



a place of mind  
THE UNIVERSITY OF BRITISH COLUMBIA

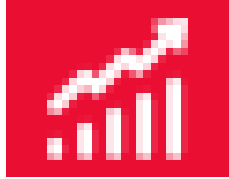
# eTainter: Detecting Gas-Related Vulnerabilities in Smart Contracts

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# Ethereum smart contracts



## Increasing adoption

- Finance (DeFi), gaming (NFTs), etc
- Hold nearly 23% of Ethereum supply (~\$32B), as of June 2022 [1] [2]



## Attack incidents

- DAO: \$60M theft
- Parity: \$300M lost

[1] <https://etherscan.io/stat/supply>

[2] <https://crypto.news/23-ether-eth-supply-locked-smart-contracts>

# Smart contracts

```
1 contract PIPOT {
2   struct order {
3     address player;
4     uint betPrice;
5   }
6   mapping (uint => order[]) orders ;
7
8    function buyTicket (uint betPrice) public payable {
9     orders[game].push(order(msg.sender, betPrice));
10    //some code
11  }
12
13   function pickTheWinner(uint winPrice) public{
14    //some code
15    for(uint i=0; i< orders[game].length; i++){
16      if (orders[game][i].betPrice == winPrice){
17        orders[game][i].player.transfer(toPlayer);
18      }
19    }
20  }
```

Entry  
points

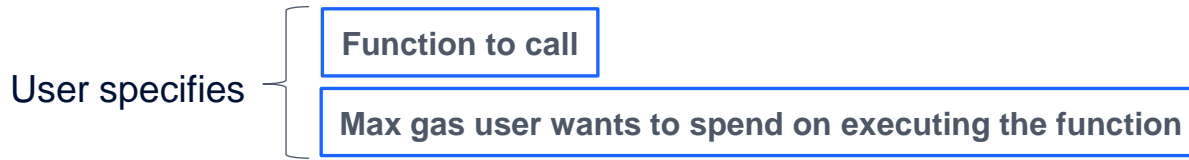
Compiled

```
PUSH1 0x64
SWAP1
CALLVALUE
MUL
PUSH1 0x02
SLOAD
PUSH1 0x00
SWAP1
DUP2
MSTORE
PUSH1 0x08
PUSH1 0x20
MSTORE
```

EVM bytecode opcodes

# Smart contracts: Gas concept

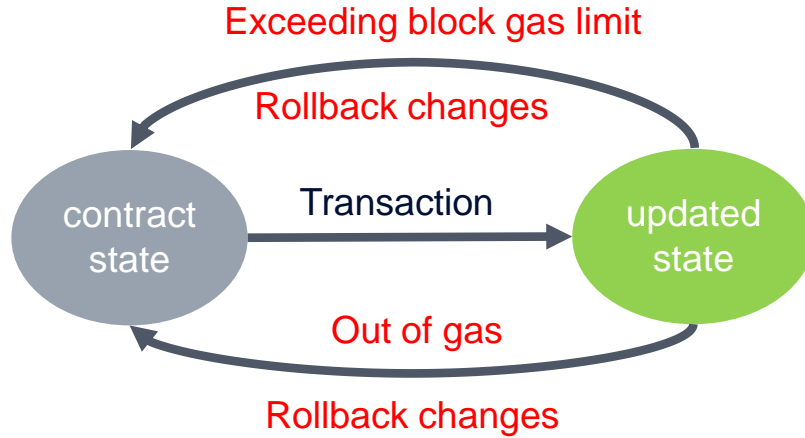
- Executing contract costs gas
- Gas cost for every EVM low-level instruction (opcode)
- Contract's users pay the gas cost



	Gas cost
PUSH1 0x64	3
SWAP1	3
CALLVALUE	2
MUL	5
PUSH1 0x02	3
SLOAD	100/2100
PUSH1	3
SWAP1	3
DUP2	3
MSTORE	X
PUSH1 0x08	3
PUSH1 0x20	3
MSTORE	X

EVM bytecode opcodes

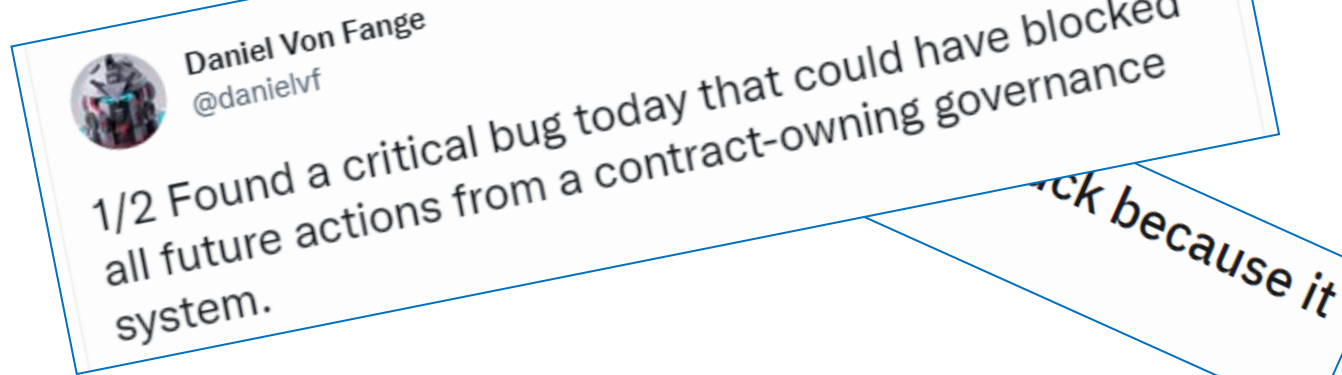
# Smart contracts: Gas concept



- Ethereum enforces block gas limit
  - To ensure that blocks can't be arbitrarily large
  - Transactions get reverted as well when exceeding the limit

# Gas-related attacks and consequences

- Dependence on gas can result in vulnerabilities
- Attackers increase gas usage to force unwelcome actions (e.g., DoS)



# Gas-related vulnerabilities

## 1. Unbounded Loop

```
1 contract PIPOT {
2   struct order {
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6   mapping (uint => order[]) orders ;
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8   function buyTicket (uint betPrice) public payable {
9     orders[game].push(order(msg.sender, betPrice));
10    //some code
11  }
12  function pickTheWinner(uint winPrice) public {
13    // arbitrary length iteration
14    for(uint i=0; i< orders[game].length; i++){
15      if (orders[game][i].betPrice == winPrice){
16
17          orders[game][i].player.transfer(toPlayer);
18      }
19  }
20 }
```

Bounded by dynamic array

# Gas-related vulnerabilities

## 2. Dos with Failed Call

```
1 contract PIPOT {
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```

Transfer ETH within  
the loop



# Related work

## MadMaX [OOPSLA, 2018]

- Uses pre-specified code patterns and rules
- Fails to detect variations in the patterns; results in high false-positives

```
for(uint i=0; i< orders[game].length; i++){
```

MadMax's rule

```
.decl PossibleArrayIterator(loop: Block, resVar:Variable, arrayId:Value)  
// A loop, looping through an array  
// Firstly, the loop has to be dynamically bound by some storage var(resVar)  
// And this must be the array's size variable.  
PossibleArrayIterator(loop, resVar, arrayId) :-  
    StorageDynamicBound(loop, resVar),  
    PossibleArraySizeVariable(resVar, arrayId).
```

# Our goal

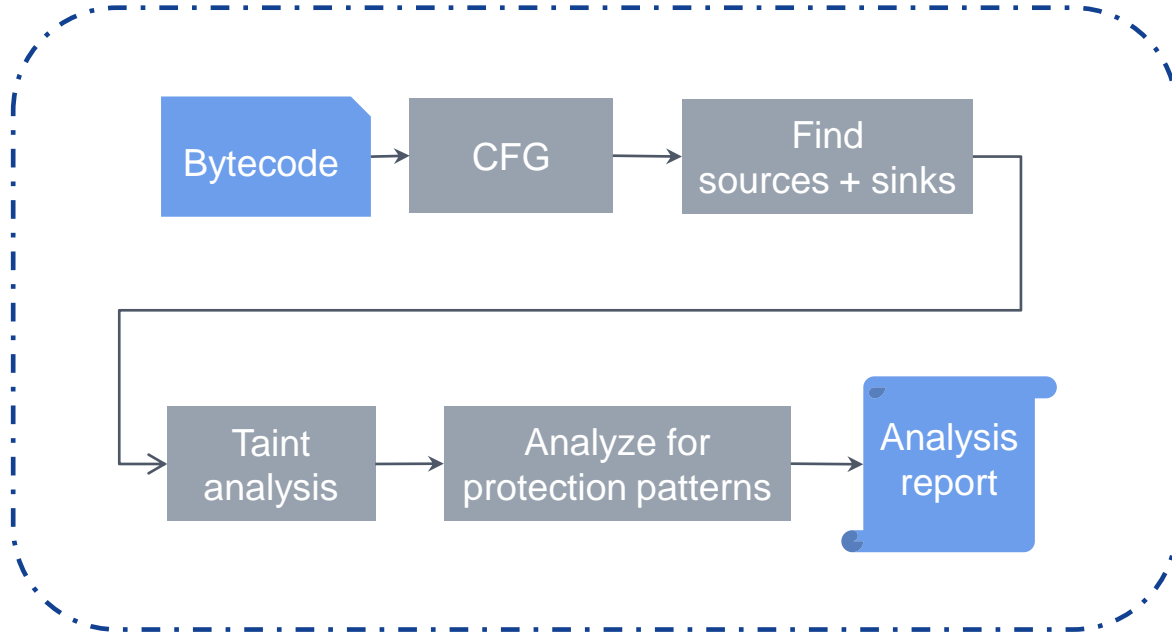
## Goal:

- An approach for **detecting** smart contract **gas-related vulnerabilities using static taint analysis**

## Observation:

- Gas-related vulnerabilities:
  - Caused by dependency on **user data sources manipulated by users**
  - Can be discovered by **tracking taints** without any pre-existing rules

# Proposed approach: eTainter



# Research challenges

- Patterns of use (e.g., implicit benign loops to handle strings)
- Propagating taints through persistent contract storage
- Unconventional way to access storage dynamic items (e.g. arrays) through hash calculation

# Tainted data flow: Example

```
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```

## Taint tracking

**Sink:** i< orders[game].length

**Sources:**

msg.sender  
betPrice  
winPrice

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```

## Taint tracking

**Sink:** i< orders[game].length

**Sources:**

msg.sender  
betPrice  
winPrice  
orders[game]<needs validation>

**Storage sink:** orders[game]

# Tainted data flow: Example

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```

Taint written to `orders[game]` array

## Taint tracking

**Sink:** `i< orders[game].length`

**Sources:**

`msg.sender`

`betPrice`

`winPrice`

`orders[game]<needs validation>`

**Storage sink:** `orders[game]` **tainted**

# Tainted data flow: Example

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Taint written to `orders[game]` array

## Taint tracking

**Sink:** `i< orders[game].length`

**Sources:**

`msg.sender`

`betPrice`

`winPrice`

`orders[game]<source of taints>`

**Storage sink:** `orders[game]` **tainted**



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```

Loop is unbounded

## Taint tracking

**Sink:** `i < orders[game].length`

**Sources:**

msg.sender  
betPrice  
winPrice  
orders[game]<source of taints>

**Storage sink:** orders[game] tainted

Taint reaches sink (loop exit condition)

# eTainter evaluation

**RQ1: Effectiveness of eTainter compared to prior work (MadMax)?**

**RQ2: Performance of eTainter?**

**RQ3: Prevalence of gas-related vulnerabilities in the wild?**

Dataset	Contract Num.	Used for
Annotated dataset	28	RQ1
Ethereum dataset	60, 612	RQ2 & RQ3
Popular–contracts dataset	3,000	RQ3

# eTainter evaluation

RQ1 (Effectiveness compared to MadMax)

	MadMax	eTainter
Precision	64.9%	90.4%
Recall	74%	94%
F1 score	69.2%	92.2%

**eTainter achieves better recall and precision**

# eTainter evaluation

## RQ2 (Performance of eTainter)

- Average analysis time: 8 seconds
- Memory: 118 MB

**Practical analysis time**

**< 60 seconds for 97% of successfully  
analyzed contracts**

# eTainter evaluation

## RQ3 (Prevalence of gas-related vulnerabilities)

Vulnerability	Ethereum dataset	Popular-contracts dataset
Unbounded loops	4.1%	1.8%
DoS with failed call	1.2%	0.8%
Total vulnerable contracts	2,763	71

**Gas-related vulnerabilities are prevalent in both datasets**

# Summary

Goal: Effective approach for detecting gas-related vulnerabilities

- Introduced eTainter; a static taint analyzer
- eTainter achieved 92% F1 score compared to 69% for MadMax
- Flagged 2,800 unique contracts on Ethereum as vulnerable

eTainter & datasets: <https://github.com/DependableSystemsLab/eTainter>



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