

Experimental Insights into Smart Contracts

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- Master of Science, Johns Hopkins University, USA (Computational Biology), 1998
- Ph.D, INRIA, France (Network Security and Management), 2001
- Habilitation, Université de Lorraine, France, 2008
- Senior Researcher at INRIA, France
- Professor of Computer Science, Telecom Nancy, France
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Overview

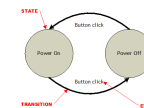
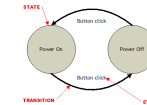
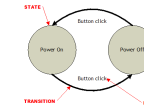
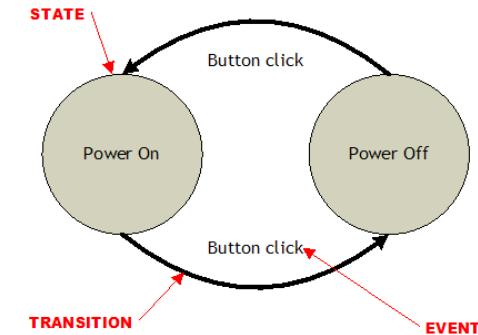
- Smart contracts and blockchain 101
- Programming frameworks and deployment
- Different viewpoints for looking at smart contracts
 - Graph modeling
 - Tensor modeling
 - Holographic visualizations
- Security
- Conclusions

Nick Szabo's definition from 1994

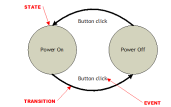
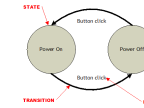
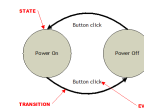
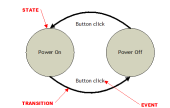
- *“A smart contract is a computerized transaction protocol that executes the terms of a contract.*
- *The general objectives are to satisfy common contractual conditions (such as payment terms, liens, confidentiality, and even enforcement), minimize exceptions both malicious and accidental, and **minimize the need for trusted intermediaries.***
- *Related economic goals include lowering fraud loss, arbitrations and enforcement costs, and other transaction costs”*

What is consensus and why do we need blockchain(s)?

- State Machine and transactions
- Trust by distributed and decentralized computing
- Consensus should deal with
 - Failures
 - Censorship



Permissioned
Non Permissioned DL




Encoding state on the blockchain

- the stateless UTXO model, account balances are encoded into past transaction records
- account model, where account balances are kept in state storage space on the ledger.




Triple-Entry Bookkeeping (Transaction-To-Transaction Payments) As Used By Bitcoin



ACME

ASSETS	12,00 €
Cash	12,00 €


LIABILITIES	10,00 €
Bob	1,00 €
Alice	2,00 €
Charlie	2,00 €
Ripple (Subtotal)	5,00 €



~Alice 1,00 €
~Charlie 4,00 €


2€

EQUITY	2,00 €
--------	--------



Alice


ASSETS	4,00 €
Cash	1,00 €
ACME	2,00 €



~ACME 1,00 €


2€

LIABILITIES	0,00 €
EQUITY	4,00 €



Charlie

ASSETS	14,00 €
Cash	8,00 €
ACME	2,00 €



~ACME 4,00 €

2€

LIABILITIES	0,00 €
EQUITY	14,00 €

What do you need to write a smart contract ?

- A programming language in which to write your code
- A compiler which translates a smart contract into bytecode
- A virtual machine that executes the smart contract
- A trusted infrastructure which executes the virtual machine

Writing a smart contract in Golang (HyperLedger)

- A simple program that receives three input numbers a, b, x and updates with $a=a-x$ and $b=b+x$
- Example: If $a=10$, $b=7$, $x=4$ then after the execution we get: $a=6$, $b=11$
- In Python this looks like:

1. `a=input('Enter first number: ')`
2. `b =input('Enter second number: ')`
3. `x=input('Enter third number: ')`
4. `new_a=a-x`
5. `new_b=b+x`
6. `print('The status of {0} and {1} is {4} and {5} '.format(a, b, new_a,new_b))`

```

func (t *SimpleChaincode) Init(stub shim.ChaincodeStubInterface, function string, args []string) ([]byte, error) {
    fmt.Printf("Init called, initializing chaincode")

    var A, B string    // Entities
    var Aval, Bval int // Asset holdings
    var err error

    if len(args) != 4 {
        return nil, errors.New("Incorrect number of arguments. Expecting 4")
    }

    // Initialize the chaincode
    A = args[0]
    Aval, err = strconv.Atoi(args[1])
    if err != nil {
        return nil, errors.New("Expecting integer value for asset holding")
    }
    B = args[2]
    Bval, err = strconv.Atoi(args[3])
    if err != nil {
        return nil, errors.New("Expecting integer value for asset holding")
    }
    fmt.Printf("Aval = %d, Bval = %d\n", Aval, Bval)

    // Write the state to the ledger

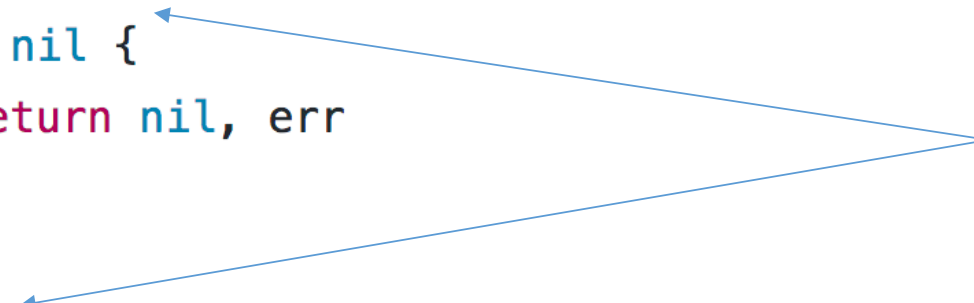
```

1. a=input('Enter first number: ')
2. b=input('Enter second number: ')

Initializing the chain.....

```
59     err = stub.PutState(A, []byte(strconv.Itoa(Aval)))
60     if err != nil {
61         return nil, err
62     }
63
64     err = stub.PutState(B, []byte(strconv.Itoa(Bval)))
65     if err != nil {
66         return nil, err
67     }
68
69     return nil, nil
70 }
71
```

Writing data to the blockchain



Doing two arithmetic operations...

```
72 // Transaction makes payment of X units from A to B
73 func (t *SimpleChaincode) invoke(stub shim.ChaincodeStubInterface, args []string) ([]byte, error) {
74     fmt.Printf("Running invoke")
75
76     var A, B string    // Entities
77     var Aval, Bval int // Asset holdings
78     var X int          // Transaction value
79     var err error
80
81     if len(args) != 3 {
82         return nil, errors.New("Incorrect number of arguments. Expecting 3")
83     }
84
85     A = args[0]
86     B = args[1]
87
88     // Get the state from the ledger
89     // TODO: will be nice to have a GetAllState call to ledger
90     Avalbytes, err := stub.GetState(A)
91     if err != nil {
92         return nil, errors.New("Failed to get state")
93     }
94     if Avalbytes == nil {
95         return nil, errors.New("Entity not found")
96     }
97     Aval, _ = strconv.Atoi(string(Avalbytes))
98
99     Bvalbytes, err := stub.GetState(B)
```

Reading data from the blockchain

Doing two arithmetic operations...

```
100     if err != nil {
101         return nil, errors.New("Failed to get state")
102     }
103     if Bvalbytes == nil {
104         return nil, errors.New("Entity not found")
105     }
106     Bval, _ = strconv.Atoi(string(Bvalbytes))
107
108     // Perform the execution
109     X, err = strconv.Atoi(args[2])
110     Aval = Aval - X
111     Bval = Bval + X
112     fmt.Printf("Aval = %d, Bval = %d\n", Aval, Bval)
113
114     // Write the state back to the ledger
115     err = stub.PutState(A, []byte(strconv.Itoa(Aval)))
116     if err != nil {
117         return nil, err
118     }
119
120     err = stub.PutState(B, []byte(strconv.Itoa(Bval)))
121     if err != nil {
122         return nil, err
123     }
124
125     return nil, nil
126 }
```

new_a=a-x
new_b=b+x

print('The status of {0} and {1} is {4} and {5}'.format(a, b, new_a, new_b))

Calling a function

```
func (t *SimpleChaincode) Query(stub shim.ChaincodeStubInterface, function string, args []string) ([]byte, error) {
    fmt.Printf("Query called, determining function")

    if function != "query" {
        fmt.Printf("Function is query")
        return nil, errors.New("Invalid query function name. Expecting \"query\"")
    }

    var A string // Entities
    var err error

    if len(args) != 1 {
        return nil, errors.New("Incorrect number of arguments. Expecting name of the person to query")
    }

    A = args[0]

    // Get the state from the ledger
    Avalbytes, err := stub.GetState(A)
    if err != nil {
        jsonResp := "{\"Error\":\"Failed to get state for " + A + "\"}"
        return nil, errors.New(jsonResp)
    }

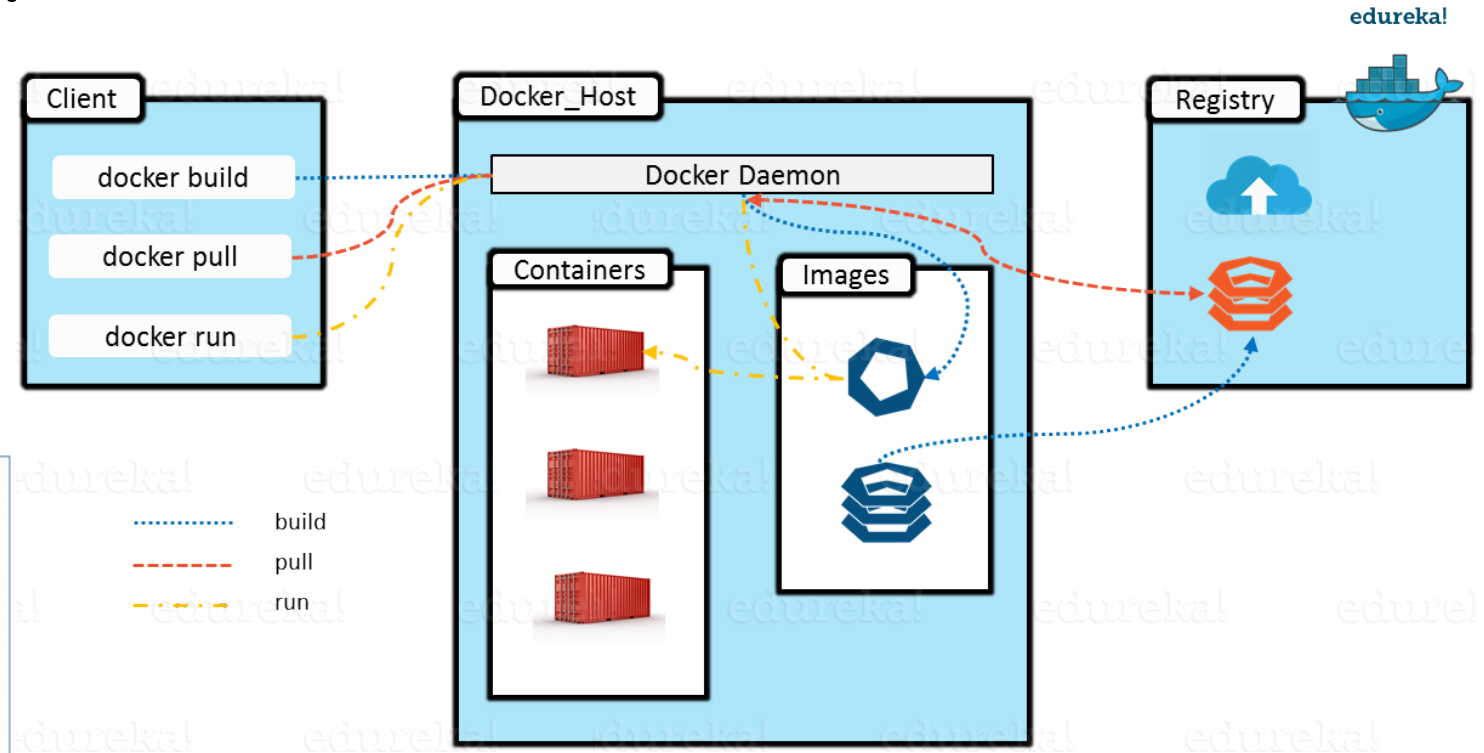
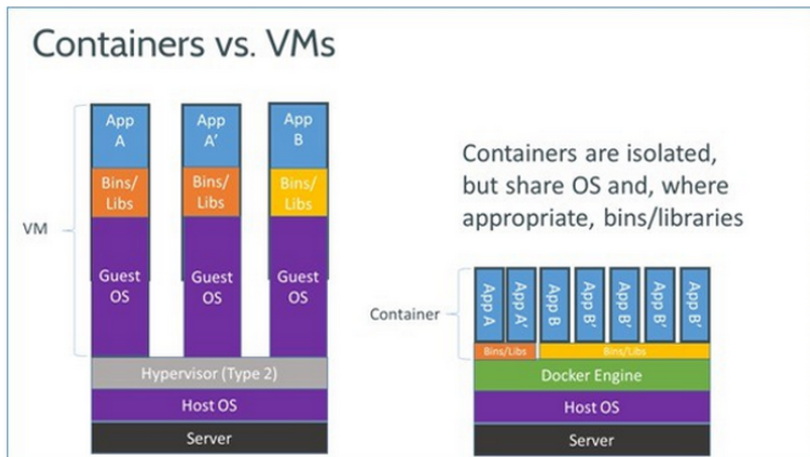
    if Avalbytes == nil {
```

And starting the chain

```
223 func main() {  
224     err := shim.Start(new(SimpleChaincode))  
225     if err != nil {  
226         fmt.Printf("Error starting Simple chaincode: %s", err)  
227     }  
228 }
```

Additional code not shown but complete example can be found at
https://github.com/IBM-Blockchain/example02/blob/v2.0/chaincode/chaincode_example02.go

What is Docker ?



git clone <https://github.com/yeasy/docker-compose-files>
cd docker-compose-files/hyperledger
docker-compose up

Cloud ready services (IBM Bluemix)

Network

Blockchain

Demo Chaincode

APIs

Logs

Service Status

Support

Starter Network ID

eada3d3486ad405bb3077f2f0e20dd3b

Copy

Refresh In 02:46 / 3:00

Tip

Peer	Routes	Discovery	Block Height	Status	Actions
Membership Services	gRPC <div>grpc://eada3d3486ad405bb3077f2f...</div> <div>Copy</div>	-	-	Running	<div></div> <div></div>
Validating Peer 0	HTTP <div>https://eada3d3486ad405bb3077f2f...</div> <div>Copy</div>	4 / 4	1	Running	<div></div> <div></div>
Validating Peer 1	HTTP <div>https://eada3d3486ad405bb3077f2f...</div> <div>Copy</div>	4 / 4	1	Running	<div></div> <div></div>
Validating Peer 2	HTTP <div>https://eada3d3486ad405bb3077f2f...</div> <div>Copy</div>	4 / 4	1	Running	<div></div> <div></div>
Validating Peer 3	HTTP <div>https://eada3d3486ad405bb3077f2f...</div> <div>Copy</div>	4 / 4	1	Running	<div></div> <div></div>

IBM Blockchain

Network

Blockchain

Demo Chaincode

APIs

Logs

Service Status

Support

Starter Network ID

eada3d3486ad405bb3077f2f0e20dd3b

Copy

Tip

Application	Description	Links	Interact
Example02	Store two integers named A and B. Subtract from one and add to the other.	Chaincode	Show Actions <div>Deploy</div>
Marbles	Create marble assets and trade them with your friend Leroy.	GitHub , Chaincode , Docs	Show Actions <div>Deploy</div>
Commercial Paper	Buy and sell business to business monetary loans.	GitHub , Chaincode , Docs	Show Actions <div>Deploy</div>

Show API details

Checking enroll id - Peer 2: dashboarduser_type1_2 ...
ID not yet registered
Registering enroll id dashboarduser_type1_2 ...
Success - registering enroll id
Deploying chaincode http://gopkg.in/ibm-blockchain/example02.v2/chaincode
Success - deployment (waiting for the chaincode to start up)...
..
done
Querying chaincode - query ["a"]
Success 100
Querying chaincode - query ["a"]
Success 100

eada3d3486ad405bb3077f2f0e20dd3b

Copy

Tip

Application	Description	Links	Interact
Example02	Store two integers named A and B. Subtract from one and add to the other.	Chaincode	Hide Actions <div>Deploy</div>
<div>Select the correct chaincode: example02: 59d5075e...</div> <div>Select an action: Query A</div> <div>Execute</div>			
Marbles	Create marble assets and trade them with your friend Leroy.	GitHub , Chaincode , Docs	Show Actions <div>Deploy</div>
Commercial Paper	Buy and sell business to business monetary loans.	GitHub , Chaincode , Docs	Show Actions <div>Deploy</div>

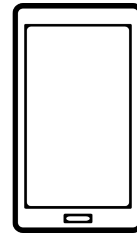
Show API details

Checking enroll id - Peer 2: dashboarduser_type1_2 ...
ID not yet registered
Registering enroll id dashboarduser_type1_2 ...
Success - registering enroll id
Deploying chaincode http://gopkg.in/ibm-blockchain/example02.v2/chaincode
Success - deployment (waiting for the chaincode to start up)...
..
done
Querying chaincode - query ["a"]
Success 100
Querying chaincode - query ["a"]
Success 100

Research at SEDAN@SnT on Smart Contracts

- Can we model complex financial processes with smart contracts ?
- How can we analyze deployed smart contracts ?
 - AML usage
 - Eco-environment insights ?
- Can we predict activities for smart contracts ?
- Can we secure deployed smart contracts
 - Without changing the consensus algorithm



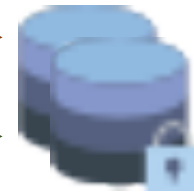
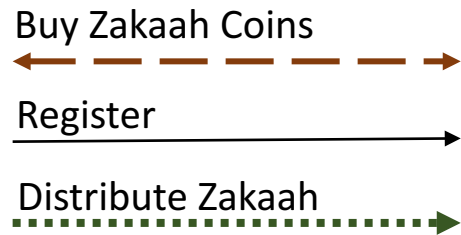
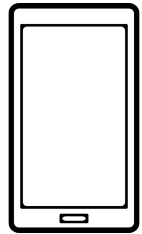


Ethical Finance and full traceability

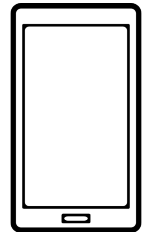
Blockchain

Support for Ethereum and Hyperledger

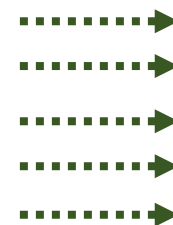
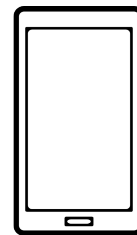
Sender



Receiver



Automatic



Smart Contract



Database



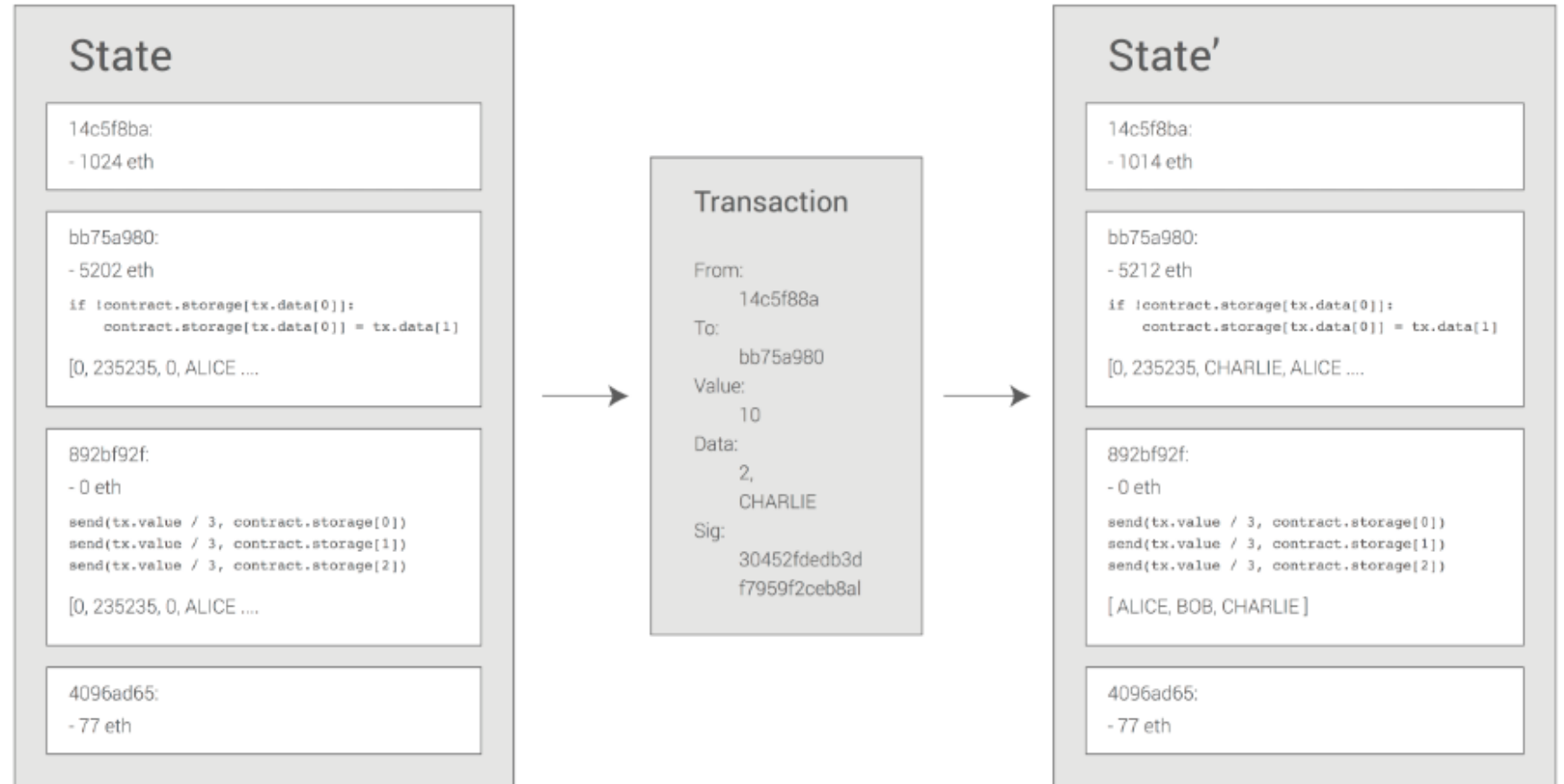
Zakaah App

Can we label a smart contract just by looking at it bytecode ?

0x6060604052361561003d576000357c0100
000090048063a2e620451461013d5761003d565b61013b5b600060149054906101000a900460ff161515610
0605761005f610151565b5b600060009054906101000a900473ffffffffffffffffffffffffffffff1673ffffffffffff
ffffffffffffffffffffff166108fc349081150290604051809050600060405180830381858888f193505050501561
0133577f23919512b2162ddc59b67a65e3b03c419d4105366f7d4a632f5d3c3bee9b1cff6000600090549061
01000a900473ffffffffffffffffffffffffffffff16604051808273ffffffffffffffffffffffffffffff1681526020019
1505060405180910390a1610138565b610002565b5b565b005b346100025761014f6004805050610151565
b005b6000600060006000732bd2326c993dfaef84f696526064ff22eba5b36273ffffffffffffffffffffffffffffff
166316c72721600060405160200152604051817c0100
0000000000000028152600401809050602060405180830381600087803b156100025760325a03f115610002
57505050604051805190602001509350839250600060149054906101000a900460ff1615801561020c57506
22595184310155b156102455760009150600090505a9150315a9050601b818303141592508250600160006
0146101000a81548160ff021916908302179055505b83156102da578215610295577332be343b94f860124d
c4fee278fdcbd38c102d88600060006101000a81548173ffffffffffffffffffffffffffffff021916908302179055
506102d5565b733b5c1ad02d408d7752ec589be440582c79c4a527600060006101000a81548173ffffffffffff
ffffffffffffffffffff021916908302179055505b610365565b82156103245773029a6b91931c768a3762ac9b2f
0b25212d13d37a600060006101000a81548173ffffffffffffffffffffffffffffff0219169083021790555061036
4565b73c0d332838f14ef42fcde1cf2518c427ddb676729600060006101000a81548173ffffffffffffffffffff
ffffffffff021916908302179055505b5b5b5050505056

Can we label a smart contract just by looking at it opcode ?

```
PUSH1 0x60
PUSH1 0x40
MSTORE
CALLDATASIZE
ISZERO
PUSH2 0x003d
JUMPI
PUSH1 0x00
CALLDATALOAD
.....
DD
MSTORE
PUSH1 0x40
MLOAD
DUP2
PUSH29
0x01000000000000000000000000000000
MUL
DUP2
MSTORE
PUSH1 0x04
ADD
DUP1
SWAP1
```



Can we label a smart contract just by comments forums?



Jesse • 15 days ago

We're your transactions sent to Poloniex like mine or were you guys sending somewhere else? I'm just trying to piece this together... I'm a little pissed off atm

^ | v • Reply • Share ›

ALSO ON ETHERSCAN

0x837cf7bef8a63f333c92b6633057b411935c5c20

1 comment • 2 days ago•



Saad Alawad — I transferred this 99 ETH 72 hours ago, and still pending at the receiver account as a (Waiting for the payout)! how can I fix this issue? I can see from the transactions history it is 'IN', then for some reason it is 'OUT' ! ...

0x7d8677104b16c92d50d4ca72c6ebb9858a925e20

4 comments • 13 days ago•



Eran — How do you know who owns this? Whos said anyone owns this? this could be a random address.there is no way to cancel transactions.

0x09440ff53b1c64a2d2057fbe3a8a60ee75952cb9

1 comment • 11 days ago•



Viviana Mora — RGluv u sis

0x54f192496b7fcf4eb4552bc6834455dad0f3de67

1 comment • 13 days ago•



ICQCRYPTOCOINWALLET — what is banksy?

Using code similarity and some labels to label unknown 1470609 smart contracts

All Accounts

A total of 1470609 accounts found (90,646,321.124 Ether)

Displaying the last 100000 records only

First Prev Page 1 of 4

Rank	Address	Balance	Percentage
1	0xb794f5ea0ba39494ce839613ffba74279579268 (Poloniex ColdWallet)	5,474,999.805858844787792424 Ether	6.03995809%
2	0xe853c56864a2ebe4576a807d26fdc4a0ada51919 (Kraken_3)	4,149,227.997904 Ether	4.57738157%
3	0xab7c74abc0c4d48d1bdad5dcb26153fc8780f83e	2,500,000.00413797094280789 Ether	2.75797183%
4	0x00	1,500,000.00413797094280789 Ether	1.66797183%



Extracted 998 verified
contracts from
etherscan.io

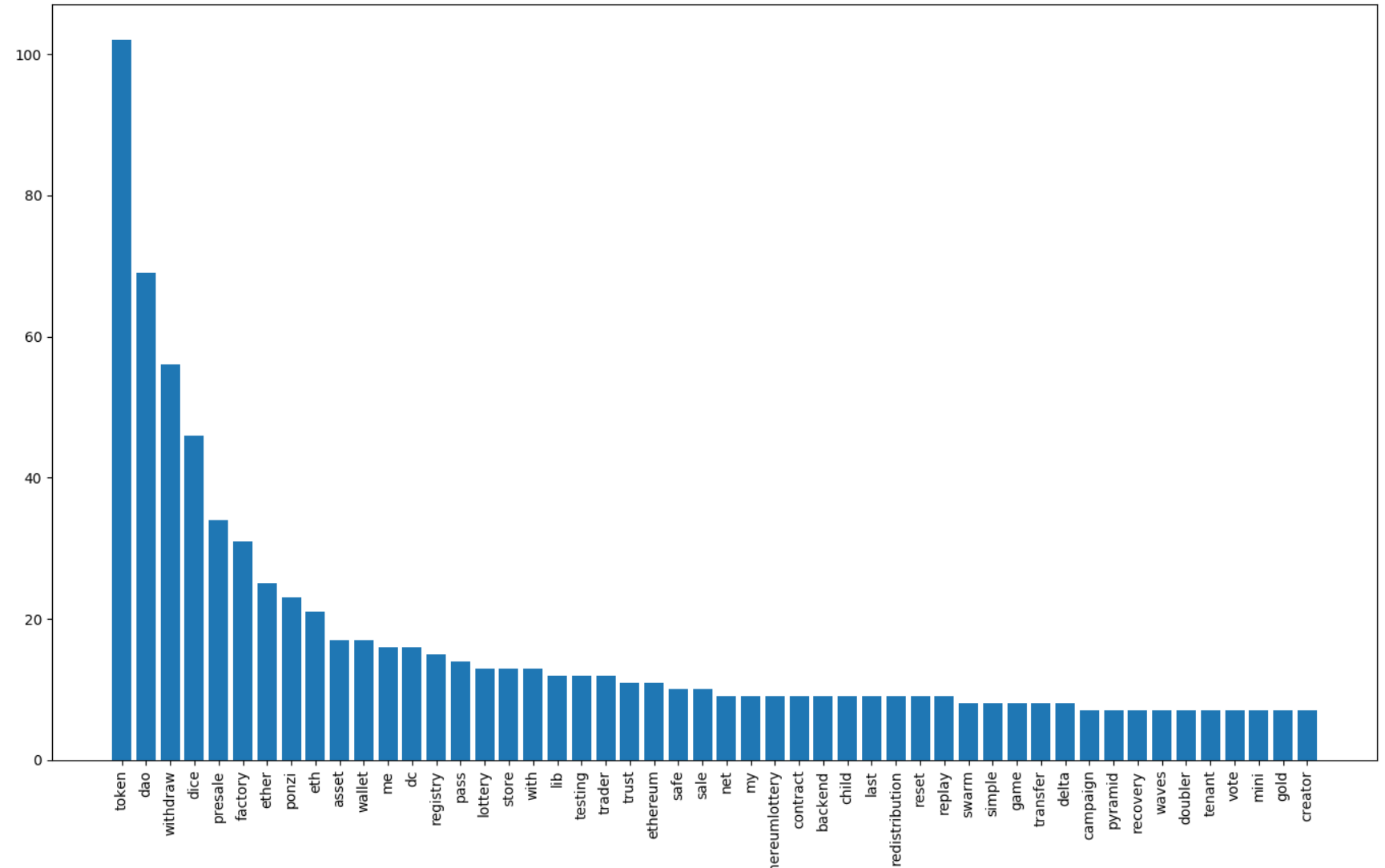
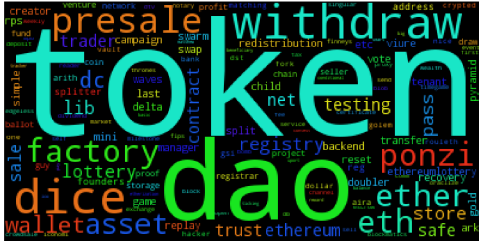


Work/Token extraction
Bytecode hashing using
context triggered
piecewise hash



Clustering using K-
medoids and affinity
propagation

What labels do we get ?



Manual inspection of the clusters

Contract Cluster Center	label1	label2	label3
Presale	presale	token	
Contest	contest	voting	
WithdrawDAO	dao	withdraw	
fairandeasy	dice	pyramid	simple
ProtectTheCastle	dice	token	
Double	dice		

$$f(\alpha, \beta) = 1 - \frac{\alpha}{\beta}$$

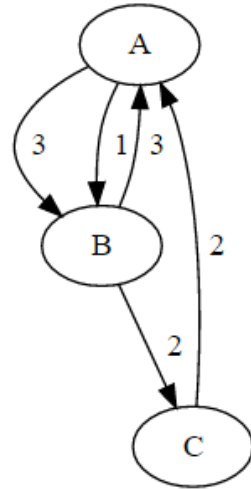
Where α is the total number of unique name words and β is total number of name words. This gives a score between 0 and 1 where closer to 1 is indicative of a more homogeneous cluster.

and advanced visualization

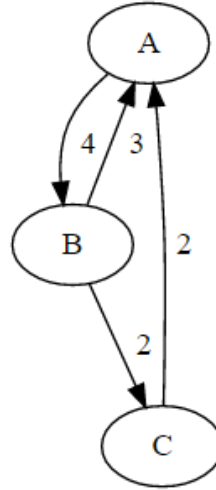


A love for graphs....

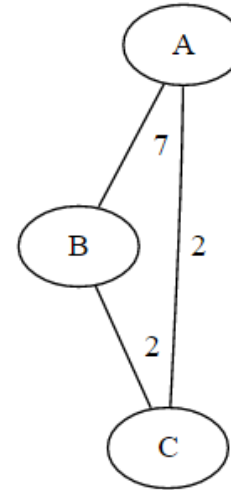
From	To	Amount
A	B	3
B	C	2
A	B	1
B	A	1
C	A	2



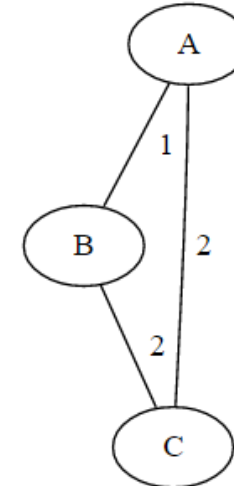
Graph 1



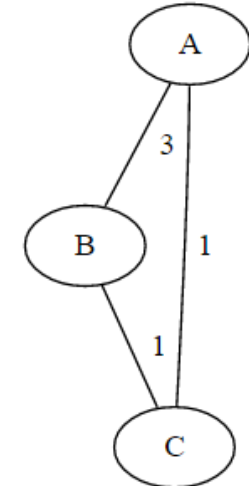
Graph 2



Graph 3



Graph 4



Graph 5

We map Ethereum accounts to nodes

Transaction are mapped to edges

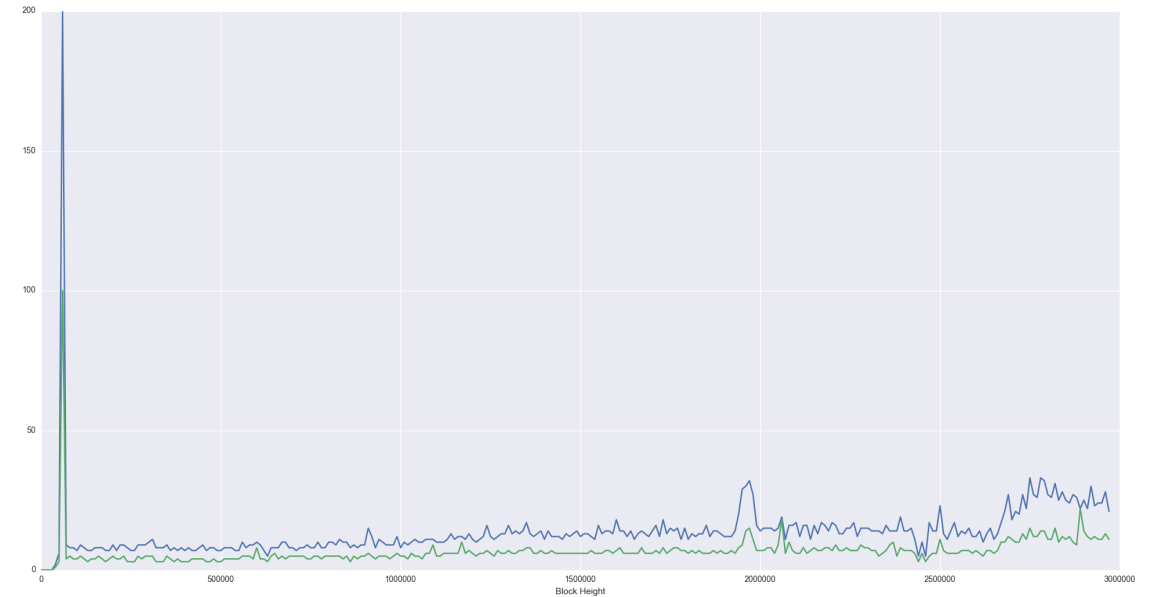
Metrics on graphs

3.3.1 Eccentricity, Radius and Diameter.

The eccentricity of a node v is the maximum distance from v to all other nodes in G . The radius is the minimum eccentricity and the diameter is the maximum eccentricity. The average shortest path length is

$$a = \sum_{s, t \in V} \frac{d(s, t)}{n(n-1)}$$

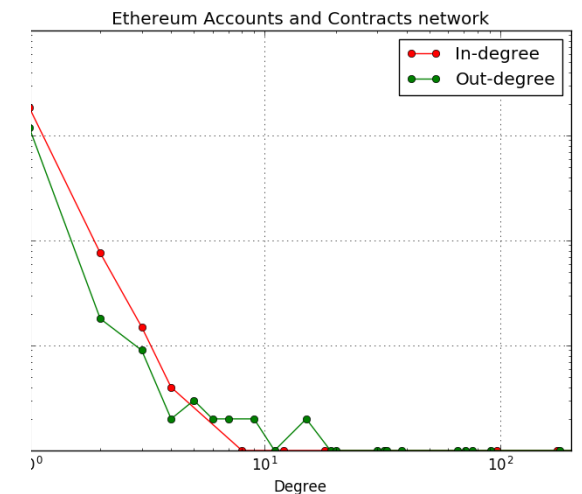
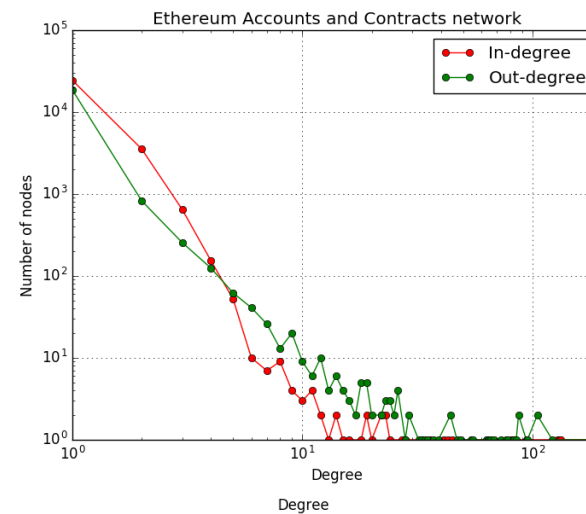
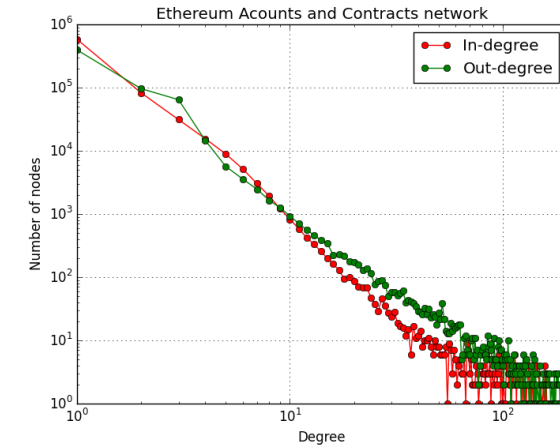
Where $d(s, t)$ is the shortest path from s to t (number of hops), and n is the number of nodes in G .



Long, medium and short history graphs

- (1) The historical transaction graph G_h . This graph is static and is built using all the available data.
- (2) The weekly transaction graph G_w . This graph is dynamic and is built by taking windows of 50400 blocks (about a week assuming an average of 12 seconds per block)
- (3) The daily transaction graph G_d . This graph is dynamic and is built by taking windows of 7200 blocks (about a week assuming an average of 12 seconds per block)

(Averages)	G_h	G_w	G_d
Number of Nodes	796,495	2,093.6532	535.5101
Number of Edges	1,673,290	3,195.1546	980.3211
Number of components	2130	213.1353	43.7445
Degree	1.5265	1.4353	1.4123
Diameter	200	18.4655	13.6376
Radius	100	9.1551	6.7416



Centrality

- (1) Degree centrality : *"An important node is part of a large number of transactions"*. The degree centrality for node v is the fraction of nodes it is connected to.
- (2) Closeness centrality: *"An important node is usually near in terms of jumps to other nodes in the network."*

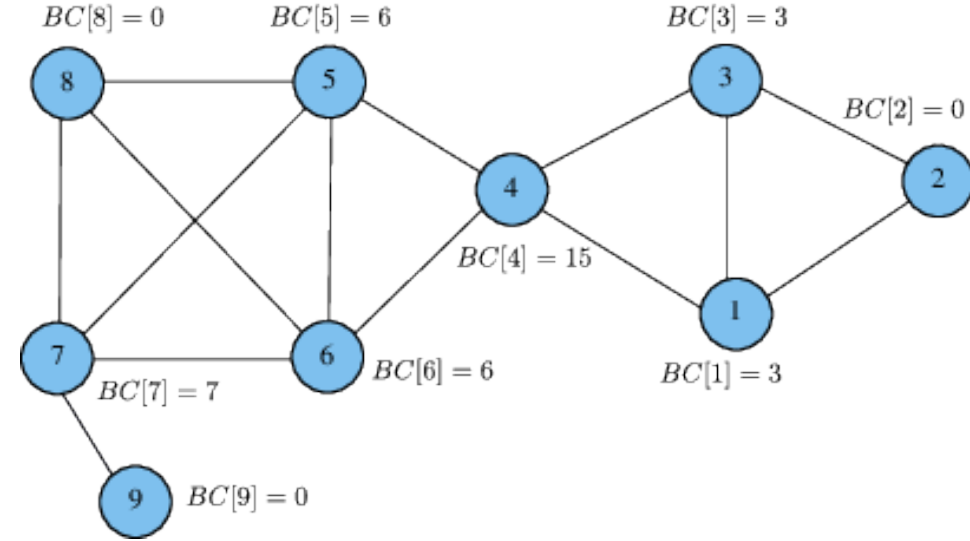
$$C(u) = \frac{n - 1}{\sum_{u,v \in V} d(v, u)},$$

where $d(v, u)$ is the shortest-path distance between v and u , and n is the number of nodes in the graph.

- (3) Betweenness centrality: *"An important node will be in the path of a high proportion of paths between any nodes in the network."* Betweenness centrality of node v is the sum of the fraction of all-pairs shortest paths that pass through v :

$$c_B(v) = \sum_{s,t \in V} \frac{\sigma(s, t|v)}{\sigma(s, t)}$$

where $\sigma(s, t)$ is the number of shortest (s, t) -paths, and $\sigma(s, t|v)$ is the number of those paths passing through some node v other than s, t . If $s = t$, $\sigma(s, t) = 1$, and if $v \in s, t$, $\sigma(s, t|v) = 0$



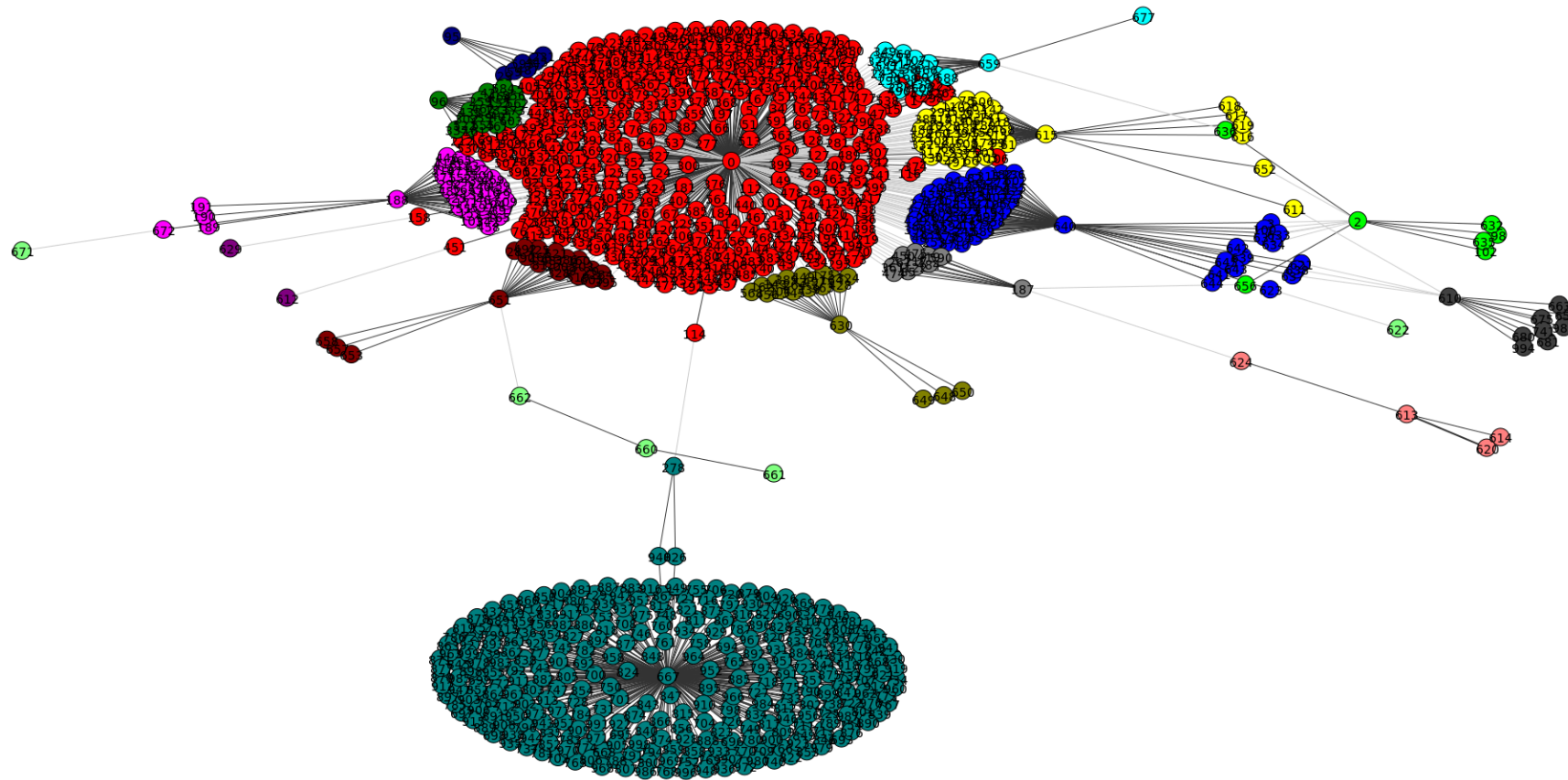
Address	C_{deg}	C_{clo}	C_{bet}	C_{PR}
'0x32be34...102d88'	rank 1	rank 7	rank 6	rank 3
'0x9e6316...baf227'	rank 2	rank 3	rank 1	rank 2
'0xaa1a6e...116444'	rank 3	rank 1	rank 4	rank 1
'0x120a27...99c4ad'	rank 6	rank 6	rank 8	rank 9
'0x1c39ba...2dc750'	rank 7	rank 2	rank 3	rank 4
'0xbfc39b...915bdd'	rank 10	rank 4	rank 2	rank 5

Address	Comments	Additional Information
0x32be343b94f860124dc4fee278fdcbd38c102d88	Poloniex Hot Wallet	Poloniex is a pure crypto to crypto exchange based in the United States and the largest trader of Ether.
0x9e6316f44baeeee5d41a1070516cc5fa47baf227	shapeshift.io,	platform that allows users to exchange digital currencies without any registration.
0xaa1a6e3e6ef20068f7f8d8c835d2d22fd5116444	ReplaySafeSpolit	transition to the hard fork. Currency divided between ETH (chain followed by the Foundation) and the ETC (the community effort to continue the no-fork chain). It is the 4th in terms of number of transactions with a total of 184743 edges.
0x120a270bbc009644e35f0bb6ab13f95b8199c4ad:	shapeshift.io,	shapeshift exchange as an intermediate address for trading Bitcoins with Ether.
0xbfc39b6f805a9e40e77291aff27aee3c96915bdd	Poloniex	sync any accounts that would have lost ETH during the hard fork.
0xbb9bc244d798123fde783fcc1c72d3bb8c189413	The DAO	Initially raising a huge capital and victim of an attack leading to the hard fork in the Ethereum Blockchain.
0x18a672E11D637fffADccc99B152F4895Da06960	Rouleth	Classical casino roulette.

Finding Communities on the Ethereum ledger

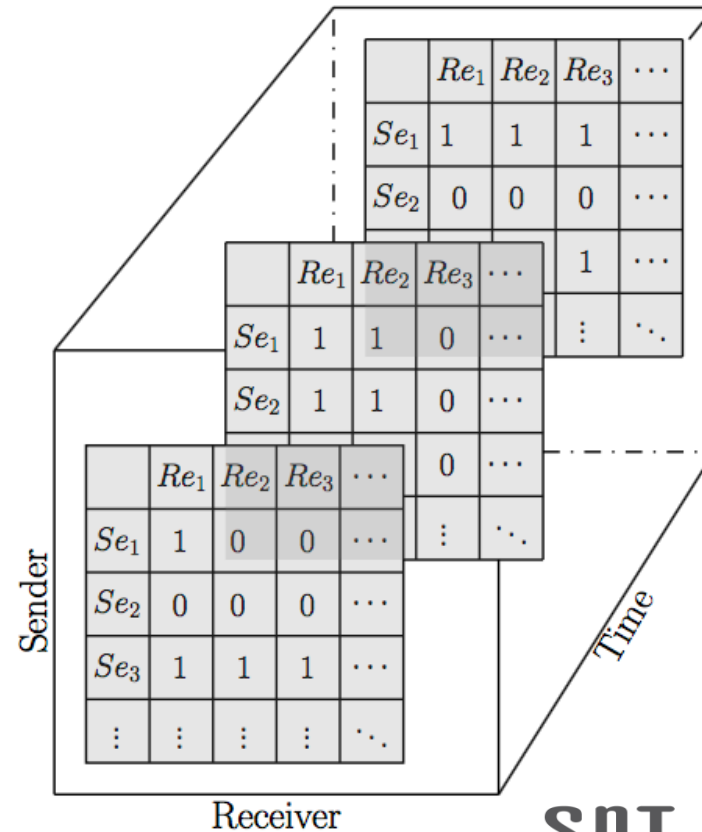
Communities are groups of nodes that are heavily connected among themselves.

Sparsely connected
to the rest of the
network.



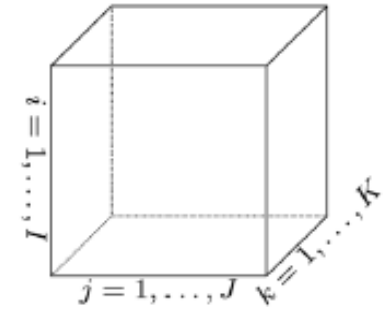
Putting Algebra to work: tensor modeling

- Representing Smart Contracts as Tensors
- Use Tensor decomposition to identify structure
- Predict interactions among contracts

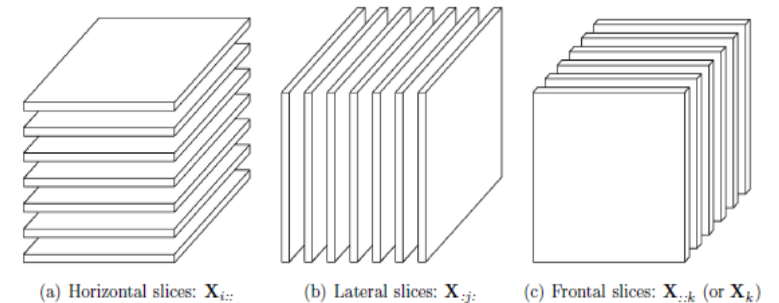


Presentation of the tensors

- A tensor is a multidimensional array
 - Can be a three dimensional cube
 - Or even a “cube” in higher dimension such as 5, 6, 7, ...
- Extension of multi-dimensional array using linear algebra
- Different theorems and mathematical operations are defined for tensor manipulation
 - Sum and multiplication between same size tensor can be achieved
 - Matricization: transformation of a tensor in a matrix (2 dimensions table)
 - Multiplication between matrix and tensors
- Allows the modeling of interactions between different inputs without any size limitation
- Ability to perform linear algebra on large scale data to discover latent variables



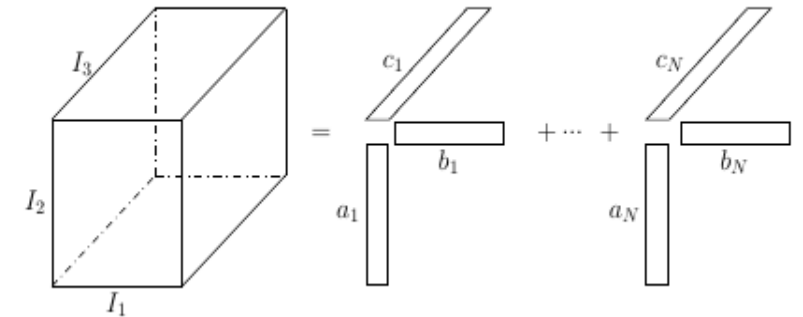
$\mathcal{X} \in \mathbb{R}^{I \times J \times K}$ is a three-way tensor



Possible slices of a three-way tensor

CANDECOMP/PARAFAC (CP) Decomposition

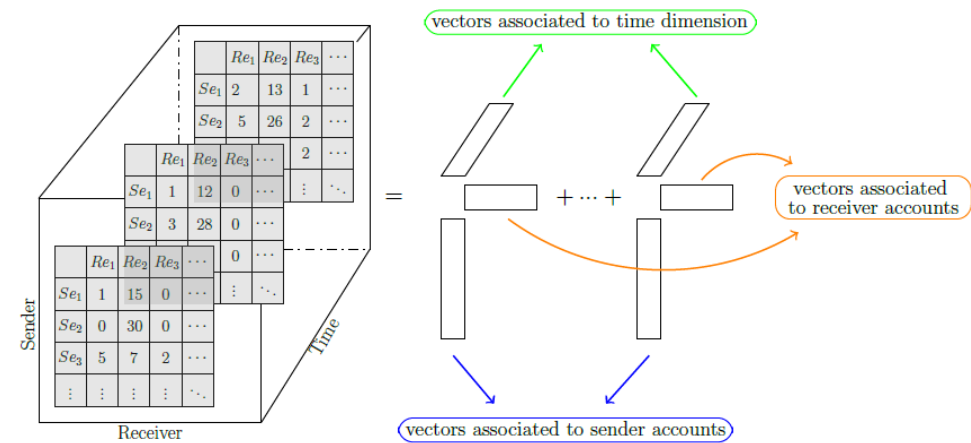
- Introduced in 1970 by Harshman and Carroll and Chang
- Factorization of the initial tensor as a sum of component of rank-one tensors
 - A rank of a three-way tensor is defined as the outer product of three different vectors
- Resolution using Alternating Least Squares method
 - No too complex to implement
 - Good compromise between speed and results accuracy
- Each rank-one tensor is associated to a community within the data set
- Each dimension of the rank-one tensors can be treated separately
 - Visualization tool
 - Series simulation
- One tensor dimension is very often related to time dimension to observe evolution over time



Three-way tensor decomposed in R components
Using CP decomposition

Smart Contracts Activities Modeling

- Data set extracted from Ethereum,
- Identification code for sender and receiver smart contracts
 - Amount of Ether exchanged
 - Blockheight converted to time periods
- Objective: estimate a probability of Ether exchange between two specified smart contracts for different time horizon
- Factorization of the initial tensor as a sum of component of rank-one tensors using CP decomposition
- Resolution using Alternating Least Squares method
 - No too complex to implement
 - Good compromise between speed and results accuracy
 - Scalability for higher tensor dimensions
- Each rank-one tensor is associated to a community within the data set
- Each rank-one tensor is used as input of a log-normal-mean-reverting stochastic process for activities modeling and probabilities estimation

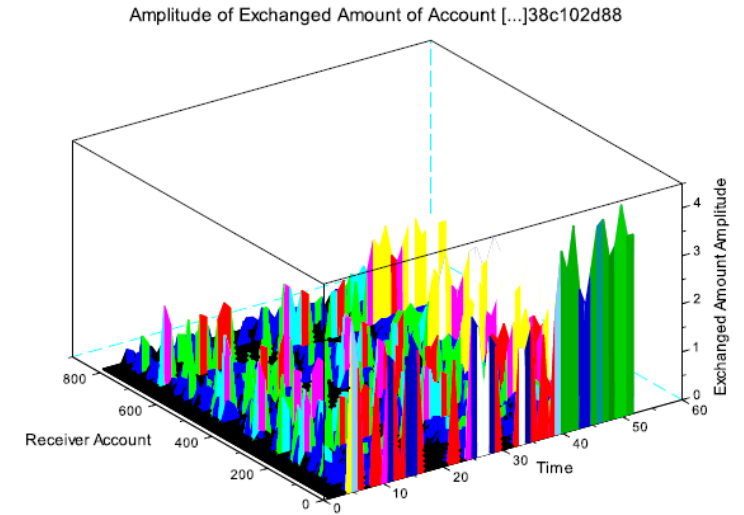


Description of the dimensions related to tensor decomposition.
The results of the tensor decomposition are the inputs of the stochastic model.

$$\begin{cases} dS_t = S_t(\mu_t dt + \sigma^{(S)} dW_t^{(1)}) \\ d\mu_t = \lambda(\kappa - \mu_t)dt + \sigma^{(\mu)} dW_t^{(2)} \\ \rho dt = d\langle W^{(1)}, W^{(2)} \rangle_t \end{cases}$$

Results of Smart Contracts Activities Prediction

- Objective: estimate a probability of Ether exchange between two smart contracts for a time horizon
 - Better understanding of the activities between the smart contracts
 - Ability to estimate probability of future exchanges which could be used for smart contracts pricing or for investment strategy
- Three different time horizon have been defined for the experiments
 - 5 time steps
 - 10 time steps
 - 26 time steps
- For the stochastic simulation, random selection on 1% most active contracts
- Process for probabilities calculation
 - Parameters calibration
 - Historical calibration of the log-normal parameters
 - Historical calibration of the mean reverting process using Eonia rates due to short time horizon of the simulation
 - EWMA historical correlation
 - 1,000,000 Monte-Carlo simulation
 - Estimation of the probabilities using a digital function
 - S_T is the simulated process
 - K is the amplitude of the Ether exchange
- Results discussion
 - Digital value (exchange probability) offers appropriate guidance for future Ether exchanges even for longer time step horizons
- Outcomes
 - Accurate probabilities prediction of Ether exchange for smart contracts
 - Open the possibility to consider smart contract for investment strategy
 - Innovative approach using tensor decomposition and stochastic processes

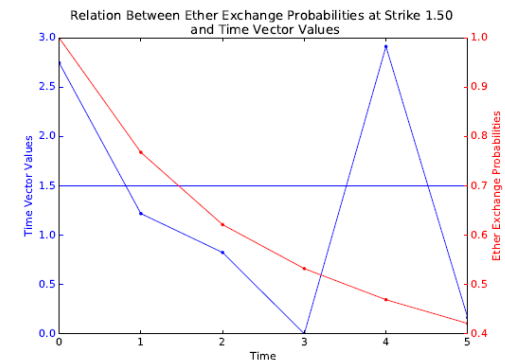


Amplitude of Exchange amount for one sender to all receivers among time

Time Step	Series Value	≥ 1.0	Digital Value
0	1.9732	-	-
10	1.0114	1	0.7781

Time Step	Series Value	≥ 1.25	Digital Value
0	0.1987	-	-
26	1.0114	0	0.0045

Digital value in relation with the series evolution and Ether amplitude exchange level K

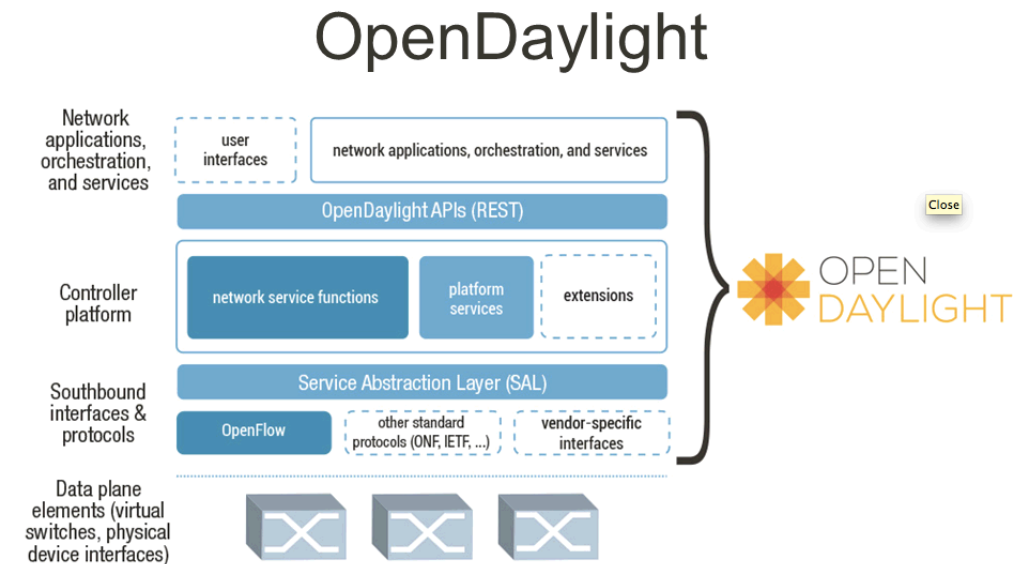


Relation between time payment magnitude and Ether exchange probability

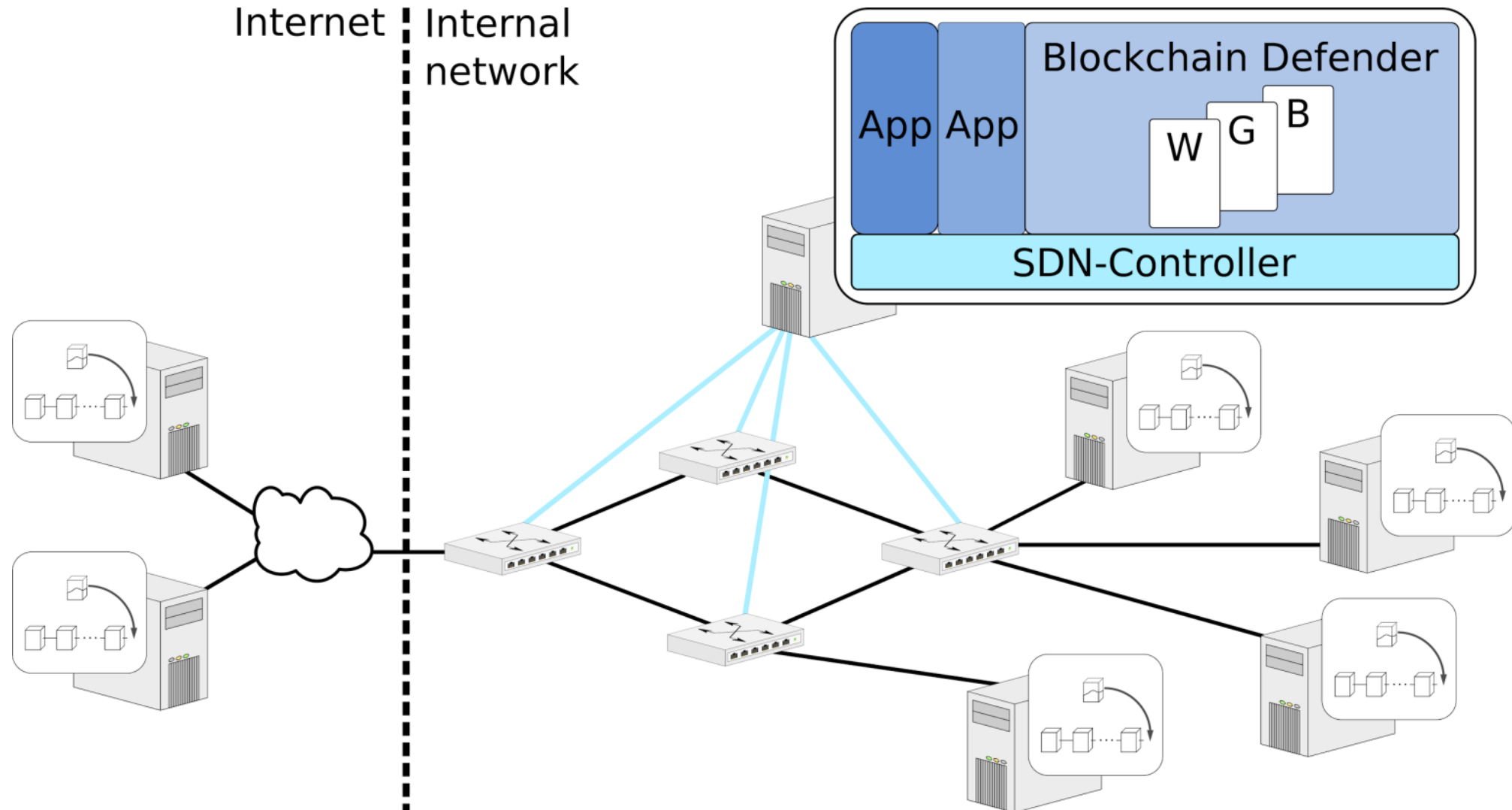
Protecting Smart Contracts – Blockchain Defender



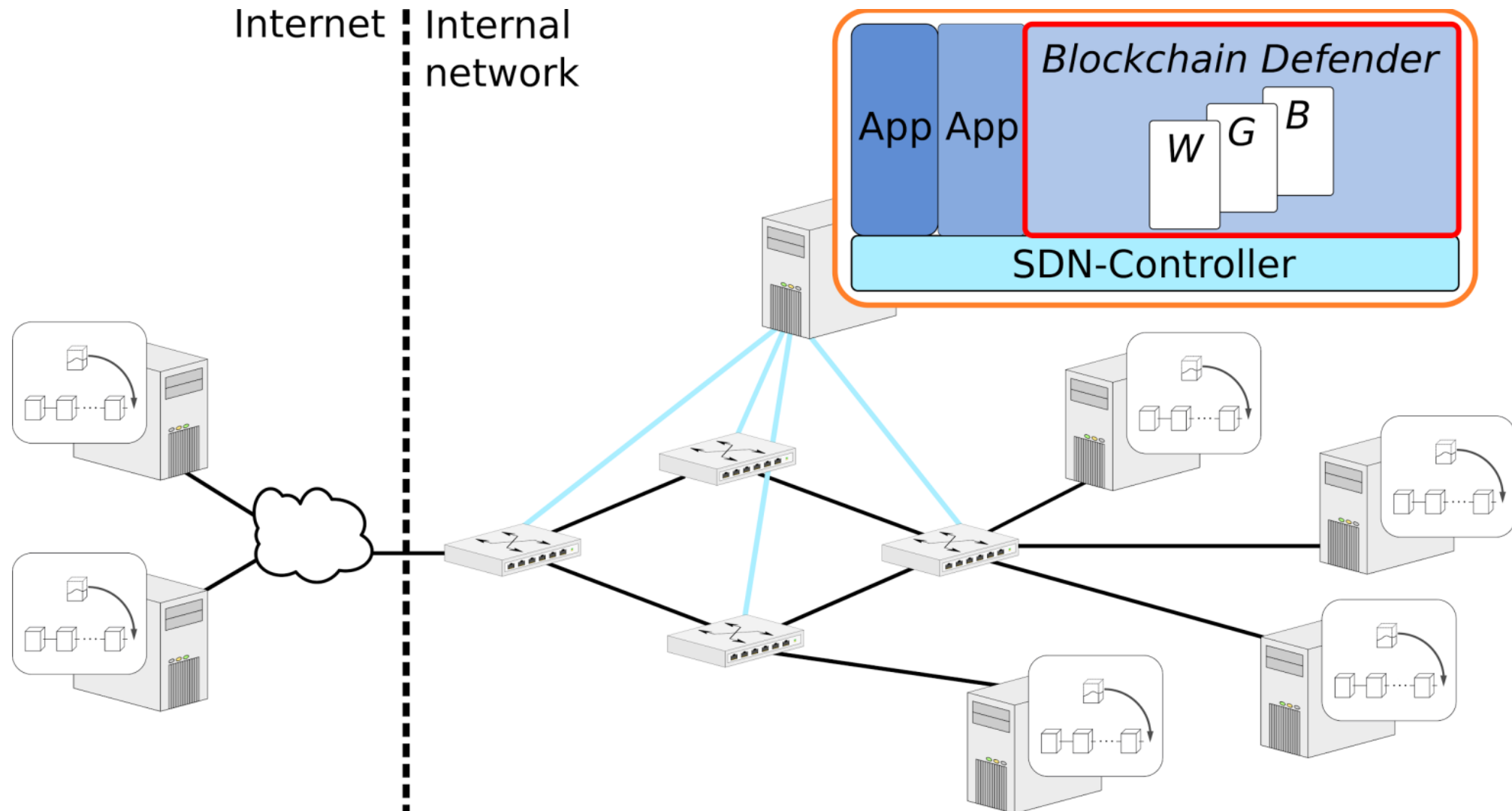
- Protect the network and service platform
- Flexible Software Defined Network component for the InfraChain project
- OpenSource Code development
- Support for multiple permissioned blockchains
 - Multichain, Hyperledger
- No modification of blockchain nodes and no censoring
 - Use blockchain nodes as they are



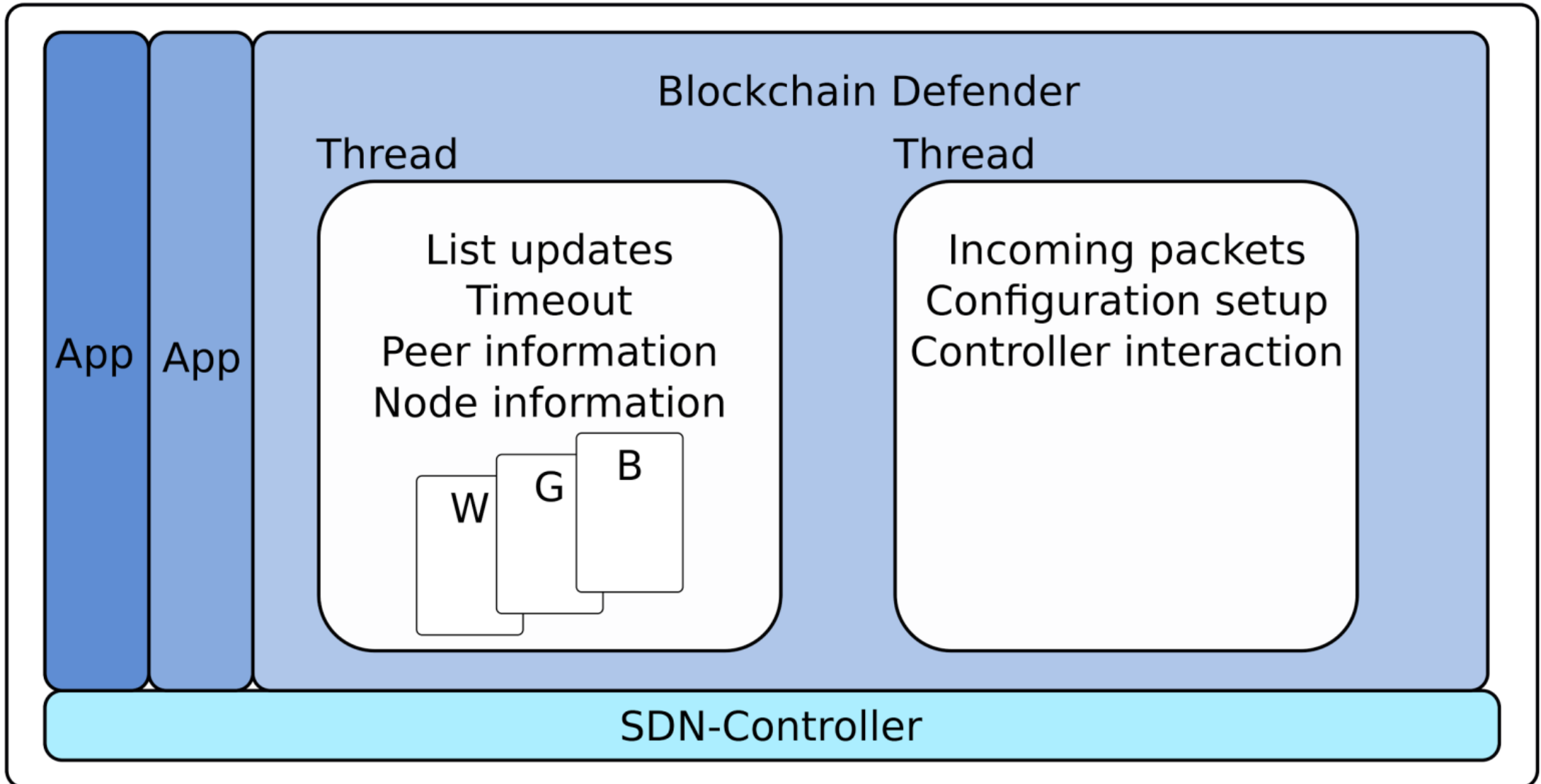
SDN network and components



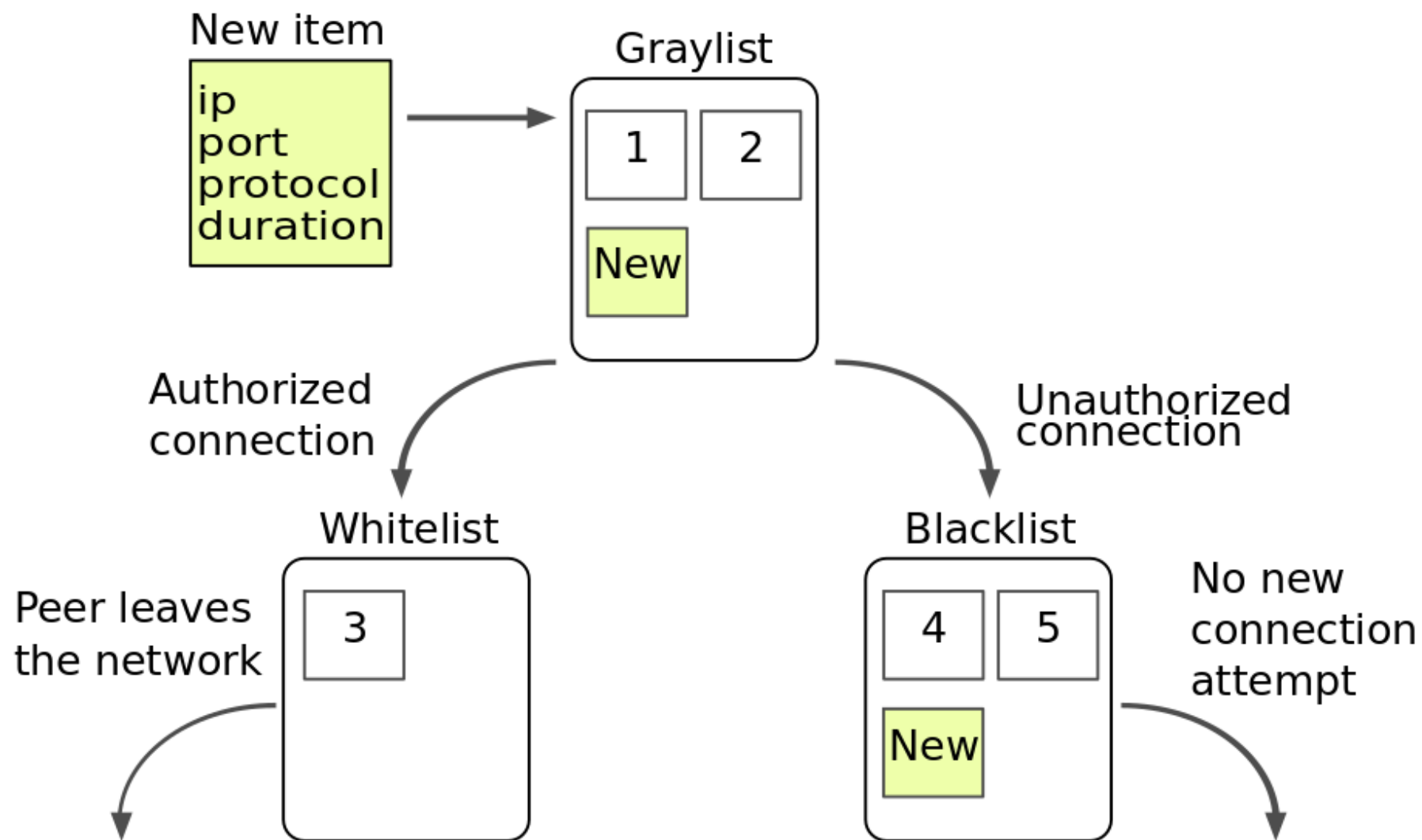
Controller components



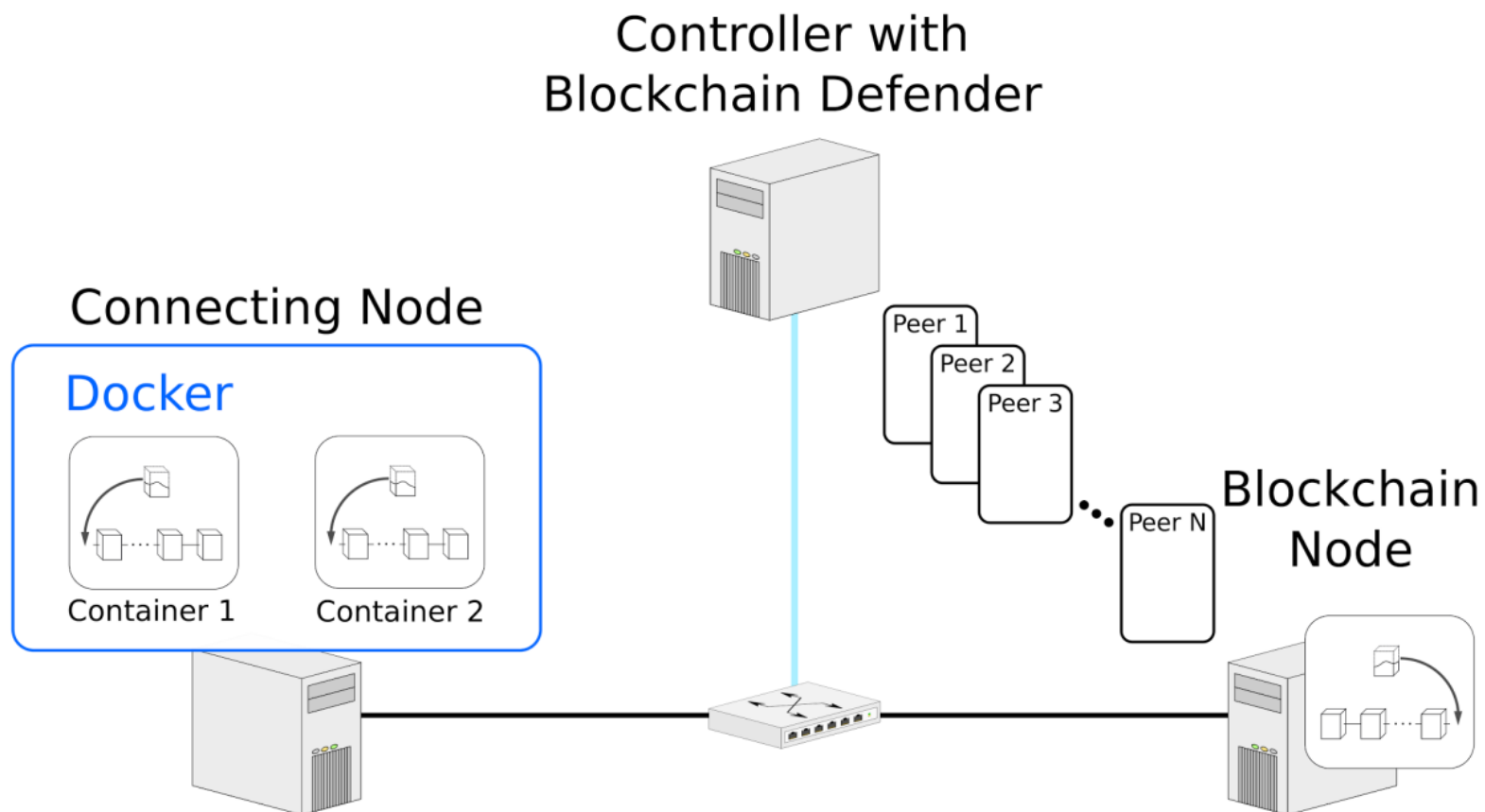
Controller components



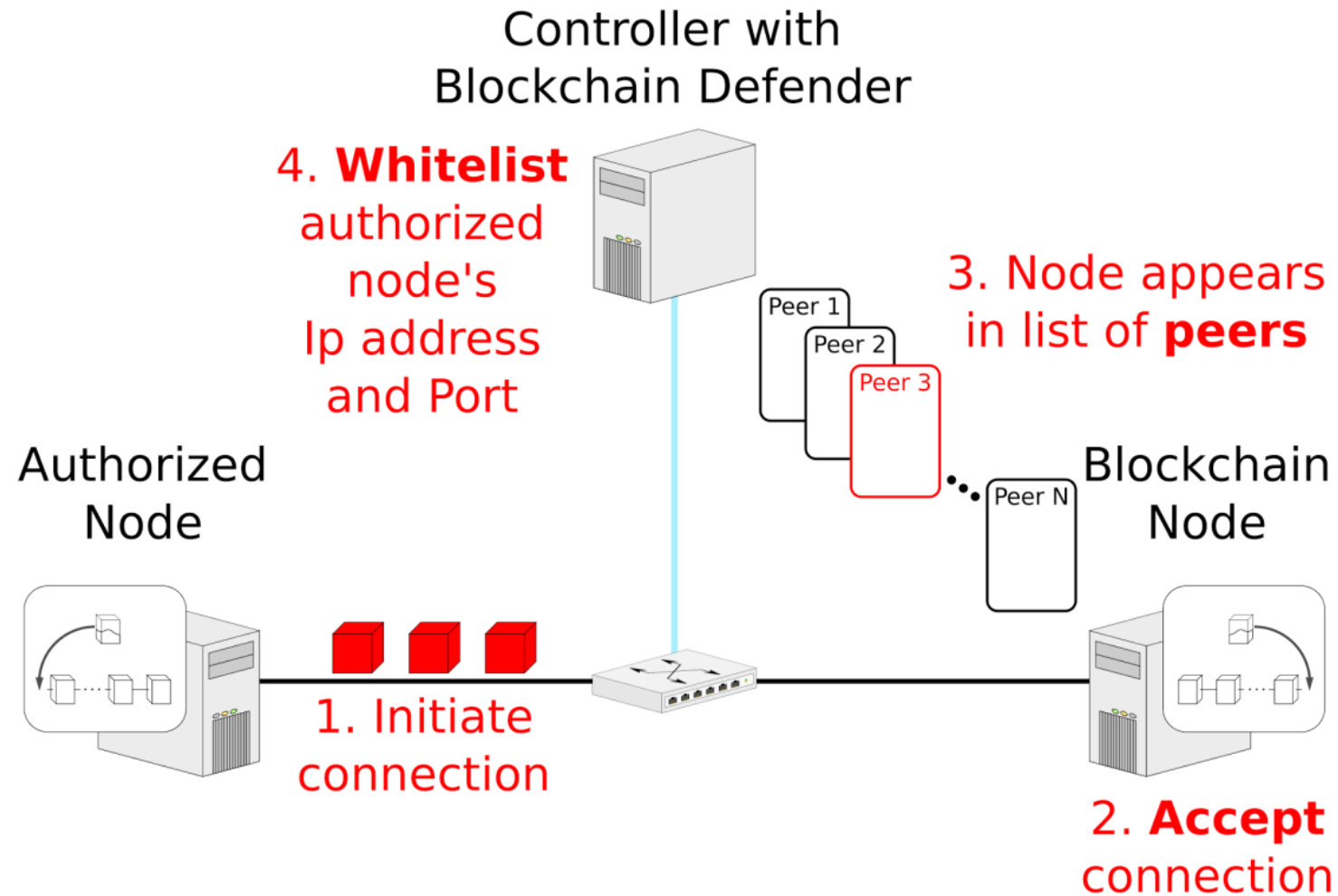
Lists



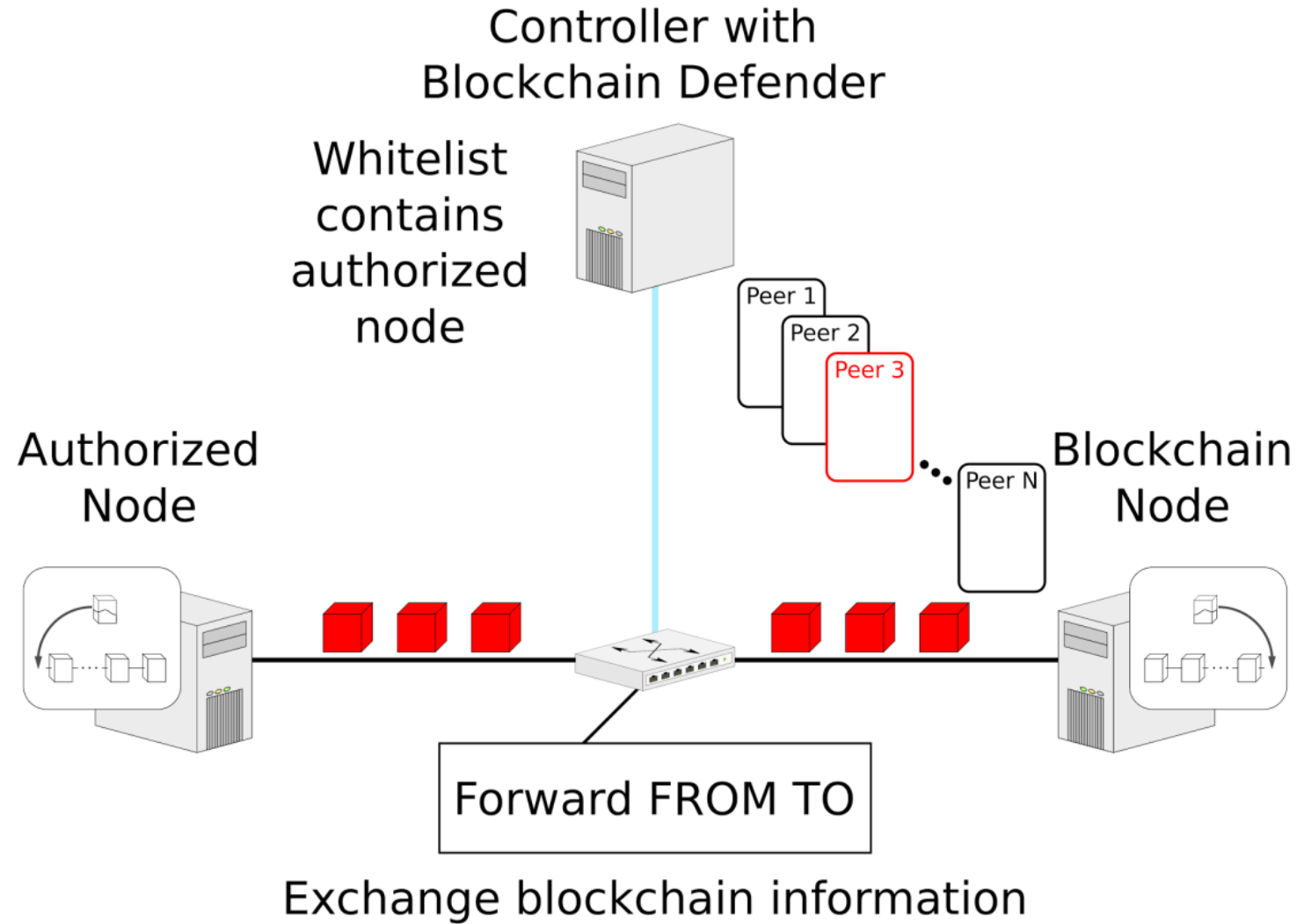
Demo - System Setup



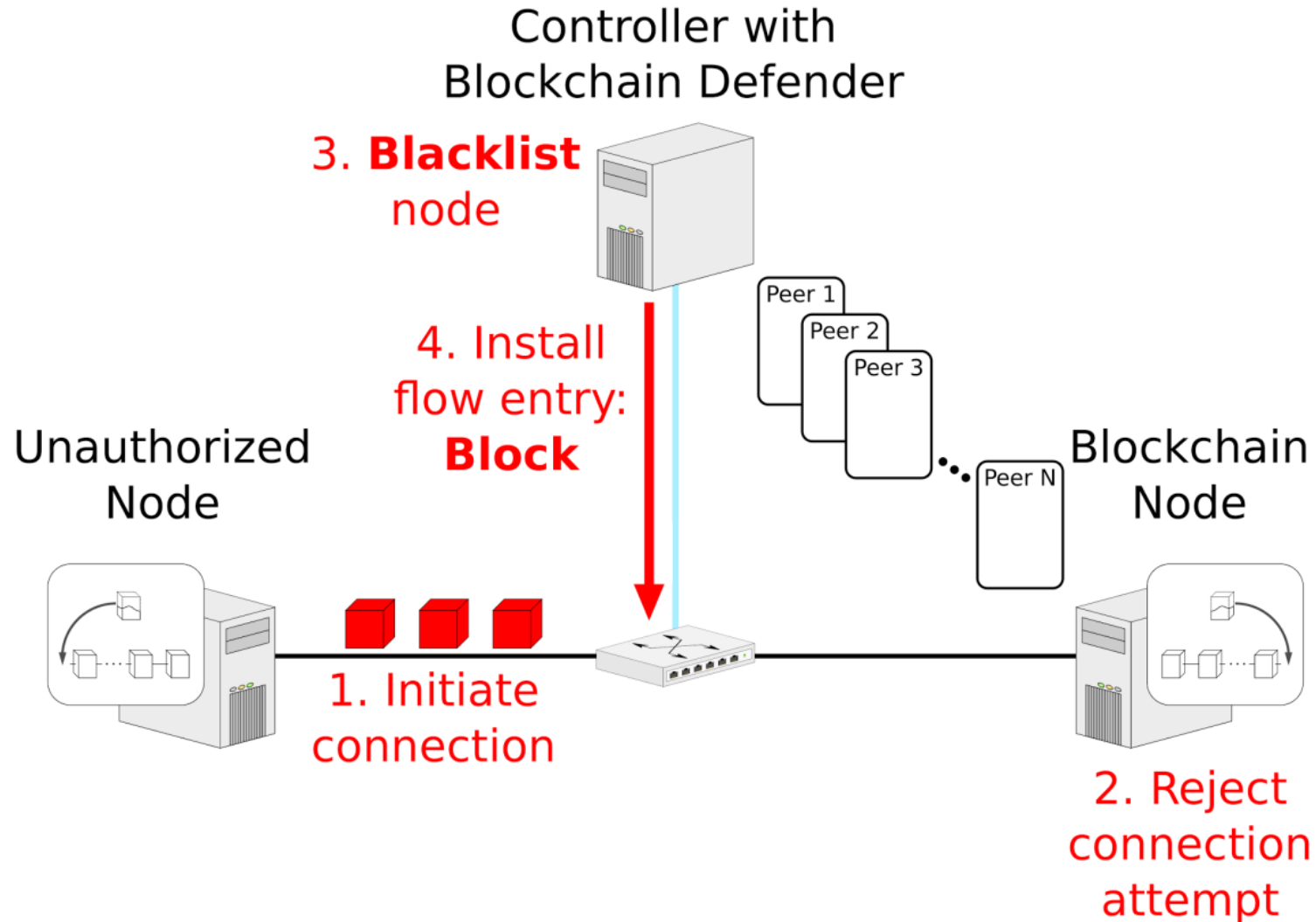
Demo - Authorized User



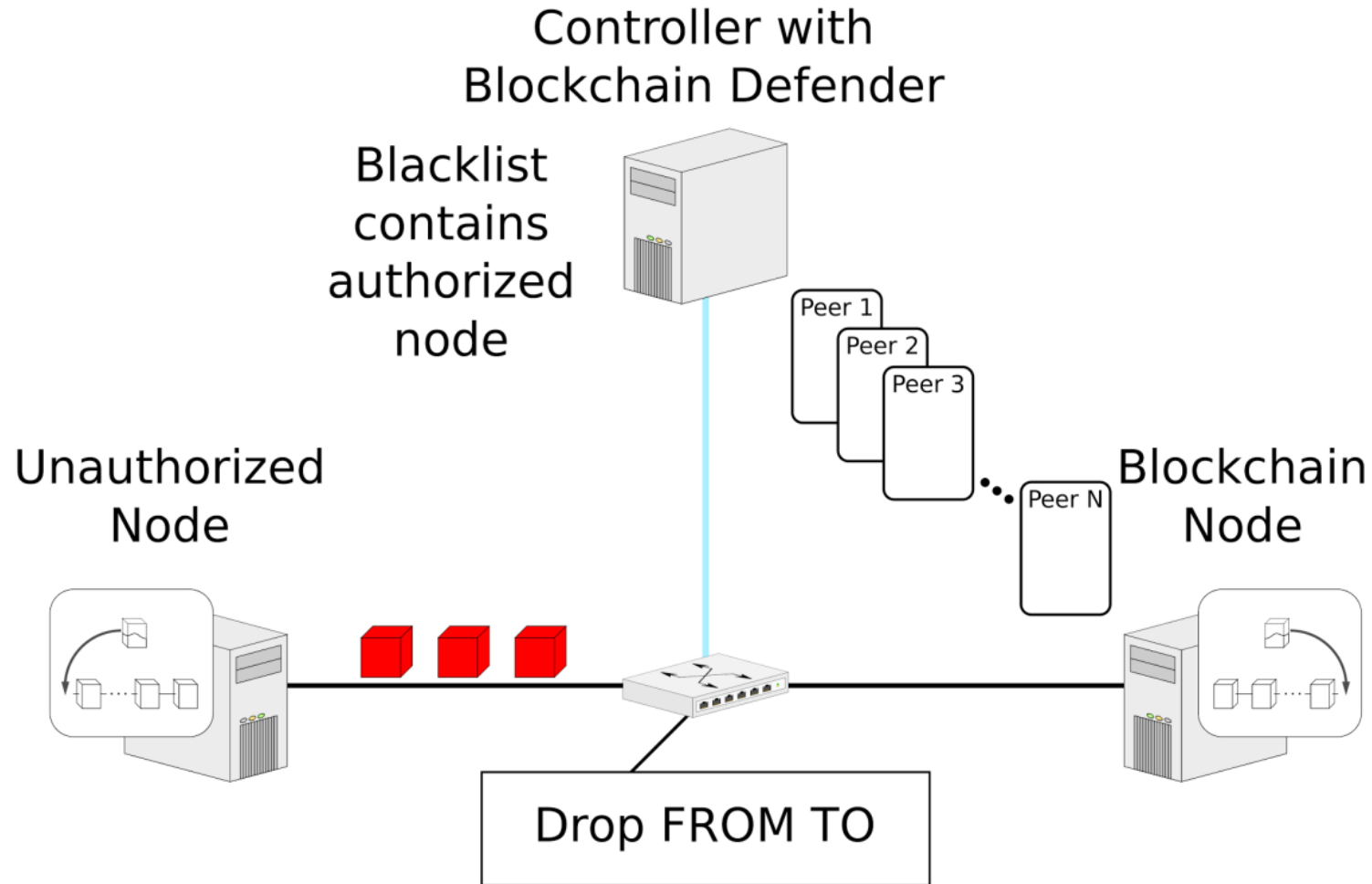
Demo - Authorized User



Demo - Unauthorized User



Demo - Unauthorized User



Additional Readings

Automated labeling of unknown contracts in Ethereum.

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Abstract—Smart contracts have recently gained interests from diverse fields including law and finance. Ethereum in particular has grown rapidly to accommodate an entire ecosystem of contracts which run using its own crypto-currency.

Smart contract developers can opt to verify their contracts so that any user can inspect and audit the code before executing the contract. However, the huge numbers of deployed smart contracts and the lack of supporting tools for the analysis of smart contracts makes it very challenging to get insights into this eco-environment, where code gets executed through transactions performing value transfer of a crypto-currency. We address this problem and report on the use of unsupervised clustering techniques and a seed set of verified contracts, in this work we propose a framework to group together similar contracts within the Ethereum network using only the con-

Users use accounts to execute code in a smart contract by sending messages (i.e. transactions), which include account address and, as the destination address, the contract identifier. If the destination address is not specified, the transaction will result in a new contract being created instead. Unlike accounts, which are managed by users, smart contracts cannot initiate transactions themselves unless executed by a respective command in the code. In this way, smart contracts are reactive to transactions sent by the users (i.e. accounts).

The Ethereum blockchain stores the current state of the Ethereum state machine, and the transactions accepted to the next block are what moves the state machine to the next state. An example of this state transition can be seen in Fig.

Graph Analysis of the Ethereum Transaction Network

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Predicting Smart Contracts Activities With Tensor Decomposition

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Abstract. Smart contracts are autonomous software executing predefined conditions allowing secured protocols and transaction costs reduction. On Ethereum platform, an open-source blockchain-based platform, the payment transactions among the inter-connected nodes is realized with smart contracts. We provide in this paper an approach to analyze and predict smart contracts activities. Herein, we propose an innovative application of the tensor decomposition CANDECOMP/PARAFAC to the temporal link prediction of smart contracts. Stochastic processes for series predictions based on the tensor decomposition could lead to smart contracts selection for speculative investment.

Keywords: Tensors; CP Decomposition; Stochastic Process

1 Introduction

First, historical backgrounds of smart contracts and tensor decomposition are described. In section 2, the model used for the simulation of the smart contract activities is presented. Lastly, the results of the experiments are presented before discussing the outcomes of the papers.

Blockchain Defender - Protecting Blockchain Nodes against DoS Attacks using SDN

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is only updated after the receipt of a message, a flow rule that contains wildcarded with a long expiration time leads to a

additional flow entries for monitoring in [8]. This scheme is possible because the controller supports multiple stages of flow controller can read the respective counters to detect heavy hitters¹ through a hierarchical approach. The strength of this approach lies in its hardware and its low switch overhead. DoS attacks based on the analysis of network flows is considered in [9]. The controller is implemented on the NOX controller platform following steps. Firstly, the flow statistics are extracted at certain time intervals. In a second step, the feature extractor identifies the relevant traffic features that are used for classification. For instance, the growth rate of single flows is an indicator of the beginning of such supervised learning that leverages Self-Organizing Maps (SOM), the network traffic is classified as normal or anomalous (e.g. attack). Thus, monitoring approaches are not con-

of smart contracts are manifold aspects are still under investigation. Smart contracts have a regulatory requirement in money laundering (AML). One of the main challenges is the activity of smart contracts, or transaction. The detection of smart contracts is a set of related real-world entities within the Ethereum network, which is particularly difficult. We aim to shed some light into the smart contract network by firstly analysing the network topology for detecting key accounts. The Ethereum transaction network and its properties such as the power laws

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