



Towards Searchable and Verifiable Blockchain

Cheng Xu Ce Zhang April 8, 2019

Department of Computer Science Hong Kong Baptist University • Blockchain \neq Bitcoin

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- Blockchain is a distributed ledger maintained by a community of (untrusted) users
 - Decentralization
- Immutability

• Consensus

• Provenance



Fig. 1: Blockchain Structure [Credit: Wikipedia]

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- Provenance
- \cdot A wide range of applications
 - Record Keeping
 - Smart Contracts
 - • •



Fig. 2: Blockchain Applications [Credit: FAHM Technology Partners]

Blockchain Database Solutions

- Increasing demand to search the data stored in blockchains
- Blockchain database solutions to support SQL-like queries



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• Issue: relying on a trusted party who can faithfully execute user queries

Blockchain Search Problem

- Integrity assurance: query results retrieved from the blockchain should be publicly verifiable
 - Becoming full node
 - High cost
 - Storage: to store a complete replicate (240 GB for Bitcoin as of Mar 2019)
 - Computation: to verify the consensus proofs
 - Network: to synchronize with the network

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• Question: how to ensure integrity?

- A trusted program to execute user-defined computation upon the blockchain
 - · Smart Contract reads and writes blockchain data
 - Execution integrity is ensured by the consensus protocol
- Offer trusted storage and computation capabilities
- Function as a trusted virtual machine

	Traditional Computer	Blockchain VM
Storage	RAM	Blockchain
Computation	CPU	Smart Contract

Solution #1: Smart Contract

- Leverage Smart Contract for trusted computation
 - Users submit query parameters to blockchain
 - · Miners execute computation and write results into blockchain
 - Users read results from blockchain



[Credit: Oscar W]

S. Hu, C. Cai, Q. Wang, C. Wang, X. Luo, and K. Ren, "Searching an encrypted cloud meets blockchain: A decentralized, reliable and fair realization," in *IEEE INFOCOM*, Honolulu, HI, USA, 2018, pp. 792–800.

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- Drawbacks



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- Long latency: long time for consensus protocol to confirm a block
- Poor scalability: transaction rate of the blockchain is limited
- Privacy concern: query history is permanently and publicly stored in blockchain
- High cost: executing smart contract in ETH requires paying gas to miners (INFOCOM 2018 requires 4 201232 gas = 0.18 Ether = 24 USD per query)

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 - Service provider returns results with cryptographic proof
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- Outsource queries to full node and verify the results using VC
 - General VC: Expressive but high overhead
 - Authenticated Data Structure (ADS)-based VC: Efficient but requiring customized designs

- vChain: Enabling Verifiable Boolean Range Queries over Blockchain Databases (SIGMOD 2019)
- GEM²-Tree: Enabling Gas-Efficient Authenticated Range Queries for Hybrid Storage in Blockchain (ICDE 2019)

vChain: Enabling Verifiable Boolean Range Queries over Blockchain Databases

Cheng Xu, Ce Zhang, and Jianliang Xu

ACM SIGMOD 2019

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Security requirements

- Soundness: none of the objects returned as results have been tampered with and all of them satisfy the query conditions
- Completeness: no valid result is missing regarding the query window or subscription period



- Miner: constructs each block with additional ADS to achieve VC scheme
- Service Provider: is a full node and computes the results with the verification object (VO)
- Query User: is a light node; uses the VO and block header to verify the results



Fig. 4: System Model of vChain

\cdot Data Model

- Each block contains several temporal objects $\{o_1, o_2, \ldots, o_n\}$
- o_i is represented by (t_i, V_i, W_i) (timestamp, multi-dimensional vector, set valued attribute)

Boolean Range Queries

• Time-window queries:

 $q = \langle [2018-05, 2018-06], [10, +\infty], \text{``send:1FFYc''} \land \text{``receive:2DAAf''} \rangle$

• Subscription queries:

 $q = \langle -, [200, 250], \text{``Sedan''} \land (\text{``Benz''} \lor \text{``BMW''}) \rangle$

Cryptographic Building Block

- Merkle Hash Tree [Mer89]
 - Support efficient membership/range queries
 - Limitations
 - An MHT supports only the query keys on which the Merkle tree is built
 - MHTs do not work with set-valued attributes
 - MHTs of different blocks cannot be aggregated



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- Cryptographic Multiset Accumulator [PTT11]
 - · Map a multiset to an element in cyclic multiplicative group in a collision resistant fashion
 - Utility: prove set disjoint
 - Protcols:
 - KeyGen $(1^{\lambda}) \rightarrow (sk, pk)$: generate keys
 - Setup(X, pk) \rightarrow acc(X): return the accumulative value w.r.t. X
 - ProveDisjoint $(X_1, X_2, pk) \rightarrow \pi$: on input two multisets X_1 and X_2 , where $X_1 \cap X_2 = \emptyset$, output a proof π
 - VerifyDisjoint(acc(X_1), acc(X_2), π , pk) \rightarrow {0, 1}: on input the accumulative values acc(X_1), acc(X_2), and a proof π , output 1 iff $X_1 \cap X_2 = \emptyset$



Fig. 5: Merkle Hash Tree

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 - Extend the block header with AttDigest
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 - Constant size regardless of number of elements in W_i
 - Support ProveDisjoint(·) & VerifyDisjoint(·)



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Example of Mismatch

- Transform query condition to a list of sets: $q = \text{"Sedan"} \land (\text{"Benz"} \lor \text{"BMW"}) \rightarrow \{\text{"Sedan"}\}, \{\text{"Benz"}, \text{"BMW"}\}$
- Consider $o_i : \{\text{"Van"}, \text{"Benz"}\}$, we have $\{\text{"Sedan"}\} \cap \{\text{"Van"}, \text{"Benz"}\} = \emptyset$
- Apply ProveDisjoint({"Van", "Benz"}, {"Sedan"}, pk) to compute proof π
- User retrieves AttDigest = $acc(\{"Van", "Benz"\})$ from the block header and uses VerifyDisjoint(AttDigest, $acc(\{"Sedan"\}), \pi, pk)$ to verify the mismatch



Fig. 6: Extended Block Structure

- Support time-window queries
 - Find the blocks whose timestamp is within the query window
 - · Invoke previous algorithm for each object in theses blocks

Example

- q = "Sedan" \land ("Benz" \lor "BMW")
- Objects within the time window o_1 : {"Van", "Benz"}, o_2 : {"Sedan", "Audi"}, o_3 : {"Van", "Benz"}
- Query processing
 - o1 is returned as a result
 - ProveDisjoint(•) is applied for o_2 and o_3
 - Mismatch condition "Benz" ∨ "BMW" for o₂
 - + Mismatch condition "Sedan" for o_3

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- Range can be transformed into a equivalent boolean expression using a binary tree
 - Example: $[0, 6] \rightarrow 0* \lor 10* \lor 110$ Equivalence set: $\{0*, 10*, 110\}$



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Fig. 7: Example of Transformation

- Range queries can be processed in a similar manner as Boolean queries
 - Transform $v_i \in [\alpha, \beta] \rightarrow \text{trans}(v_i) \cap \text{EquiSet}([\alpha, \beta]) \neq \emptyset$
 - Example:
 - · 4 ∈ [0, 6] → {1*, 10*, 100} ∩ {0*, 10*, 110} = {10*} ≠ Ø
 - · 7 ∉ [0,6] → {1*,11*,111} ∩ {0*,10*,110} = Ø

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 - Inter-Block Index: aggregate objects across blocks using skip list



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 - Inter-Block Index: aggregate objects across blocks using skip list
 - · Inverted Prefix Tree: aggregate similar subscription queries from users



Performance Evaluation

- Evaluation metrics
 - Query processing cost in terms of SP CPU time
 - Query verification cost in terms of user CPU time
 - Size of the VO transmitted from the SP to the user
- Numerical range selectivity
 - 10% for 4SQ & WX
 - 50% for ETH
- Disjunctive Boolean function size
 - 3 for 4SQ & WX
 - 9 for ETH



Fig. 11: Time-Window Query Performance

GEM²-Tree: Enabling Gas-Efficient Authenticated Range Queries for Hybrid Storage in Blockchain

Ce Zhang, Cheng Xu, Jianliang Xu, Yuzhe Tang, and Byron Choi

IEEE ICDE 2019

- More details
 - Section: Research (14) Query Processing, Indexing and Optimization
 - Time: 14:35–16:05, April 10, Wednesday
 - Location: 7004



GEM²-Tree

• Storing data on chain is not scalable



Fig. 12: Authenticated Query Framework in Hybrid-Storage Blockchain

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GEM²-Tree

- Storing data on chain is not scalable
- Hybrid storage:
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 - A hash of the data is keep on chain to ensure integrity
 - Smart contract maintains on-chain index to facilitate authenticated query processing
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- Question: How to reduce transaction fee a.k.a gas?
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Thanks Questions?

References

- [HCW+18]
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