

Security Analysis Tools for Ethereum Smart Contracts: A Comparison Based on Real-World Exploits and Vulnerabilities.

Master's Thesis by

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I hereby declare that the work presented in this thesis is entirely my own. I confirm that I specified all employed auxiliary resources and clearly acknowledged anything taken verbatim or with changes from other sources. I further declare that I prepared this thesis in accordance with the rules for safeguarding good scientific practice at Karlsruhe Institute of Technology (KIT).

Karlsruhe, xx MONTH 20XX

.....
(Michele Massetti)

Abstract

English abstract.

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1 Introduction Template

This is the thesis template of the *Application-oriented Formal Verification* research group at the Institute of Information Security and Dependability (KASTEL) at KIT. It was adapted from the thesis template of the SDQ research group. Hence, for more information on the formatting of theses, you can still refer to <https://sdqweb.ipd.kit.edu/wiki/Ausarbeitungshinweise> as well as your advisor.

In the following, we present some general recommendations. These are non-binding, however, and should be harmonized with your advisor.

1.1 Style and Typography

It is advisable to choose and stick to a specific style guide for your thesis' language. Especially for the English language, there are some commonly agreed style guides. At times, the recommendations of one guide contradict the ones from another. Therefore, be consistent in your choice! The following two style guides are the most common ones:

- *New Oxford Style Manual* for British English
- *The Chicago Manual of Style* for US-American English

If you are also interested in (some of the) choices considering the typography, you may consult *The Elements of Typographic Style* which comes with a plethora of explanations, many of them already baked into \TeX and \LaTeX .

1.1.1 Sections

- Avoid single sections. If you have, e.g., a section “1.1” then you should also have at least a section “1.2”.
- Avoid having too small chapters or sections. Rather use `\paragraph` to divide text into smaller chunks.

1.1.2 Spacing and Indentation

For separating parts of text in \LaTeX , please use two line breaks. They will then be set with correct indentation. Do *not* use:

- `\\`
- `\parskip`
- `\vskip`

or other commands to manually insert spaces, since they break the layout of this template.



Figure 1.1: KIT logo

1.1.3 Bibliography and References

The bibliography in this template is already configured. This template is based on `biblatex` and `biber`, which is preferred over the outdated `BBTeX` software. `Biber` is a bibliography processor, and thus reads both the `aux`- and `bib`-files to produce the bibliography. `Biber` should come with your `TeX` distribution. Please adjust your build environment if necessary (see <https://sdqweb.ipd.kit.edu/wiki/BibTeX-Literaturlisten#biblatex.2Fbiber>)

For referencing literature in your bibliography, you should use the following commands:

- `\citet{KeyBook2016}`: Ahrendt et al. (2016)
Use this when you want to explicitly talk about a publication within a sentence. This is especially sensible for publications that are of high relevance for your thesis.
- `\citep{KeyBook2016}`: (Ahrendt et al., 2016)
Use this for (implicit) references to indicate that what you wrote is based on the cited reference. The command can also be used for multiple references within one citation, separated by a comma (directly inside the command).

1.1.4 Floats (Figures, Tables, ...)

- Do not inline float environments such as tables, figures, listings, algorithms etc. Floats are elements that are automatically placed and optimized when compiling the document.
- Avoid using the options `H` or `h` for positioning floats.
- A reference: The KIT logo is displayed in Figure 1.1. (Use `\autoref{label}` for easy referencing.)
- **For tables:** The `booktabs` package offers nicely typeset tables, as in Table 1.1.
- For algorithms: Algorithms can be nicely set by a variety of packages, e.g., `algorithm2e`, `algorithmicx`, etc.
- For source code: The `lstlistings` or `minted` package offer nicely typeset and colored listings for your source code.

abc	def
ghi	jkl
123	456
789	0AB

Table 1.1: A table

1.1.5 Example: Mathematics

One of the nice things about the Linux Libertine font is that it comes with a math mode package.

$$f(x) = \Omega(g(x)) \ (x \rightarrow \infty) \Leftrightarrow \limsup_{x \rightarrow \infty} \left| \frac{f(x)}{g(x)} \right| > 0$$

For *definitions*, *theorems*, *proofs*, etc., please use the respective environments.

Theorem 1 (Pythagoras's theorem). *In a right-angled triangle, the following holds:*

$$a^2 + b^2 = c^2 \ .$$

2 Introduction

2.1 Motivation

Blockchain represents one of the most popular trends in finance and computer science, during the last few years the number of investments has been growing exponentially. According CoinGeko, the crypto market's value is standing around \$2 trillion.

Bitcoin can be considered the “father” of this technology. Nakamoto (2008) depicted that in his paper, and in the early 2009, it was effectively launched and the cryptocurrency Bitcoin was introduced. CoinGeko states the value of Bitcoin around \$38,553.70 and its market capitalization more than \$700 billions.

Many blockchain systems have been born with new capabilities, which have allowed them to fit many different use cases. The first, which allowed developers to code on top of itself, was Ethereum. Buterin (2014) published its whitepaper in 2014, and in 2015 it was deployed. The revolutionary aspect of Ethereum is the introduction of Smart Contract. These are programs running on blockchain systems and give the developers the opportunity to interact directly with this new technology. The development of innovative and prominent applications is a consequence of their development, such as NFT marketplaces, music royalty tracking, supply chain and logistics monitoring, voting mechanism, cross-border payments, and many others.

Interest in such a market has grown even among malicious attackers. Attacks such as the “Parity Wallet Hack” and the “Decentralized Autonomous Organization Attack” cost millions of dollars simply because of naive bugs in the smart contract code. Blockchain and smart contract technologies have multiple aims, but unfortunately, new applications based on them still contain bugs and multiple vulnerabilities, which cause several issues for the end-users. Most of the use of this technology relates to finance or certifications, therefore integrity, authentication and authorisation in transactions are mandatory. The research field behind blockchain technology is growing, as well as the one concerning its security and accordingly, many analysis tools were developed. These incorporate various strategies for performing the analyses, concerning the technical aspects of smart contracts, so these would work differently according to the object of the analysis.

The topic that will be addressed in this thesis work is the analysis of smart contract security properties with the usage of tools. It involves the understanding of smart contracts properties and the comparison between different tools, providing insight regarding their behaviours in different contexts.

2.2 Research Goals

Research Question: How do state-of-the-art analysis tools for Ethereum/Solidity perform (on different classes of properties/bugs)?

This thesis focuses on a dozen analytic tools, which we choose based on the type of analysis, trying to have a range of different typologies. We will test them on vulnerable smart contracts and figure out which properties are violated during real-world exploits. Furthermore, we are going to compare the tools, based on their performance, in particular, the criteria for the evaluation can cover the completeness of the analysis, the amount of found vulnerabilities and the number of false positive and negative. The execution time is crucial too, we want to understand how long it takes for finding a vulnerability. The time for the configuration and the report interpretability are parameters for defining how much a tool is user friendly.

For answering the research question, we will give an answer to sub questions such as:

- How does a tool perform the analysis?
- Which properties are relevant for smart contract security?
- Which ones have been violated in real-world exploits?
- Which tools detect which class of vulnerabilities?

2.3 Research Approach

Simil exposè

3 Preliminary Knowledge

3.1 History

3.2 Bitcoin

3.3 Ethereum

3.4 Smart Contract

3.5 Security Analysis

4 Most Common Vulnerabilities

Presentation of what effected the smart contrats in the recent year. The vulnerabilities that I found more often in papers that I read and I selected because I think they are the most rappresentative and the most common used by the attackers.

As introduction, I cite some papers that I read dealing with this topic. I select the following vulnerabilities, because I think they represent a risk still today.

4.1 Race Codition

Race condition represents in computer science one of the most common vulnerabilities. *Race conditions and deadlocks* (2020) identifies this as an even, which occurs when two threads access a shared variable at the same time. A case is illustruted when two threads read the value of a shared variable. After computing operations on that, they update the shared variable. The change applied by the last thread will be preserved and the other one will be lost. In a Solidity context an analogous situation can happen. This can be exploited by attackers, for withrowing a higher amount of token or manipulating the price of it.

(Not So) Smart Contracts is a repository that contains examples of common Ethereum smart contract vulnerabilities. Vulnerable smart contracts and explanations are coupled and presented. I considered the smart contract RaceCodition.sol for showing a case of this class of vulnerability. The vulnerability relies on the shared variable price, which is updated by the function changePrice (Listing 4.1 line 15) and used by the function buy (Listing 4.1 line 2).

```
1
2  function buy(uint new_price) payable
3      public
4  {
5      require(msg.value >= price);
6
7      // we assume that the RaceCondition contract
8      // has enough allowance
9      token.transferFrom(msg.sender, owner, price);
10
11     price = new_price;
12     owner = msg.sender;
13 }
14
15 function changePrice(uint new_price){
16     require(msg.sender == owner);
17     price = new_price;
```

```
18 }
```

Listing 4.1: Cross-function RaceCondition vulnerable functions.

When a user tries to buy tokens, the owner can call the function for changing the price of the token, consequently the attacked user will spend more than he expected.

4.2 Denial Of Services

The article *What is a denial-of-service attack* (2022) of CloudFare, proposes a definition of denial-of-service (DoS) attack. It is a type of cyber attack in which an attacker aims to render a computer or a informatic service (logical or phisical) unavailable to its intended users by interrupting the device's normal functioning.

In Solidity context, DoS consists of attacks where users can leave the contract inoperable for a small period of time, or in some cases, permanently. It represents a category of attacks, consequently it is not possible to classify a specific vulnerability or methodology for exploiting a thread.

As an example of this class of attack, I selected the smart contract presented by Arends (2022). It allows the user to place a bid to the contract. If it is the highest bid, it sends the previous leader the current bid and set the leader to the sender with the new highest bid. The vulnerability relies on line 12 (Referenceslst:DosContract1): the require condition is respected if the transaction which refunds the old leader doesn't revert. An attacker can exploit this vulnerability, creating a smart contract which cannot receive ether. Then it interacts with the vulnerable contract, becoming the leader. When the vulnerable tries to refund the attacker one, it will always revert because it cannot receive ether and no one could become the new leader.

```
1  pragma solidity ^0.8.0;
2
3  /**
4   * @title VulnerableContract
5   * @dev This contract is vulnerable to a denial of service (DoS) attack
6   */
7  contract VulnerableContract {
8      address payable leader;
9      uint256 public highestBid;
10
11     function bid() external payable {
12         require(msg.value > highestBid);
13
14         // Refund the old leader, if it fails then revert
15         require(leader.send(highestBid));
16
17         leader = payable(msg.sender);
18         highestBid = msg.value;
19     }
20
21     /// Helper function to check leader
22     function getLeader() external view returns (address) {
23         return leader;
```

```
24     }  
25 }
```

Listing 4.2: Dos Vulnerable Contract.

5 Real world Exploits

Real-world exploits that have happened in the recent years.

5.1 DeFi platform bZx: \$8M hack from one misplaced line of code

bZx Documentation (2020) explains how this protocol works. Anyone can use bZx to create apps that allow lenders, borrowers, and traders to interact with Ethereum based decentralised finance protocol. It is a community-run project, moreover all major protocol changes requiring a community vote.

Protocols can be developed by bZx protocol, an example is Fulcrum. It is a powerful DeFi platform for tokenized lending and margin trading. iTokens (margin loans) represent the earned holders interest on borrowed funds and pTokens (tokenized margin positions) allow your margin positions to be composable.

Unfortunately, it suffered a couple of attacks in February 2020. The developers explained the attackers could drain different currencies, 219,199.66 LINK, 4,502.70 Ether (ETH), 1,756,351.27 Tether (USDT), 1,412,048.48 USD Coin (USDC) and 667,988.62 Dai (DAI): a total of \$8 million in value. The attack depends on a bug based on an incorrect sequence of operations.

The object of the attack was the contract named LoanTokenLogicStandard. It implements the logic behind the protocol, for managing the borrows, loans and all the functionalities. Every ERC20 token has a `transferFrom()` function, which has the aim to transfer the tokens. Calling this function allowed the attacker to create and transfer an iToken to himself: his balance could be artificially increased. The duplicated tokens were then redeemed for their underlying collateral, with the hackers now “owning” a much higher percentage of the pool, so the attacker could withdraw the tokens.

The snippet code Listing 5.1 shows the vulnerable function. The attacker called the function with the same amount of `_from` and `_to`. Since both addresses refer to the same one, line 27 decreases the balance of the address, but then line 31 increases the same balance. The problem relies on the estimating of the amount: it is the sum of the sent token and a variable (line 23), which stored the value of the balance before the transaction.

```
1 contract LoanTokenLogicStandard is AdvancedToken, GasTokenUser {  
2     using SafeMath for uint256;  
3     using SignedSafeMath for int256;  
4  
5     modifier settlesInterest() {  
6         _settleInterest();  
7         _;
```

```
8 }
9 ...
10 function _internalTransferFrom(
11     address _from,
12     address _to,
13     uint256 _value,
14     uint256 _allowanceAmount)
15     internal
16     returns (bool)
17 {
18     if (_allowanceAmount != uint256(-1)) {
19         allowed[_from][msg.sender] = _allowanceAmount.sub(_value, "14");
20     }
21     //Vulnerable lines
22     uint256 _balancesFrom = balances[_from];
23     uint256 _balancesTo = balances[_to];
24
25     require(_to != address(0), "15");
26
27     uint256 _balancesFromNew = _balancesFrom
28         .sub(_value, "16");
29     balances[_from] = _balancesFromNew;
30
31     uint256 _balancesToNew = _balancesTo
32         .add(_value);
33     balances[_to] = _balancesToNew;
34
35     // handle checkpoint update
36     uint256 _currentPrice = tokenPrice();
37
38     _updateCheckpoints(
39         _from,
40         _balancesFrom,
41         _balancesFromNew,
42         _currentPrice
43     );
44     _updateCheckpoints(
45         _to,
46         _balancesTo,
47         _balancesToNew,
48         _currentPrice
49     );
50
51     emit Transfer(_from, _to, _value);
52     return true;
53 }
54 ...
```

Listing 5.1: Vulnerable function in LoanTokenLogicStandard contract.

The developers corrected the bug in few days. It was enough switching some line of code, in order to avoid the operations of sum and subtraction operate on the same balance. The code Listing 5.2 presents some differences. The operations regarding the receiver's balance are computed (lines 13-15), then those which deal with the sender's one (16-20).

```

1  function _internalTransferFrom(
2      address _from,
3      address _to,
4      uint256 _value,
5      uint256 _allowanceAmount)
6      internal
7      returns (bool)
8  {
9      if (_allowanceAmount != uint256(-1)) {
10         allowed[_from][msg.sender] = _allowanceAmount.sub(_value, "14");
11     }
12     require(_to != address(0), "15");
13     uint256 _balancesFrom = balances[_from];
14     uint256 _balancesFromNew = _balancesFrom
15         .sub(_value, "16");
16     balances[_from] = _balancesFromNew;
17     uint256 _balancesTo = balances[_to];
18     uint256 _balancesToNew = _balancesTo
19         .add(_value);
20     balances[_to] = _balancesToNew;
21     // handle checkpoint update
22     uint256 _currentPrice = tokenPrice();
23     _updateCheckpoints(
24         _from,
25         _balancesFrom,
26         _balancesFromNew,
27         _currentPrice
28     );
29     _updateCheckpoints(
30         _to,
31         _balancesTo,
32         _balancesToNew,
33         _currentPrice
34     );
35     emit Transfer(_from, _to, _value);
36     return true;
37 }

```

Listing 5.2: Corrected bug in LoanTokenLogicStandard contract.

5.2 XSURGE on BSC Chain

The *xSurge Assets* (2021)'s whitepaper provides a presentation of the ecosystem. It is described as a great DeFi investing idea based on proprietary pricing algorithms embedded in the Surge Token Variants' contracts. Surge Token Variants each have their own Market Maker, allowing them to trade continuously and outlast both centralised and decentralised exchanges. The strategy is to reward long-term holding by increasing a holder's claim of the backing asset. Each Surge Token utilizes a built-in contract exchange system that renounces the need for a traditional liquidity pool. Both assets are stored within the contract itself, rather than a liquidity pool pair of the backing asset to the token using a traditional market maker method for exchange and price calculation.

One of the Surge Token is SurgeBNB, the one which is my focus of analysis. *XSURGE on the BSC Chain was Attacked by Lightning Loans — A Full Analysis* (2021) explains in deep how the attack to this contract occurred. The Official claimed that the attacker had stolen \$5 million in SurgeBNB through a backdoor vulnerability. XSURGE stated that a potential security vulnerability in the SurgeBNB contract was discovered on August 16th. The attack is made by 4 main steps:

1. the attacker borrow 10,000BNB through flash loans.
2. Use all the BNB to buy SURGE. According to the current price, the attacker can buy 1,896,594,328,449,690 SURGE
3. He calls the "sell" function, for selling the obtained SURGE.
4. The sale function alters the data after the transfer, and the transfer code has a reentrance vulnerability. When the attack contract acquires BNB, the period before the SURGE contract's state changes (Referenceslst:SellSURGE line 15), the attack contract can use the reentrance vulnerability to purchase SURGE again.

```
1  function sell(uint256 tokenAmount) public nonReentrant returns (bool) {
2
3      address seller = msg.sender;
4
5      // make sure seller has this balance
6      require(_balances[seller] >= tokenAmount, 'cannot sell above token amount');
7
8      // calculate the sell fee from this transaction
9      uint256 tokensToSwap = tokenAmount.mul(sellFee).div(10**2);
10
11     // how much BNB are these tokens worth?
12     uint256 amountBNB = tokensToSwap.mul(calculatePrice());
13
14     // send BNB to Seller
15     (bool successful,) = payable(seller).call{value: amountBNB, gas: 40000}("");
16     if (successful) {
17         // subtract full amount from sender
18         _balances[seller] = _balances[seller].sub(tokenAmount, 'sender does not have
19         this amount to sell');
20         // if successful, remove tokens from supply
21         _totalSupply = _totalSupply.sub(tokenAmount);
22     } else {
23         revert();
24     }
25     emit Transfer(seller, address(this), tokenAmount);
26     return true;
27 }
```

Listing 5.3: Sell function of Surge (SURGE) token.

The bnb Amount of the contract stays intact, and the total amount of SURGE tokens `totalSupply` has not been updated, because the attack contract spends all of the BNB balance to acquire SURGE each time (still remains the quantity before the sell). As a result, the price of token falls, allowing the attacker to purchase additional SURGE.

```

1  function purchase(address buyer, uint256 bnbAmount) internal returns (bool) {
2      // make sure we don't buy more than the bnb in this contract
3      require(bnbAmount <= address(this).balance, 'purchase not included in balance');
4      // previous amount of BNB before we received any
5      uint256 prevBNBAmount = (address(this).balance).sub(bnbAmount);
6      // if this is the first purchase, use current balance
7      prevBNBAmount = prevBNBAmount == 0 ? address(this).balance : prevBNBAmount;
8      // find the number of tokens we should mint to keep up with the current price
9      uint256 nShouldPurchase = hyperInflatePrice ? _totalSupply.mul(bnbAmount).div(
address(this).balance) : _totalSupply.mul(bnbAmount).div(prevBNBAmount);
10     // apply our spread to tokens to inflate price relative to total supply
11     uint256 tokensToSend = nShouldPurchase.mul(spreadDivisor).div(10**2);
12     // revert if under 1
13     if (tokensToSend < 1) {
14         revert('Must Buy More Than One Surge');
15     }
16
17     // mint the tokens we need to the buyer
18     mint(buyer, tokensToSend);
19     emit Transfer(address(this), buyer, tokensToSend);
20     return true;
21 }

```

Listing 5.4: Purchase function of Surge (SURGE) token.

Repeating three times of Round 2 and Round 3, the attacker accumulates a large amount of SURGE through reentry, and then sells all the SURGE to make a profit.

At the end of this transaction, the attack contract sold 1,864,120,345,279,610,000 SURGE, obtained 10327 BNB, and finally the profitable 297 BNB was sent to the attacker's address.

The following are the modifications suggested by the Beosin technical team for this attack:

- any transfer operation should be place after the state changes to avoid reentry assaults.
- Instead of using "call. value," use transfer or send to transfer.

5.3 CBDAO: an example of rug pull

Developers should watch out for possible attacks. They should audit and test their contract to find possible vulnerabilities and apply patches. In the decentralized finance context, even the investors should worry about malicious developers, who convince the investors to invest and then steal their investments. These class of fraud are basically type of exit scam and decentralized finance (DeFi) exploit, it is classified with the name of rug pull.

Puggioni (2022) defines rug pull as a type of crypto scam that occurs when a team pumps their project's token before disappearing with the funds, leaving their investors with a valueless asset. Fraudulent developers create a new crypto token, pump up the price and then pull as much value out of them as possible before abandoning them as their price drops to zero.

An example of this type of fraud is the one presented in the article JEFF (2020). It seems the malicious developers could steal around 1 million dollar in ethereum (ETH).

The project main token was \$BREE. For attracting early investors, they associated to it a presale token, named \$SBREE. The ones who bought that, could swap their amount of presale token in \$BREE once the token was published, having an advantage. Unfortunately, one of the admin wallets exploited a backdoor in the SBREE token contract, minted 50,000 SBREE. After that, the attacker sold that amount in BREE token and sold it on the market. That pushed down the price of BREE at the expense of other holders. The 50,000 BREE was sold for under 200 ETH.

Following the operation of the malicious developer, it is possible to understand how the fraud occurred. This transaction, achieved by etherscan, shows the attacker called the mint function and could generate 50,000 SBREE. After that, it called the BreePurchase contract for swapping the token in BREE and then swap those in ETH on Uniswap.

The backdoor relies on the malicious management of access control. The admin, with the function grantRole, allow another wallet to be the Minter, so it called the function mint.

```
1
2  ...
3  function _grantRole(bytes32 role, address account) private {
4      if (_roles[role].members.add(account)) {
5          emit RoleGranted(role, account, _msgSender());
6      }
7  }
8  ...
9
10
11 contract Roles is AccessControl {
12
13     bytes32 public constant MINTER_ROLE = keccak256("MINTER");
14     bytes32 public constant OPERATOR_ROLE = keccak256("OPERATOR");
15
16     constructor () public {
17         _setupRole(DEFAULT_ADMIN_ROLE, _msgSender());
18         _setupRole(MINTER_ROLE, _msgSender());
19         _setupRole(OPERATOR_ROLE, _msgSender());
20     }
21
22     modifier onlyMinter() {
23         require(hasRole(MINTER_ROLE, _msgSender()), "Roles: caller does not have the MINTER
24         role");
25         _;
26     }
27
28     modifier onlyOperator() {
29         require(hasRole(OPERATOR_ROLE, _msgSender()), "Roles: caller does not have the
30         OPERATOR role");
31         _;
32     }
33 }
```

```
33 //the contract inherit Roles contract
34 ...
35 modifier onlyMinter() {
36     require(hasRole(MINTER_ROLE, _msgSender()), "Roles: caller does not have the MINTER
37     role");
38     _;
39 }
40 ...
41 function _mint(address account, uint256 amount) internal virtual {
42     require(account != address(0), "ERC20: mint to the zero address");
43     _beforeTokenTransfer(address(0), account, amount);
44     _totalSupply = _totalSupply.add(amount);
45     _balances[account] = _balances[account].add(amount);
46     emit Transfer(address(0), account, amount);
47 }
48 ...
49
```

Listing 5.5: Backdoor inside the contract

6 Analysis Tools

In this chapter I describe the tools and their capabilities, how they perform the Analysis.

6.1 Typologies of Tools

I explain the different types of analysis existing in general, as Symbolic execution, formal specification, scanner, Symbolic execution.

6.2 Tools for analysing properties specified by user

Description of Different types of tool, like a taxonomy.

Description of tools that we are going to use. I would say like an overview of their paper.

6.2.1 Celestial

6.2.2 SmartPulse

6.2.3 VeriSol

6.2.4 Echidna

Echidna is an open-source smart contract fuzzer, developed by Grieco et al. (2020), which makes it easy to automatically generate tests to detect violations in assertions and custom properties. Rather than relying on a fixed set of pre-defined bug oracles to detect vulnerabilities during fuzzing campaigns, Echidna supports three types of properties:

- user-defined properties (for property-based testing;
- assertion checking;
- gas use estimation.

Figure 6.1 depicts the Echidna architecture as a two-step process: pre-processing and fuzzing. The tool starts with a collection of contracts that have been supplied, as well as attributes that have been integrated into one of the contracts. Echidna uses Slither, smart contract static analysis framework presented in subsection 6.3.3, to build and analyse the contracts in order to find relevant constants and functions that directly handle Ether (ETH). The fuzzing effort begins in the second stage. Using the application binary interface (ABI) given by the contract, significant constants stated in the contract, and any previously

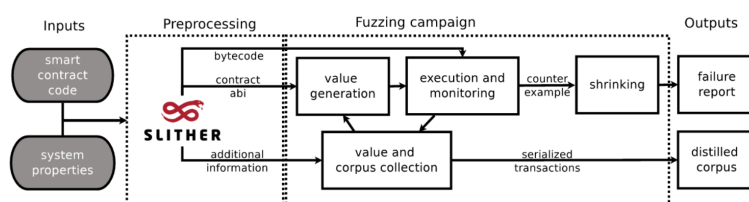


Figure 6.1: Echidna architecture

gathered sets of transactions from the corpus, this iterative procedure creates random transactions. When a property violation is detected, a counterexample is created to indicate the smallest and most basic sequence of operations that caused the failure.

The code Listing 6.1 provides an example of invariant in Echidna context. The Solidity contract contains a vulnerability at the backdoor function. The output of the terminal is presented in Listing 6.2: the attacker. For breaking the property, can call in order the functions `airdrops()` and `backdoor()`

```

1 contract Token{
2     mapping(address => uint) public balances;
3     function airdrop() public{
4         balances[msg.sender] = 1000;
5     }
6     function consume() public{
7         require(balances[msg.sender]>0);
8         balances[msg.sender] -= 1;
9     }
10    function backdoor() public{
11        balances[msg.sender] += 1;
12    }
13    function echidna_balance_under_1000() public view returns(bool){
14        return balances[msg.sender] <= 1000;
15    }
16 }

```

Listing 6.1: Solidity smart contract implementing a vulnerable Token and an Echidna invariant function.

```

1 $ echidna-test testtoken.sol --contract TestToken
2 ...
3 echidna_balance_under_1000: failed!
4 Call sequence, shrinking (1205/5000):
5 airdrop()
6 backdoor()
7
8 ...

```

Listing 6.2: Tool's result after the execution of the previous code.

The tool can be even used to test assertions. The aim is equivalent of the invariant testing methodology, but in this case properties are expressed using the Solidity annotation of assertion.

6.2.5 Solc-Verify

Ákos Hajdu and Jovanović (2020) present solc-verify, a source-level verification tool for Ethereum smart contracts. It takes smart contracts written in Solidity and discharges verification conditions using modular program analysis. It is built on top of the Solidity compiler, so it reasons at the level of the contract source code. Because of that, Solc-verify is able to reason about high-level contract attributes while accurately modeling low-level language semantics.

Solc-verify is implemented as an extension to the Solidity compiler. It accepts a collection of Solidity contracts, including specification annotations, and uses the Boogie verifier and SMT solvers to discharge verification conditions.

As Ákos Hajdu, Jovanović, and Ciocarlie (2020) explain, Solc-verify translates the annotated contracts to the Boogie Intermediate Verification Language (IVL). The key idea of the translation is to encode state variables as global heaps and functions as procedures. Solc-verify relies on the Boogie verifier to perform modular verification by discharging verification conditions to SMT solvers. The verification conditions encode the function body while assuming the preconditions, and then check if postconditions hold. In this process, function calls are replaced by their specification and loops by their invariants (modularity). Finally, the results are back-annotated to the Solidity source.

Listing 6.3 presents an example of annotation, which states that the contract will ensure that the sum of individual balances is equal to the total balance in the bank.

```

1 pragma solidity >=0.7.0;
2
3 /**
4  * @notice invariant __verifier_sum_uint(balances) <= address(this).balance
5  */
6 contract SimpleBank {
7     mapping(address=>uint) balances;
8
9     function deposit() public payable {
10         balances[msg.sender] += msg.value;
11     }
12
13     function withdraw(uint256 amount) public {
14         require(balances[msg.sender] > amount);
15         bool ok;
16         (ok, ) = msg.sender.call{value: amount}(""); // Reentrancy attack
17         if (!ok) revert();
18         balances[msg.sender] -= amount;
19     }
20 }

```

Listing 6.3: An example Solidity smart contract implementing a simple bank with SolcVerify annotations.

Ákos Hajdu and Jovanović (2021) on GitHub repository, present the specification annotations. Those must be included in special documentation comments (`///` or `/** */`) and must start with the special doctag `@notice`. They must be side-effect free Solidity expressions (with some verifier specific extensions) and can refer to variables within the

scope of the annotated element. Functions cannot be called in the annotations, except for getters. The currently available annotations are listed below.

- Function pre/postconditions can be attached to functions. Preconditions are assumed before executing the function and postconditions are checked (asserted) in the end. The expression can refer to variables in the scope of the function. The postcondition can also refer to the return value if it is named.
- Contract level invariants can be attached to contracts. They are included as both a pre- and a postcondition for each public function. The expression can refer to state variables in the contract (and its balance).
- Loop invariants can be attached to for and while loops. The expression can refer to variables in scope of the loop, including the loop counter.
- Modification specifiers can be attached to functions. The target can be a (1) state variable, including index and member accesses or (2) a balance of an address in scope. Note however, that balance changes due to gas cost or miner rewards are currently not modeled.
- Event data specification can be attached to events that should be emitted when certain data changes. Events can declare the state variable(s) they track for changes, or in other words, the variables for which the event should be emitted on a change.

6.3 Tools without specification

6.3.1 VeriSmart

6.3.2 SmartTest

SmartTest is a safety analyzer for Ethereum smart contracts developed by So, Hong, and Oh (2021). It adopts a symbolic execution technique for effectively detecting vulnerable transaction sequences. The main challenge of the project involves the tool to find transaction sequences, revealing the vulnerabilities of the analysed smart contract. Therefore, bugs are discovered as the cause of the interaction of multiple transactions. The purpose of SmartTest is to automatically deliver vulnerable transaction sequences, which demonstrate the weaknesses of the smart contract. The main idea is to build a statistical model using known vulnerable transaction sequences and use it to direct symbolic execution toward more successfully detecting unknown vulnerabilities. Symbolic execution is guided by statistical language models, so it can prioritize transaction sequences which are likely to reveal vulnerabilities. This strategy involves firstly to run unguided symbolic execution on existing vulnerable contracts, then to learn a probability distribution over vulnerable transaction sequences.

The tool is implemented as an extension of VeriSmart subsection 6.3.1. SmartTest is build on top of that, adding its own functionalities:

- symbolic execution with a language model.

- Symbolic executor for transaction sequences.
- Constraint solving optimization.

```
1 ./main.native -input examples/leak_unsafe.sol -mode exploit -exploit_timeout 10
```

The report Listing 6.5 shows an example of output of SmarTest, which provides the sequence of funtions for exploiting the found bug.

The detection of the following six types of security-critical vulnerabilities are supported by the tool: integer over/underflow, assertion violation, division-by-zero, ERC20 standard violation, Ether-leaking vulnerability (e.g., unauthorized access to transfer), and suicidal vulnerability (e.g., unauthorized access to selfdestruct). In the paper, the authors focus on just those, without considering vulnerabilities that require analysis of the interaction of multiple contracts to demonstrate the flaws (e.g., reentrancy).

Slither is described by Feist, Grieco, and Groce (2019) as an open-source static analysis framework. It uses its own intermediate representation, SlithIR, which was created to simplify static analysis of Solidity code. Concolic analysis, taint analysis, and control flow

checking are involved for detecting a variety of security vulnerabilities. It is designed to provide granular information about smart contract code and the flexibility necessary to support many applications.

It is mainly used for:

- Automated vulnerability detection: a large variety of smart contract bugs can be detected without user inter- vention.
- Automated optimization detection: Slither detects code optimizations that the compiler misses.
- Code understanding: printers summarize and display contracts' information to aid in the study of the codebase.
- Assisted code review: through its API, a user can interact with Slither.

Slither implements more than twenty bug detectors, regarding reentrancy, Uninitialized variables, Shadowing and many other. The tool allows the developers to integrate more detectors, therefore it extends Slither's capabilities to detect more advanced bugs.

Slither (2019) is written in python 3 and it is published on GitHub. During the installation, I did not find any particular issues.

6.3.4 Mythril

Mythril is a security analysis tool for Ethereum smart contracts. It was introduced by Mueller (2018).

The tool relies on concolic analysis, taint analysis and control flow checking of the EVM bytecode to prune the search space and to look for values that allow exploiting vulnerabilities in the smart contract. It is targeted at finding common vulnerabilities, and is not able to discover issues in the business logic of an application. *SmartContractSecurity. SWC Registry* (2020)'s taxonomy of vulnerabilities is used by Mythril for classify them. Listing 6.6 illustrates an example of output of Mythril analysis. At the second line, there is the reference to the vulnerability classified by SWC Registry with the ID of 110 (Assert Violation).

```
1 ==== Exception State ====
2 SWC ID: 110
3 Severity: Medium
4 Contract: Token
5 Function name: transferArray(address[],uint256[])
6 PC address: 4385
7 Estimated Gas Usage: 944 - 6585
8 An assertion violation was triggered.
9 It is possible to trigger an assertion violation. Note that Solidity assert() statements
  should only be used to check invariants. Review the transaction trace generated for this
  issue and either make sure your program logic is correct, or use require() instead of
  assert() if your goal is to constrain user inputs or enforce preconditions. Remember to
  validate inputs from both callers (for instance, via passed arguments) and callees (for
  instance, via return values).
10 -----
```

```
11 In file: test.sol:309
12
13 function transferArray(address[] tos, uint256[] values) public returns (bool) {
14     for (uint8 i = 0; i < tos.length; i++) {
15         require(transfer(tos[i], values[i]));
16     }
17
18     return true;
19 }
20
21 -----
```

Listing 6.6: Example of the output of Mythril Analysis.

6.3.5 Maian

6.3.6 Securify

6.3.7 ContractLarva

contractLarva is a runtime verification tool for Solidity contracts.

7 Results of testing

8 Evaluation

...

8.1 First Section

...

8.2 Second Section

...

8.3 Third Section

...

9 Conclusion

...

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A Appendix

A.1 First Appendix Section

Figure A.1: A figure

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