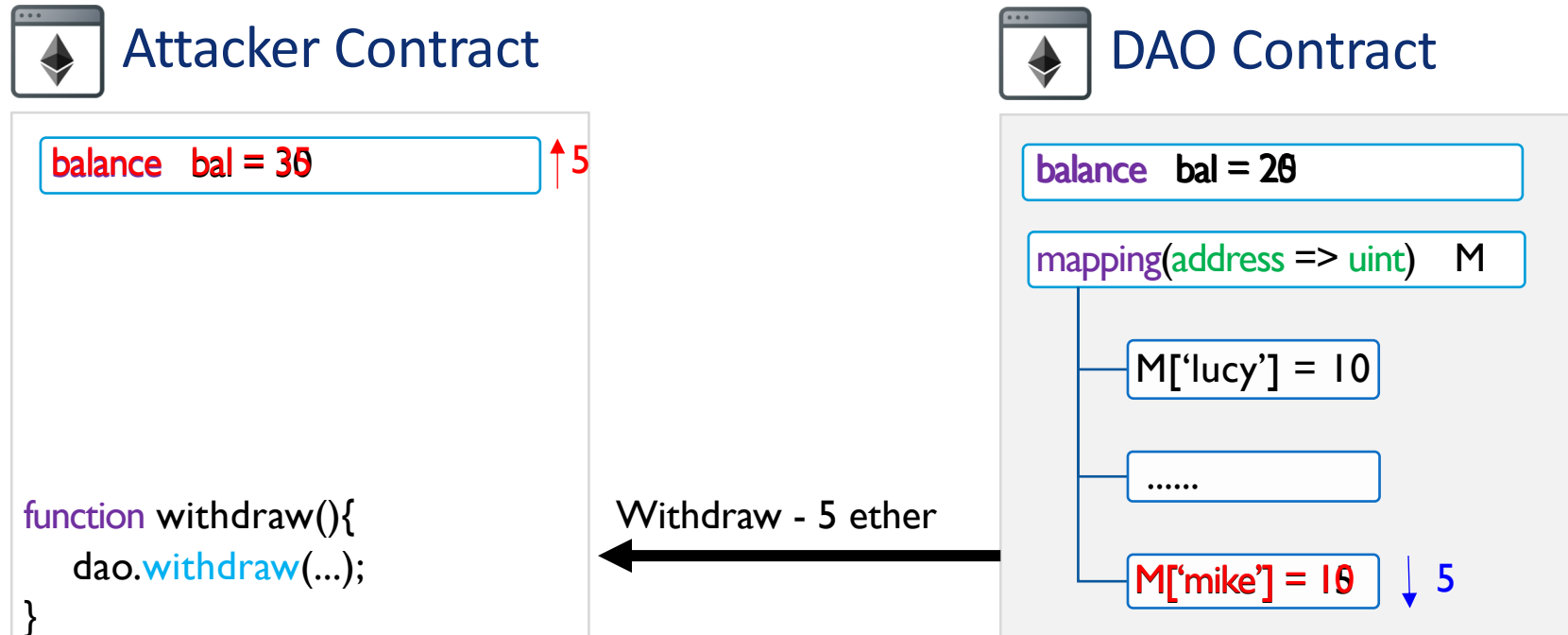


# Balance Invariant



- **Balance Invariant.** For every contract  $\langle a, bal, P, M \rangle$ ,  $\sum_{p \in P} M(p) - bal = K$ , where  $K$  is a constant
- Example in contracts Attacker - DAO
  - before:  $(10 + 15) - 25 = 0$
  - after:  $(10 + 20) - 30 = 0$

# Transaction Invariant



- **Transaction Invariant.** For every outgoing transaction  $\langle a, r, v \rangle$ ,  $\Delta(M(r)) + \Delta(r.bal) = 0$ , where  $\Delta(x) = post(x) - pre(x)$  and  $pre(x)$  and  $post(x)$  denote value of a variable  $x$  before and after a transaction
- Example in contract Attacker – DAO
  - $\Delta(DAO.M) = -5$  and  $\Delta(attacker.bal) = +5$

# Invariant Violation in DAO Attack



## Attacker Contract

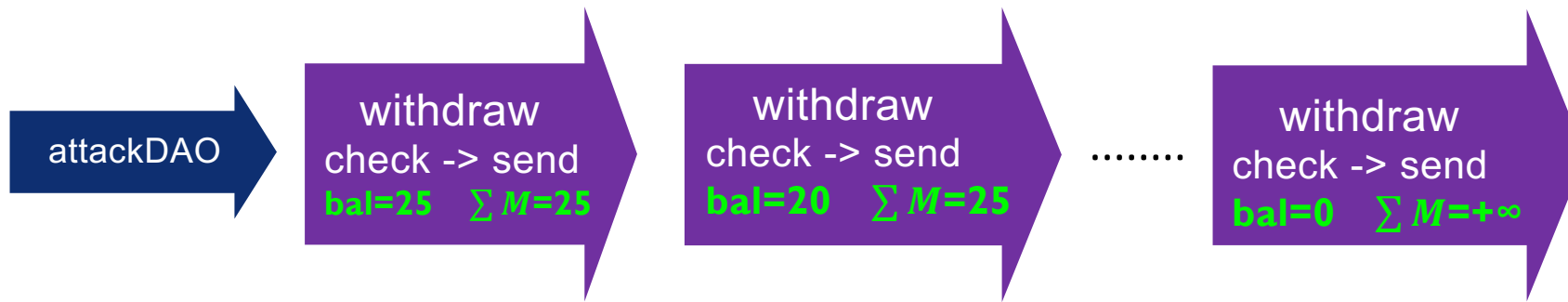
```
function attackDao(){
  dao.withdraw(5);
}
...
function() payable{
  dao.withdraw(5);
}
```



## DAO Contract

```
mapping(address => uint) balances;

function withdraw(uint amount) {
  require(balances[msg.sender] ≥ amount);
  msg.sender.call.value(amount)();
  balances[msg.sender] -= amount;
}
```

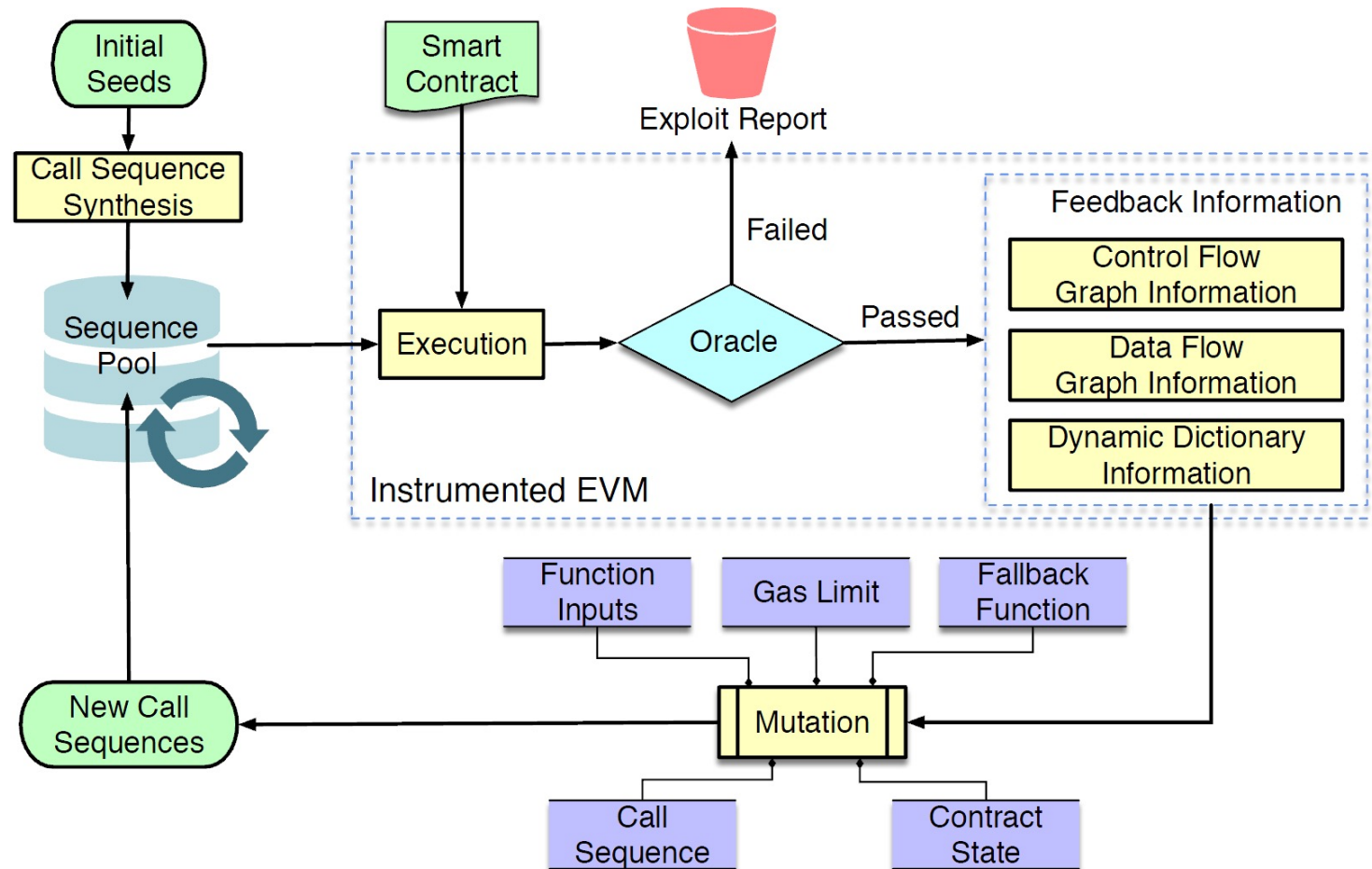


The balance invariant is violated!



# ContraMaster: Oracle-Supported Fuzzing

Security  
Checker



[ICSE'18]  
[TDSC'20]

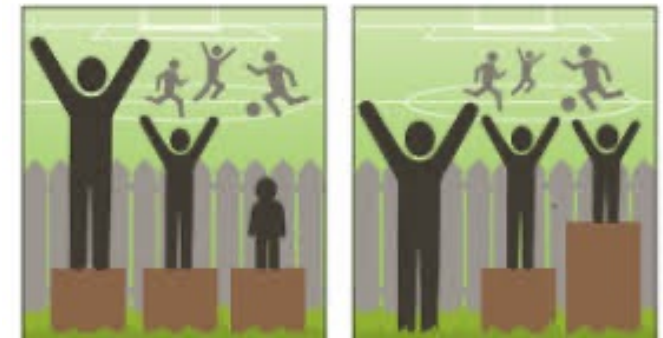
# New Attack Surfaces

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- Discovered 3 types of new attacks (not reported by other tools)
  - Incorrect access control
    - E.g., CreditDepositBank
  - Honey trap
    - E.g., ETH\_VAULT and WhaleGiveaway
    - Violating transaction invariants
  - Deposit less and withdraw more
    - E.g., LZLCoin
    - Violating balance invariants
  - More details can be found at: <https://sites.google.com/view/contramaster>

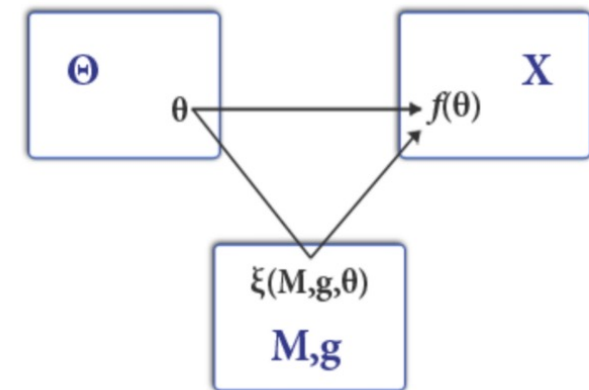
There is no objective standard of “fairness”. **“Fairness” is strictly in the eye of the beholder..** To a producer or seller, a “fair” price is a high price. To the buyer or consumer, a “fair” price is a low price. How is the conflict to be adjudicated?

– Milton Friedman, *Newsweek*, July 4, 1977.



# Define Fairness Properties

- Challenges in defining fairness
  - Fairness can be **subjective**
  - **Fairness  $\neq$  Equality  $\neq$  Equity** (in contrast to the “unbiased” definition)
- Consider smart contract as a **game form**
  - A number of players:  $N = \{1, 2, \dots, n\}$
  - An **action** set for each:  $\Theta_1, \Theta_2, \dots, \Theta_n$
  - An **outcome** function:
    - $d: \Theta \rightarrow O$  (allocation function)
    - $t: \Theta \rightarrow \mathbb{R}^n$  (transfer function)
- Preference (utility) function (**individual-specific**)
  - $u_i: O \rightarrow \mathbb{R}$



# Smart Contract Fairness Verification

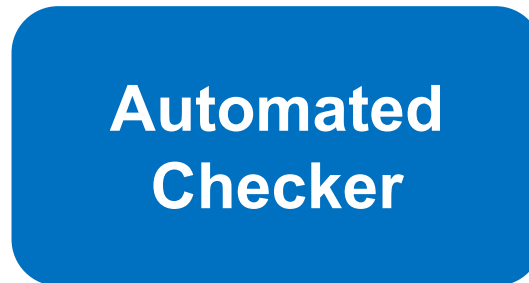
Fairness  
Checker

Focusing on **generic** fairness properties, i.e., independent from individual preferences

E.g., Truthfulness

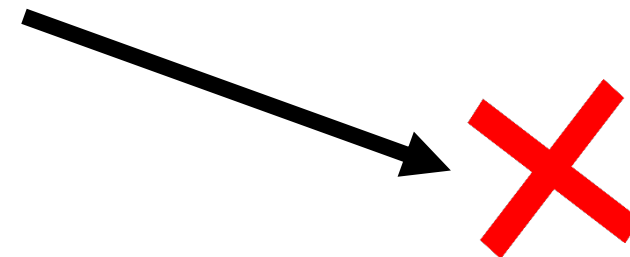
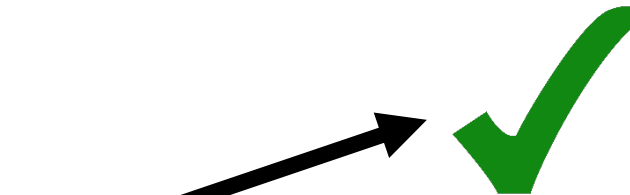


Smart Contract



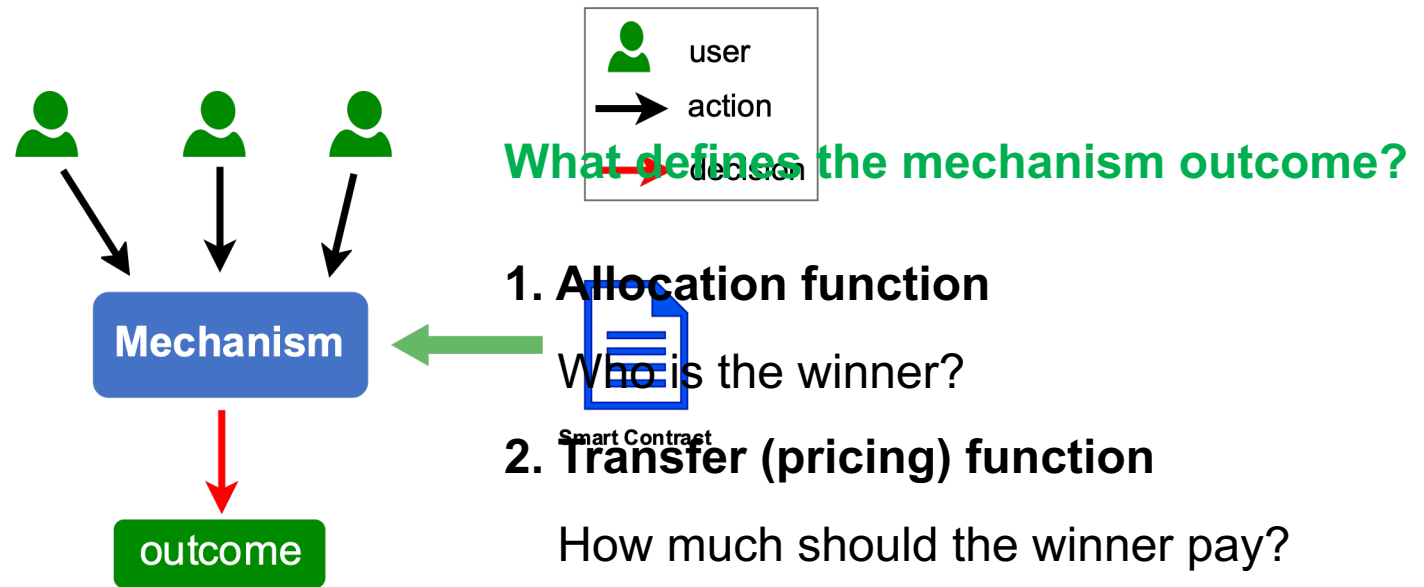
**Other considered fairness properties:**

- 2-collusion freeness
- Optimality
- Efficiency
- ...



# Mapping Smart Contracts into Mechanism Models

Fairness  
Checker



# Mapping Smart Contracts into Mechanism Models

Some contract annotation can be automated: e.g., ERC-1202 (voting), ERC-1815 (blind auction)

```
1 contract CryptoRomeAuction {
2   /** FairCon Annotations
3     @individual(msg.sender, msg.value, VALUE)
4     @allocate(highestBidder)
5     @price(highestBid)
6     @outcome(bid())
7   */
8   uint256 public highestBid = 0;
9   address payable public highestBidder;
10  mapping(address=>uint) refunds;
11  function bid() public payable{
12    uint duration = 1;
13    if (msg.value < (highestBid + duration)){
14      revert();
15    }
16    if (highestBid != 0) {
17      refunds[highestBidder] += highestBid;
18    }
19    highestBidder = msg.sender;
20    highestBid = msg.value;
21  }
22 }
```

## 3-player mechanism model

**CryptoRomeAuction** :=  $(msgsender_1, msgvalue_1, -)$

$(msgsender_2, msgvalue_2, -)$

$(msgsender_3, msgvalue_3, -)$

**assume:**  $(\text{not } (msgsender_1 < msgsender_1 + 1)) \text{ and}$   
 $(\text{not } (msgsender_2 < msgsender_2 + 1))$

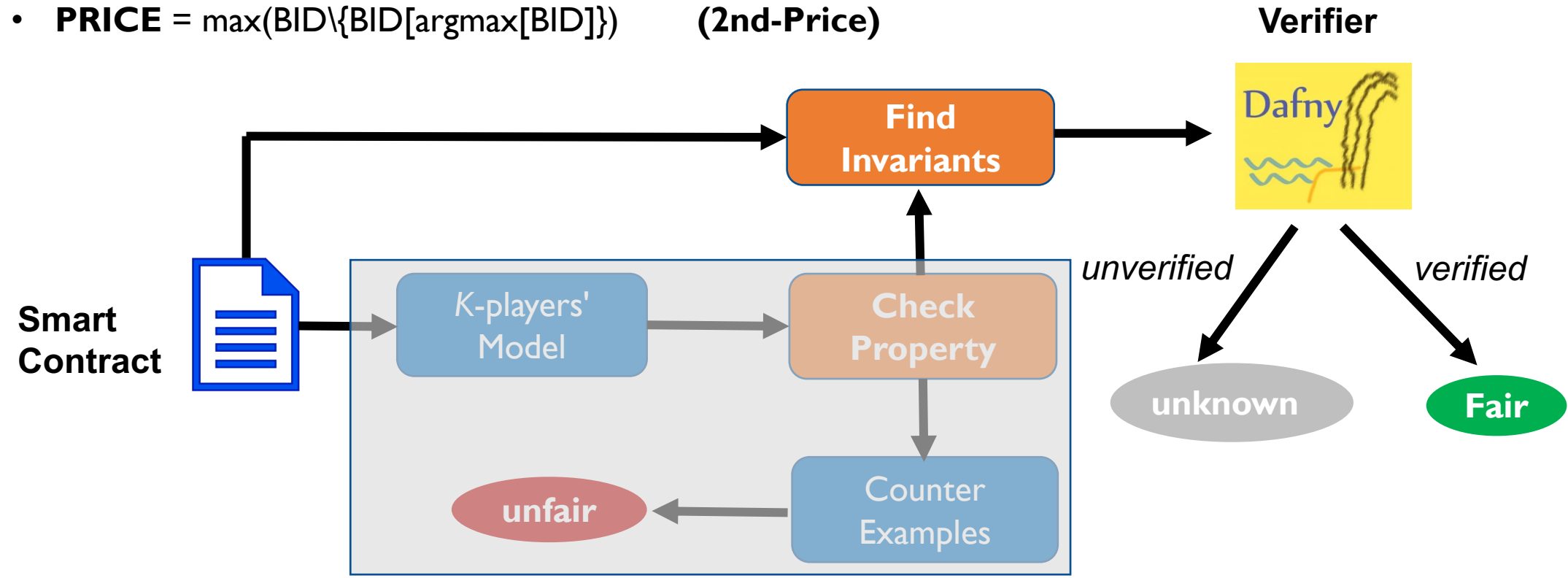
**allocate:**  $argmax(msgvalue_1, msgvalue_2, msgvalue_3)$

**price:**  $max(msgvalue_1, msgvalue_2, msgvalue_3)$

Synthesizing mechanism models with symbolic execution

# Fairness Proof: from k-player to n-player

- **ALLOCATE** =  $\text{argmax}(\text{BID})$  (TopBidder)
- **PRICE** =  $\text{max}(\text{BID})$  (1st-Price)
- **PRICE** =  $\text{max}(\text{BID} \setminus \{\text{BID}[\text{argmax}[\text{BID}]]\})$  (2nd-Price)







# Story 3

When the boundary between security and fairness becomes blurry ...

# Decentralized Finance

**DeFi** is an ecosystem of financial applications that are built on blockchain using **smart contracts**

## Total Value Locked (USD) in DeFi

TVL (USD) | ETH | BTC

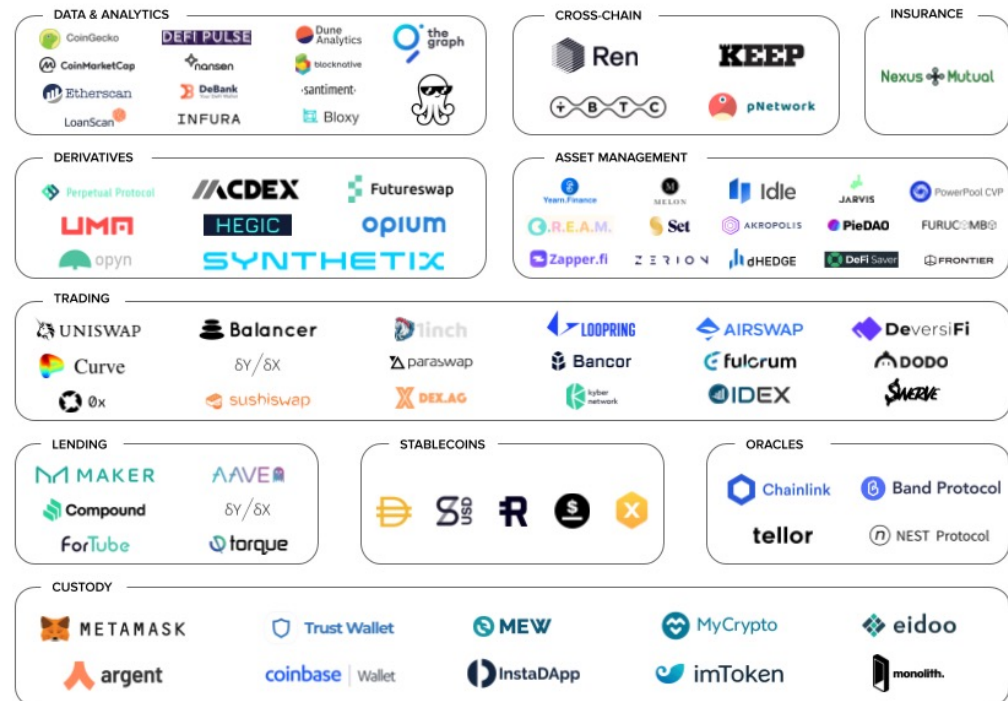
All | 1 Year | 90 Day | 30 Day



Source: <https://defipulse.com/>

Source: <https://thedefiant.io/defi-projects-map/>

## ETHEREUM DeFi Map by Simone Conti



# DeFi “Money Lego”

- **Composability** is one of the key features of DeFi applications

What's with DeFi and Money Legos?

 on DeFi - 10 March 2020

Money Legos And Composability As DeFi Building Blocks

 Vincent Tabora [Follow](#)  
Feb 17 · 6 min read ★

DeFi: Unpacking money legos and why we're excited about it

 Mervyn Cheng Jun 29, 2020 8:29 PM

What is DeFi Composability and Why Does it Matter?

Composable Infrastructure as Code: An Introduction to the Maker DeFi Ecosystem

April 21, 2020

DeFi's composability and high profitability are the future of finance

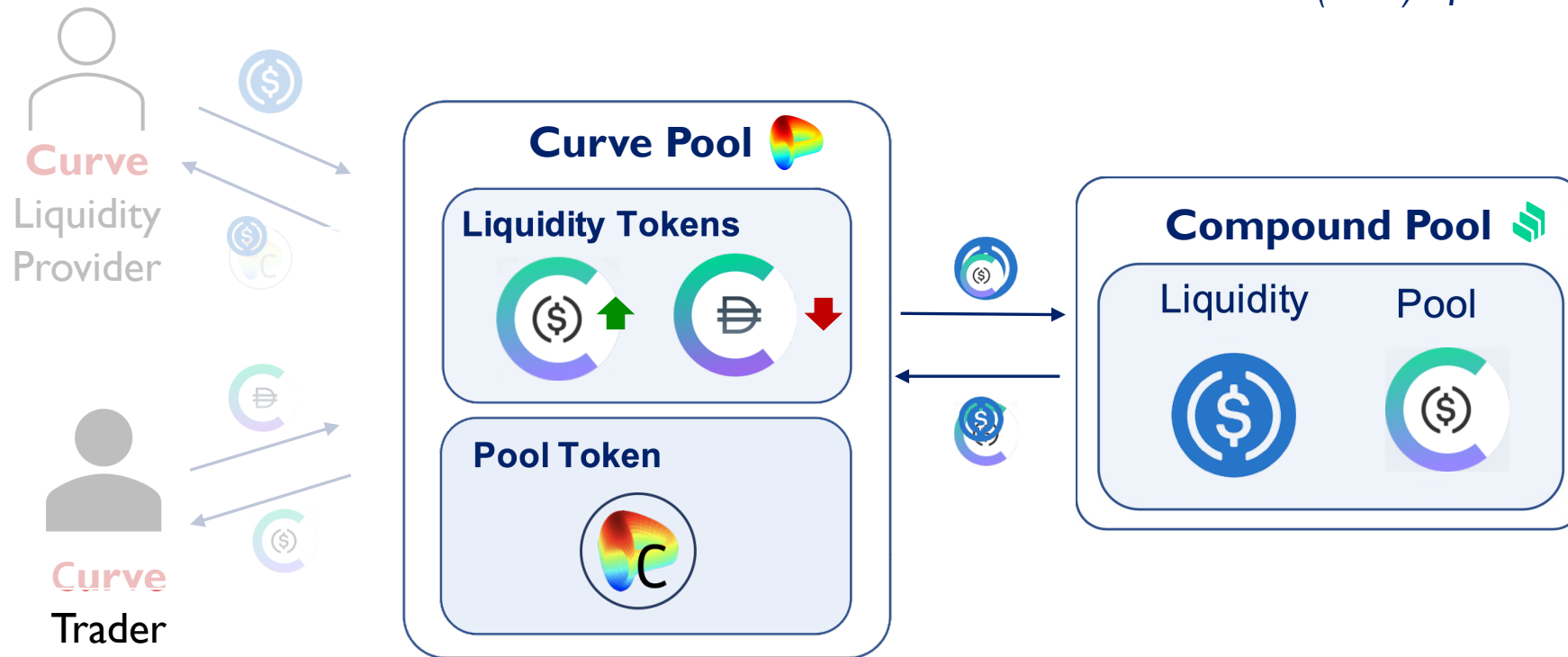
 MIFID II Reporter  February 12, 2021  Bitcoin  No Comments

12 AUGUST 2020 / EDUCATION

DeFi's Permissionless Composability is Supercharging Innovation

# “Bounded Loss” Property Violation

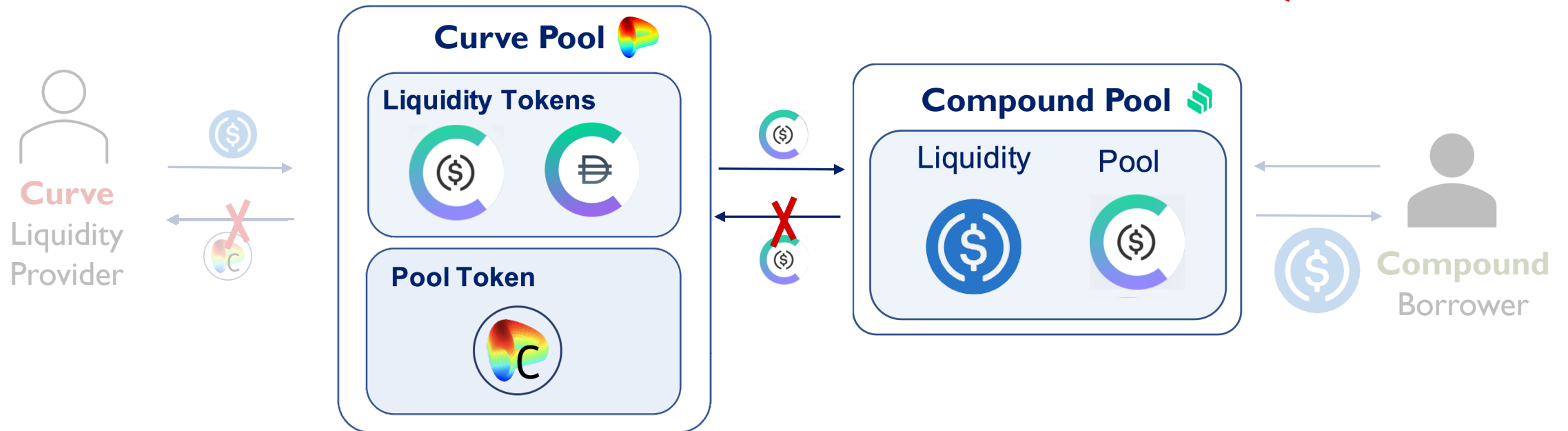
## Impermanent Loss



# “Bounded Loss” Property Violation

## Overutilization

“The loss of a liquidity provider is bounded by a certain value (20%) of the original deposit”



# Moral of the story

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- Reality is often more complicated
  - A contract behind one game may become a player of another
  - A player may play multiple games simultaneously
  - All contracts/games can potentially be hostile
- Sometimes, **fairness** is **security**
  - There are “**technical**” **security** and “**economical**” **security** (Werner et al., 2021)
    - “A DeFi protocol is **technically secure** if it is not possible for an attacker to obtain a risk-free profit”
    - “A DeFi protocol is **economically secure** if the protocol aligns incentives among all interacting agents such that non-technical exploits are economically infeasible”
- So, how do we move forward?
  - We don’t have an answer, yet ...
  - May draw some inspirations from the literature

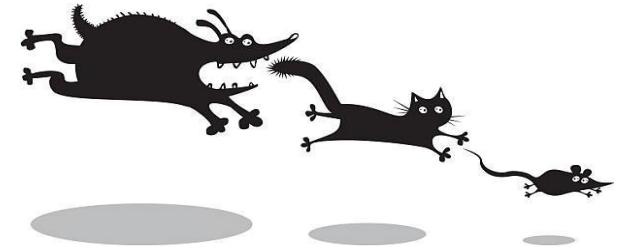


Table 2.2: A (partial) overview of the formalization and verification literature.

Domains	Applications	Model Formalisms					Specification Formalisms				Verification Techniques					
		Process Algebra	Transition System	Control-Flow Automata	Program Logic	Temporal Logics	Other Logics	Hoare Logic	Path-Level Patterns	Model Checking	Theorem Proving	Symbolic Execution	Program Verification	Runtime Verification		
Finance	ICO / Token	[165] <sup>E</sup>	[181] <sup>E</sup>	[203] <sup>E</sup>	[200] <sup>E</sup>	[181] <sup>E</sup>	[200] <sup>E</sup>	[162, 164] <sup>E</sup>	[77] <sup>E</sup>	[181] <sup>E</sup>	[164] <sup>E</sup>	[203] <sup>E</sup>	[165] <sup>E</sup>	[200] <sup>E</sup>	[162] <sup>E</sup>	[77] <sup>E</sup>
	Bank		[152] <sup>E</sup>		[97] <sup>E</sup>	[152] <sup>E</sup>		[26] <sup>E</sup>		[58] <sup>E</sup>			[26] <sup>E</sup>		[58] <sup>E</sup>	
	Wallet		[193] <sup>E</sup>		[56] <sup>*</sup>	[193] <sup>E</sup>		[90, 56] <sup>*</sup>					[193] <sup>E</sup>	[56] <sup>*</sup>	[90] <sup>*</sup>	
	Escrow	[209] <sup>E</sup>	[97] <sup>E</sup>		[33] <sup>E</sup>	[97] <sup>E</sup>		[33] <sup>E</sup>		[209, 46] <sup>E</sup>			[209] <sup>E</sup>	[33] <sup>E</sup>		[46] <sup>E</sup>
Social Games	Auction		[181] <sup>E</sup>			[181] <sup>E</sup>		[268] <sup>E</sup>	[54] <sup>*</sup>			[181] <sup>E</sup>	[171] <sup>E</sup>	[268] <sup>E</sup>	[171] <sup>E</sup>	[54] <sup>*</sup>
	Voting		[97] <sup>E</sup>		[97] <sup>E</sup>	[97] <sup>E</sup>		[56] <sup>*</sup>	[38] <sup>E</sup>			[97] <sup>E</sup>	[56] <sup>*</sup>	[171] <sup>E</sup>	[38] <sup>E</sup>	[162] <sup>E</sup>
	Games / Gambling		[233] <sup>E</sup>			[233] <sup>E</sup>		[53] <sup>*</sup>		[100] <sup>E</sup>				[171] <sup>E</sup>	[53] <sup>*</sup>	[100] <sup>E</sup>
Asset Tracking	Supply Chain		[31] <sup>*</sup>			[31] <sup>*</sup>		[251] <sup>E</sup>		[108] <sup>*</sup>				[251] <sup>E</sup>		[108] <sup>*</sup>
	Marketplace		[192] <sup>E</sup>			[192] <sup>E</sup>		[191] <sup>E</sup>				[192] <sup>E</sup>		[191] <sup>E</sup>		
	License Agreement		[233] <sup>E</sup>		[122] <sup>*</sup>	[233] <sup>E</sup>		[122] <sup>*</sup>						[122] <sup>*</sup>		
	Name Registration		[24] <sup>E</sup>			[24] <sup>E</sup>		[137] <sup>E</sup>				[24] <sup>E</sup>		[137] <sup>E</sup>		
Protocols	Timed Commitment	[44] <sup>B</sup>	[35] <sup>B</sup>			[44] <sup>B</sup>		[35] <sup>B</sup>				[44] <sup>B</sup>		[35] <sup>B</sup>		
	Atomic Swap		[242] <sup>*</sup>		[139] <sup>*</sup>	[242] <sup>*</sup>		[139] <sup>*</sup>				[242] <sup>*</sup>		[139] <sup>*</sup>		
Security	Reentrancy		[181] <sup>E</sup>	[175] <sup>E</sup>		[181] <sup>E</sup>	[138] <sup>E</sup>		[194] <sup>*</sup>	[169] <sup>E</sup>	[249] <sup>E</sup>	[181] <sup>E</sup>	[138] <sup>E</sup>	[175] <sup>E</sup>	[249] <sup>E</sup>	[169] <sup>E</sup>
	Concurrency	[209] <sup>E</sup>		[151] <sup>E</sup>						[209] <sup>E</sup>	[151] <sup>E</sup>	[209] <sup>E</sup>		[151] <sup>E</sup>	[249] <sup>E</sup>	
	Dependence Manipulation		[175] <sup>E</sup>							[175] <sup>E</sup>	[249] <sup>E</sup>		[175] <sup>E</sup>	[249] <sup>E</sup>	[176] <sup>E</sup>	
	Unchecked Call		[136] <sup>†</sup>							[176] <sup>†</sup>	[136] <sup>†</sup>		[175] <sup>E</sup>	[249] <sup>E</sup>	[74] <sup>E</sup>	
	Access Control	[165] <sup>E</sup>		[203] <sup>E</sup>		[203] <sup>E</sup>	[232] <sup>E</sup>	[251] <sup>E</sup>		[66] <sup>E</sup>	[74] <sup>E</sup>		[232] <sup>E</sup>	[203] <sup>E</sup>	[66] <sup>E</sup>	[74] <sup>E</sup>
				[136] <sup>†</sup>			[165] <sup>E</sup>							[136] <sup>†</sup>	[165] <sup>E</sup>	
														[203] <sup>E</sup>	[251] <sup>E</sup>	
	Liquidity	[52] <sup>B</sup>	[181] <sup>E</sup>	[195] <sup>E</sup>		[52] <sup>B</sup>	[222] <sup>*</sup>			[240] <sup>E</sup>	[195] <sup>E</sup>		[52] <sup>B</sup>	[222] <sup>*</sup>	[195] <sup>E</sup>	[240] <sup>E</sup>
				[240] <sup>E</sup>			[181] <sup>E</sup>						[181] <sup>E</sup>		[240] <sup>E</sup>	
Resource Consumption			[124] <sup>E</sup>				[117] <sup>E</sup>	[191] <sup>E</sup>		[124] <sup>E</sup>	[75] <sup>E</sup>		[117] <sup>E</sup>	[75] <sup>E</sup>	[124] <sup>E</sup>	
Arithmetic			[75] <sup>E</sup>											[191] <sup>E</sup>		
			[106] <sup>E</sup>				[232] <sup>E</sup>	[227] <sup>E</sup>		[176] <sup>E</sup>	[106] <sup>E</sup>		[232] <sup>E</sup>	[106] <sup>E</sup>	[227] <sup>E</sup>	[176] <sup>E</sup>

<sup>E</sup>: Ethereum, <sup>B</sup>: Bitcoin, <sup>\*</sup>: Hyperledger Fabric, <sup>†</sup>: Tezos, <sup>‡</sup>: EOS, <sup>\*</sup>: Other

# Some open challenges

- Scalable and precise inter-contract analysis
- Easier way to write good specifications
- Collaborative development of standards
- ...

Definitely more attention on fairness issues



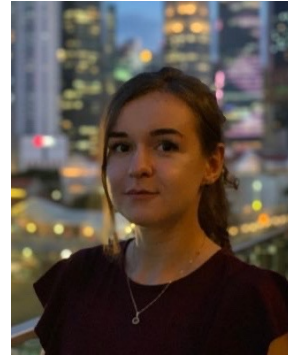
SCPub dataset  
[ACM CSUR'21]

# Acknowledgements

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Ye Liu



Palina Tolmach



Haijun Wang



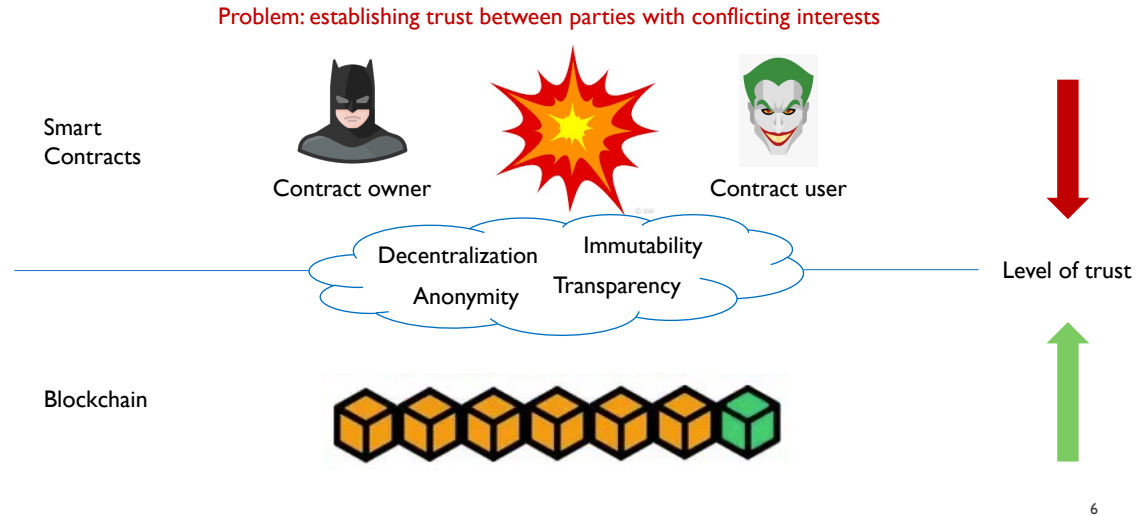
Shang-Wei Lin



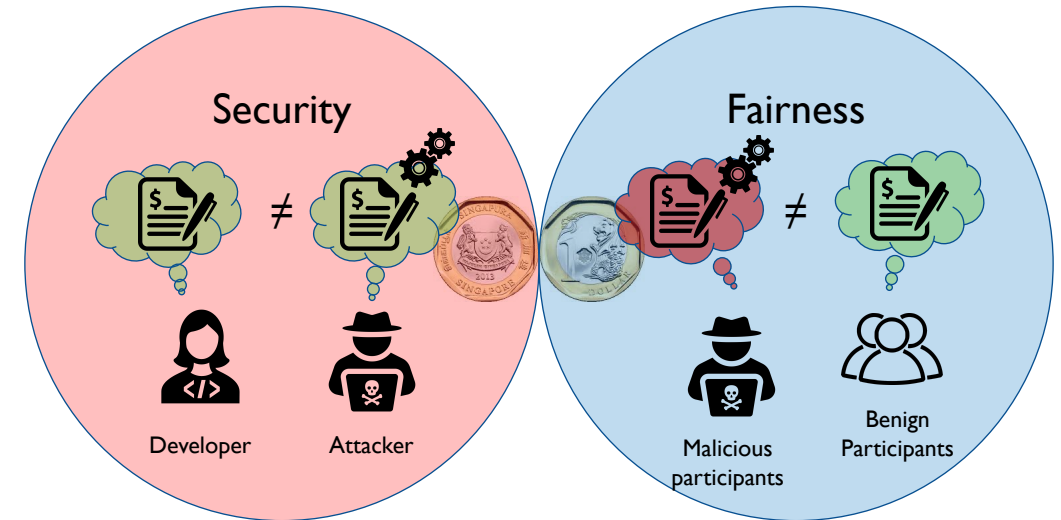
Yang Liu



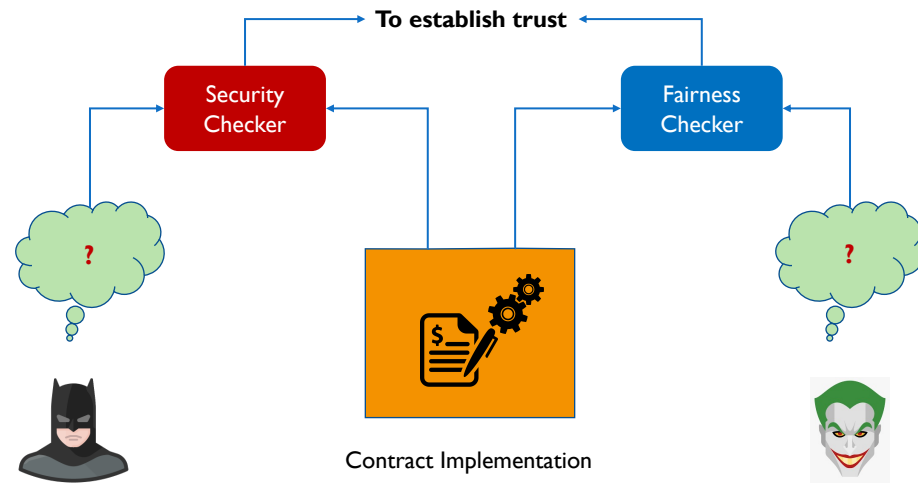
# In code we trust? No!



# Smart Contracts: Security vs Fairness



# Establishing Trust between Contending Parties



# Moral of the story

- Reality is often more complicated
  - A contract behind one game may become a player of another
  - A player may play multiple games simultaneously
  - All contracts/games can potentially be hostile
- Sometimes, **fairness is security**
  - There are “**technical**” security and “**economical**” security (Werner et al., 2021)
    - “A DeFi protocol is **technically secure** if it is not possible for an attacker to obtain a risk-free profit”
    - “A DeFi protocol is **economically secure** if the protocol aligns incentives among all interacting agents such that non-technical exploits are economically infeasible”
- So, how do we move forward?
  - We don’t have an answer, yet ...
  - May draw some inspirations from the literature

