

# An Ever-evolving Game: Evaluation of Real-world Attacks and Defenses in Ethereum Ecosystem

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# Smart Contract Incidents



## Hard Fork Completed

Posted by Vitalik Buterin on July 20, 2016

Research & Development

We would like to congratulate the Ethereum community on a successfully completed hard fork. The fork itself took place smoothly, with roughly 85% of miners mining on the fork: [1920000](#) contained the execution of an irregular state change which transferred ~12 million ETH from the “Dark DAO” and “Whitehat DAO” contracts into the [WithdrawDAO recovery contract](#). The fork itself took place smoothly, with roughly 85% of miners mining on the fork:

## Security Alert



**Parity Technologies**

Powering the decentralised web

November 08, 2017 in [Security](#).

**Severity:** Critical

**Product affected:** Parity Wallet (multi-sig wallets)

**Summary:** A vulnerability in the Parity Wallet library contract of the standard multi-sig contract has been found.

<https://blog.ethereum.org/2016/07/20/hard-fork-completed/>  
<https://www.parity.io/security-alert-2/>

# Are they exploited?

- Vulnerable contracts reported
  - 8.8k by Oyente, CCS '16
  - 5k by Securify, CCS '18
  - 21k by ZEUS, NDSS '18
  - ...
- Perez and Livshits, arXiv:1902.06710
  - “at most 504 out of 21,270 contracts have been subjected to exploits”
- **Gap exists between vulnerable contracts and real-world attacks!**

# Questions

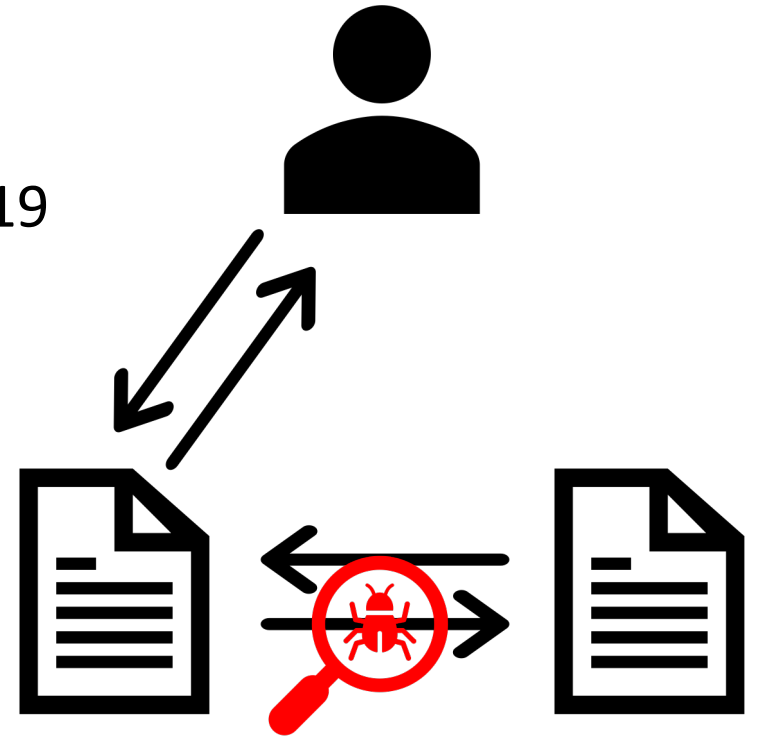
What contracts have been attacked?

and

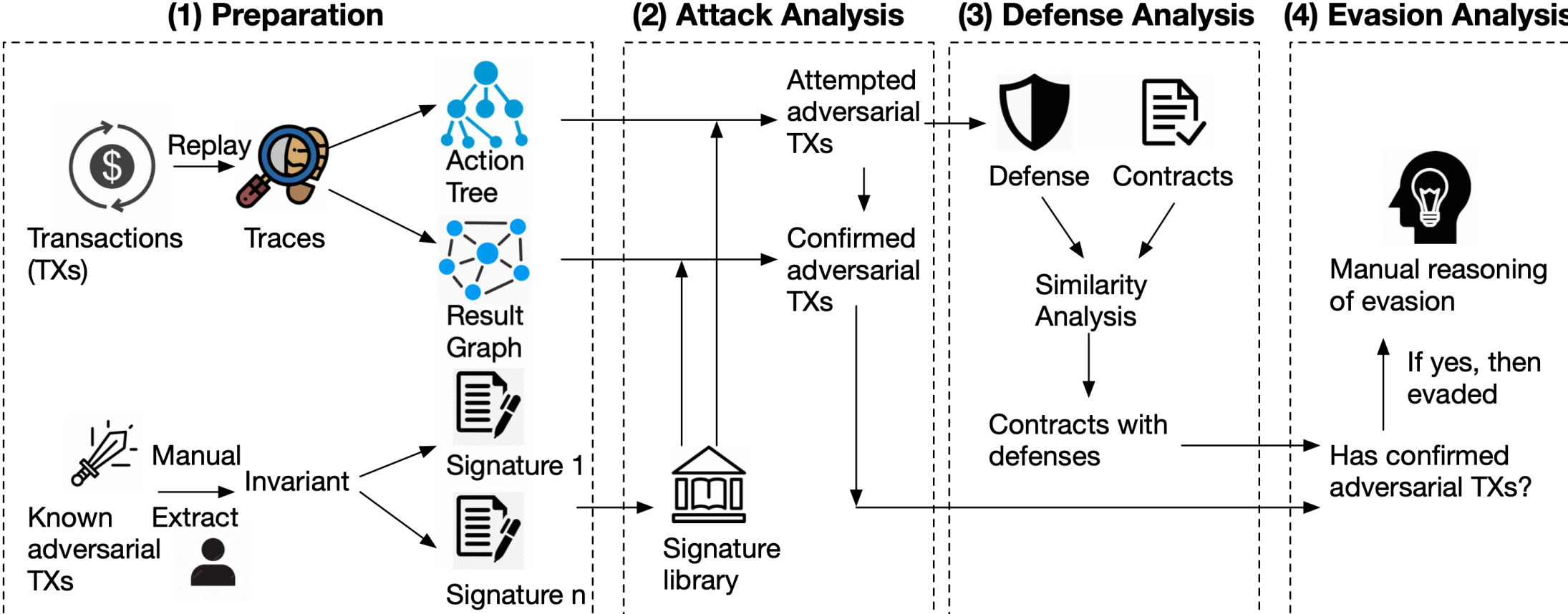
What attacks have been prevented?

# From contracts to transactions

- Task: Examine all the transactions in Ethereum
  - 420m transactions from August 2015 to March 2019

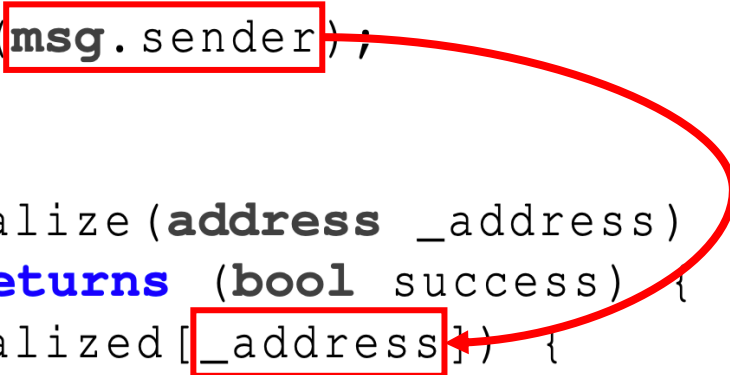


# Measurement Workflow



# Airdrop Hunting Example

```
1  contract Simoleon is ERC20Interface {
2      function transfer(address _to, uint256
3          _amount) returns (bool success) {
4          initialize(msg.sender);
5          ...
6      }
7      function initialize(address _address)
8          internal returns (bool success) {
9          if (!initialized[_address]) {
10             initialized[_address] = true;
11             balance[_address]=_airdropAmount;
12         }
13     }
14 }
```



# An attack transaction

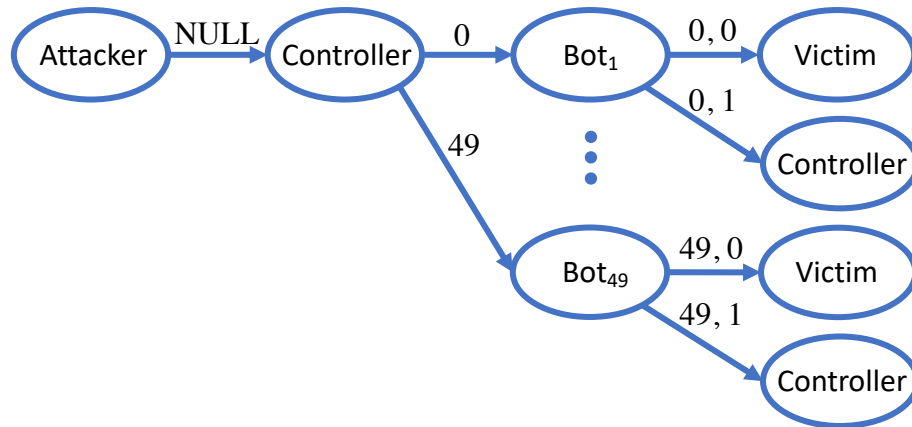
Address	From	To	Payload		Type	Value	Status
			Entry function	Parameters			
NULL	Attacker	Controller	0x2b6cab44	0x32	call	0	Success
0	Controller	Bot <sub>1</sub>	N/A	N/A	create	0	Success
0,0	Bot <sub>1</sub>	Victim	transfer(address,uint256)	_to: Controller, _amount: 1,000,000	call	0	Success
0,1	Bot <sub>1</sub>	Controller	N/A	N/A	suicide	0	Success
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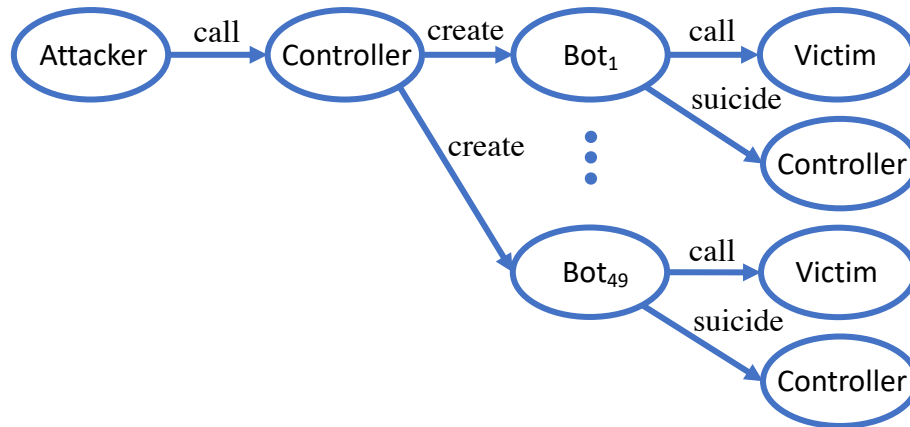
Action Tree



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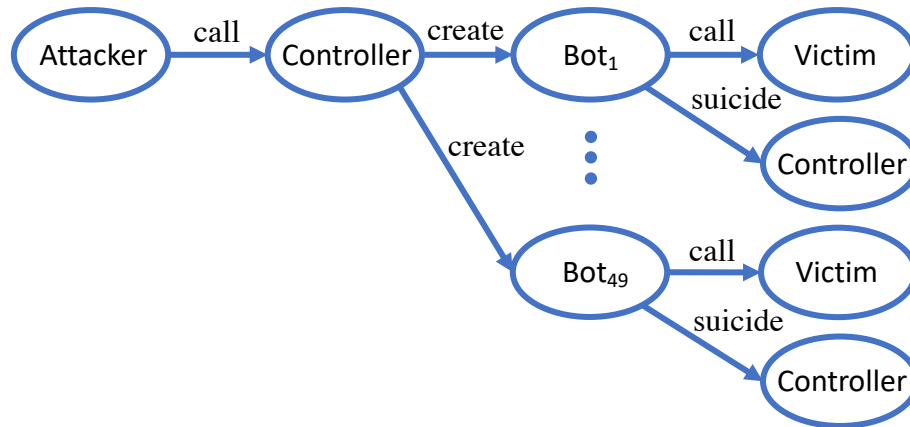
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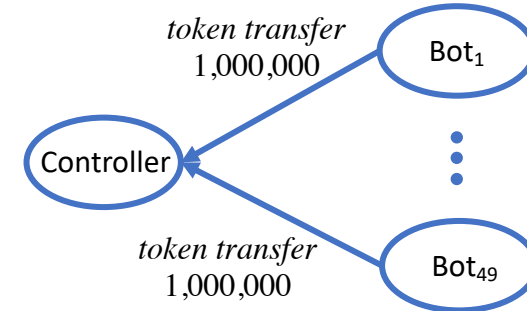
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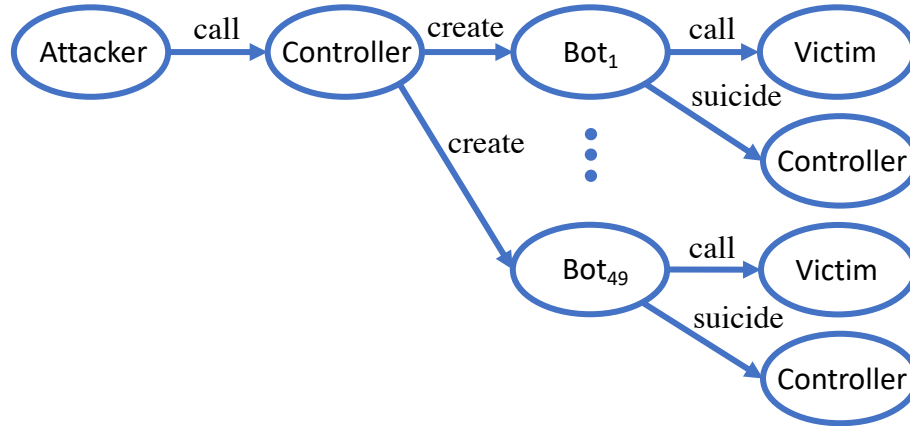


Result Graph

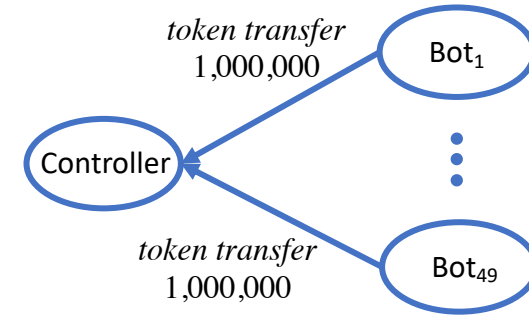


# Signature Matching

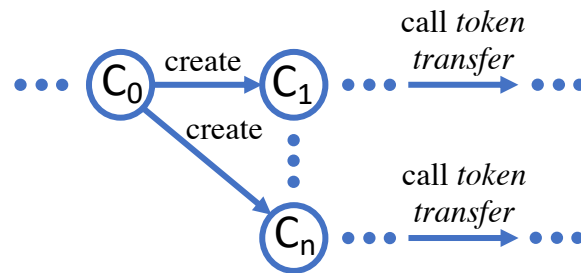
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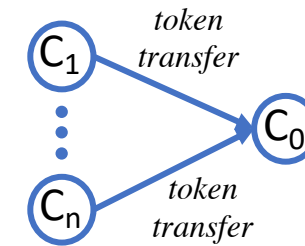
Result Graph



Action Clause

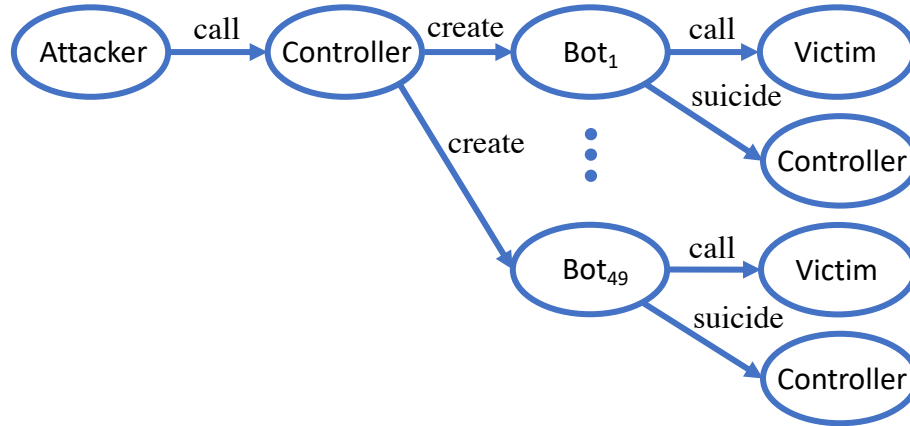


Result Clause

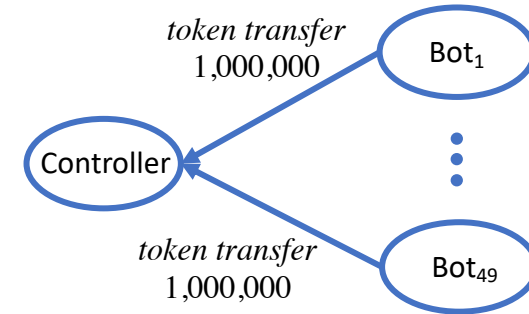


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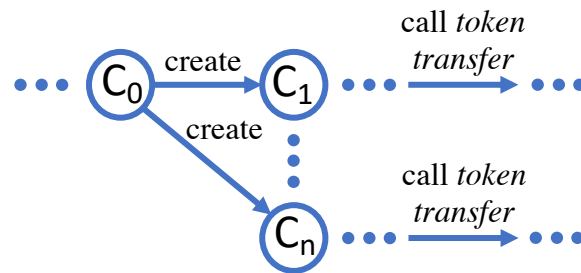
Action Tree



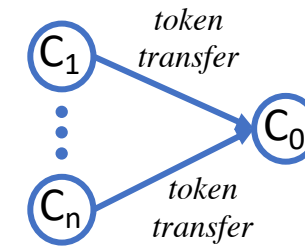
Result Graph



Action Clause



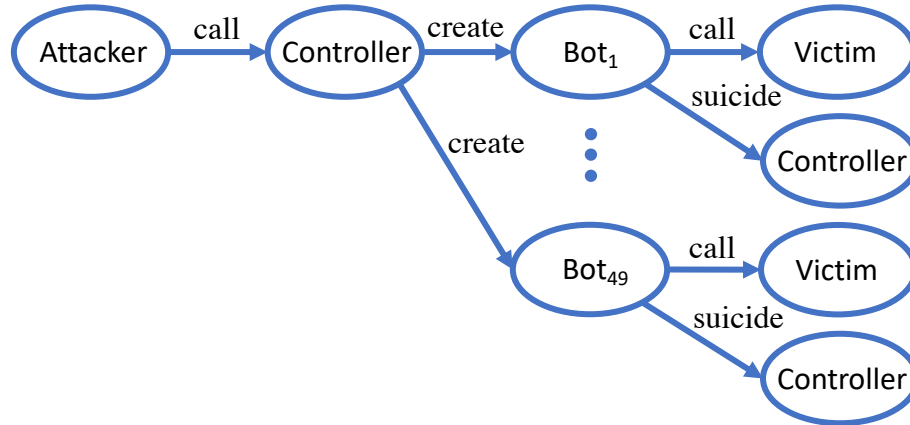
Result Clause



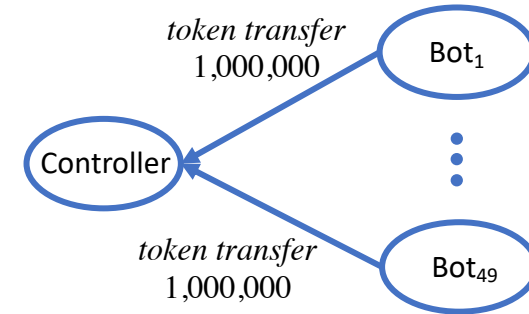
Attempted Adversarial ✓

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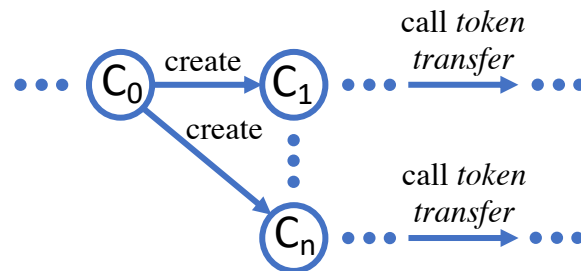
Action Tree



Result Graph

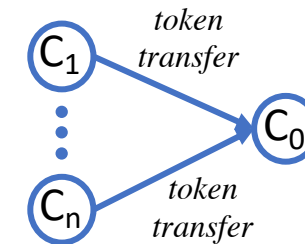


Action Clause



Attempted Adversarial ✓

Result Clause



Confirmed Adversarial ✓

# Failed attack transaction

Address	From	To	Payload		Type	Value	Status
			Entry function	Parameters			
NULL	Attacker	Controller	0x2b6cab44	0x32	call	0	Success
0	Controller	Bot <sub>1</sub>	N/A	N/A	create	0	Success
0,0	Bot <sub>1</sub>	Victim	transfer(address,uint256)	_to: Controller, _amount: 1,000,000	call	0	Reverted
0,1	Bot <sub>1</sub>	Controller	N/A	N/A	suicide	0	Success
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49,1	Bot <sub>50</sub>	Controller	N/A	N/A	suicide	0	Success

# Defense Examples

```
1  modifier isHuman() {
2      address _addr = msg.sender;
3      uint256 _codeLength;
4
5      assembly {_codeLength := extcodesize(_addr
6          )}
7      require (_codeLength == 0, "humans_only");
8      _;
9  }
10 modifier anotherIsHuman() {
11     require (tx.origin == msg.sender, "humans_
12         only");
13     _;
14 }
```



# Evaluation: False Positive

Vulnerability	Preliminary Results		False Positives (FPs)				True Positives (TPs) after Manual Filtering		
	# contract	# confirmed atx	# contract	# confirmed atx	% contract	% atx	# contract	# confirmed atx	# attempted atx
call injection	642	2,996	20	286	3.12%	9.55%	622	2,710	1,494
reentrancy	26	1,948	0	0	0	0	26	1,948	32
integer overflow	56	319	6	36	10.71%	11.29%	50	283	1,367
airdrop hunting	198	100,336	0	0	0	0	198	100,336	57
call-after-destruct	228	1,761	0	0	0	0	228	1,761	0
honeypot	156	266	15	29	9.62%	10.90%	141	237	0
<b>Total</b>	<b>1,272</b>	<b>107,610</b>	<b>41</b>	<b>351</b>	<b>3.22%</b>	<b>0.33%</b>	<b>1,231</b>	<b>107,259</b>	<b>2,633</b>

# Evaluation: False Negative

<b>Vulnerability</b>	<b>Evaluation Set</b>		<b>False Negatives (FNs)</b>			
	# contract	# atx	# contract	# atx	% contract	% atx
call injection	8	13	0	0	0	0
reentrancy	50	648	0	0	0	0
integer overflow	50	902	0	0	0	0
airdrop hunting	-	-	-	-	-	-
call-after-destruct	50	811	0	0	0	0
honeypot	192	1,100	16	129	8.33%	11.73%
<b>Total</b>	<b>400</b>	<b>4,546</b>	<b>16</b>	<b>129</b>	<b>4.00%</b>	<b>2.84%</b>

# Real-world Defenses

Defense	Checked Values	# of deployed ct	Target Attack	# of prevented atx	# of successful atx
onlyOwner	<i>msg.sender</i> state variable <i>owner</i>	2,148,200	privilege escalation*	0	2,691
isHuman isContract	<i>extcodesize()</i>	21,672	airdrop hunting	14	887
anotherIsHuman anotherIsContract	<i>tx.origin</i> <i>msg.sender</i>	3,416	airdrop hunting	3	0
canDistr	state variable <i>distributionFinished</i>	2,505	airdrop hunting	21	65,240
nonReentrant	state variable <i>_guardCounter</i>	952	reentrancy	77	0
SafeMath	function parameters	3,110,124	integer overflow	1,161	55

# Gap between vulnerable contracts and attacks

Attacks	Known		Zero-day		Total Loss	
	# contract	# atx	# contract	# atx	ether / token	monetary
call injection	-	-	-	-	- / -	-
reentrancy	18	56	6	36	6,080 / 5.01E+23	\$142,945
integer overflow	34	167	16	113	- / 7.79E+79	-
airdrop hunting	-	-	197	100,278	- / 3.59E+28	\$322,010
call-after-destruct	154	1,547	74	214	472 / -	\$100,102
honeypot	90	148	51	-	427 / -	\$80,866
Total	285	1,904	344	100,641	6,979 / 7.79E+79	\$645,848

- Only 285 of 112,570 (0.25%) reported vulnerable contracts are really attacked

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- 344 Zero-day contracts, missed by previous works due to
  - Lacking of inter-contract dataflow analysis
  - Code coverage

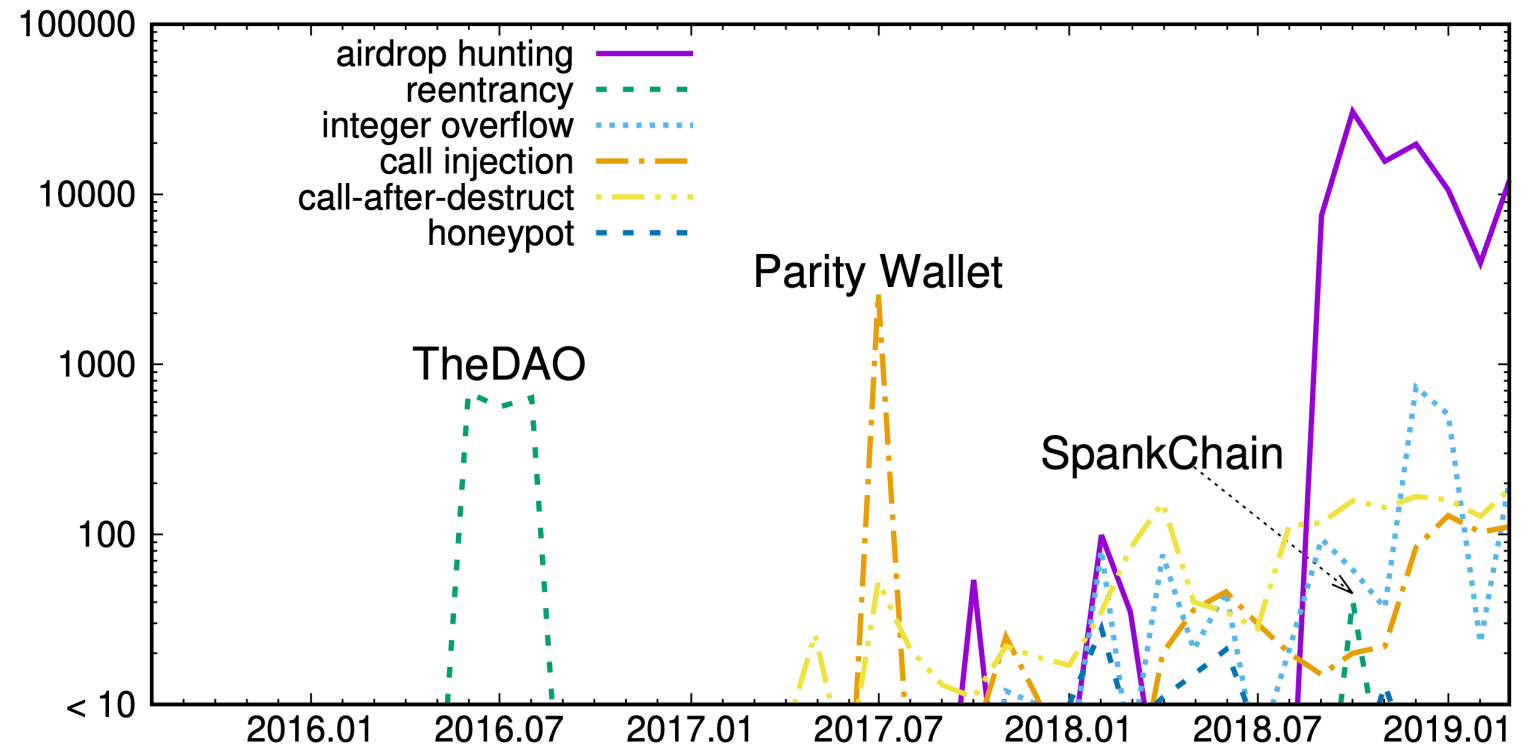
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- A conservative estimation of losses (excluding well-known incidents)

# Advice

- Attack Strategy Shift
  - 2016: Reentrancy
  - 2017: Call injection
  - 2018: Honeypot
  - 2019: Airdrop hunting
  - And 2020?



Thank you!  
Q & A

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