

# vChain: Enabling Verifiable Boolean Range Queries over Blockchain Databases

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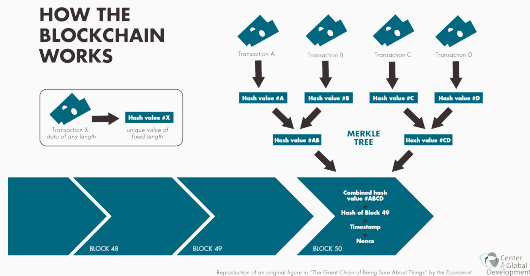
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July 2, 2019 @ SIGMOD '19

Department of Computer Science  
Hong Kong Baptist University

# Background

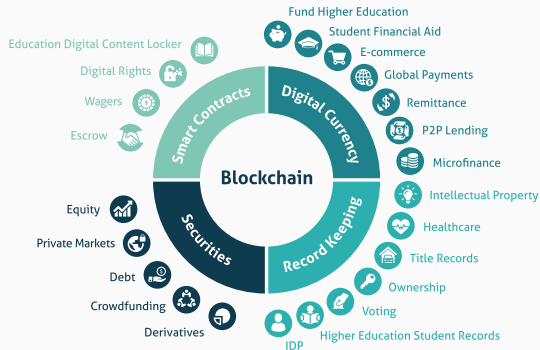
- Blockchain: Append-only data structure collectively maintained by a network of (untrusted) nodes
  - Hash chain
  - Immutability
  - Consensus
  - Decentralization



*Blockchain Structure [Credit: Wikipedia]*

# Background

- **Blockchain: Append-only data structure** collectively maintained by a network of (untrusted) nodes
  - Hash chain
  - Consensus
  - Immutability
  - Decentralization
- A wide range of applications
  - Digital identities
  - Decentralized notary
  - Distributed storage
  - Smart Contracts
  - ...



*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

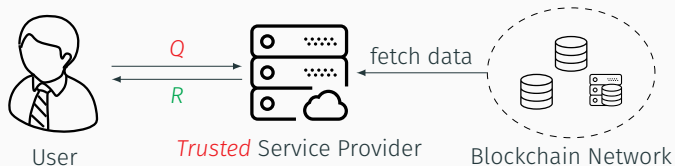


SwarmDB

*Blockchain Database Solutions*

# Blockchain Database Solutions

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*Workflow of Existing Solutions*

- **Issue:** relying on a trusted party who can faithfully answer user queries

# Secure Blockchain Search

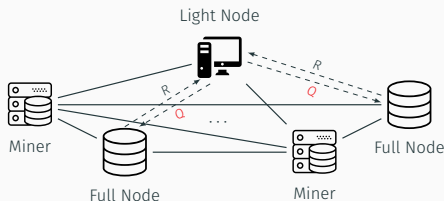
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- **Basic solution** to integrity-assured blockchain search
  - Becoming **full node**
  - High cost
    - **Storage**: to store a complete replicate (240 GB for Bitcoin as of June 2019)
    - **Computation**: to verify the consensus proofs
    - **Network**: to synchronize with the network

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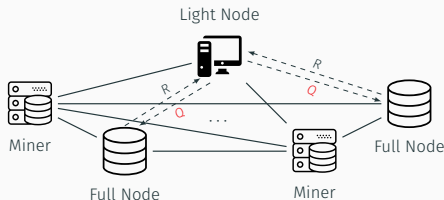
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  - Low cost: maintaining block headers only (< 50 MB for Bitcoin)





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- **Challenge**: how to maintain query integrity?

# Solution #1: Smart Contract

- 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]

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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**
  - **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 4 201 232 gas = 0.18 Ether = 24 USD per query*)

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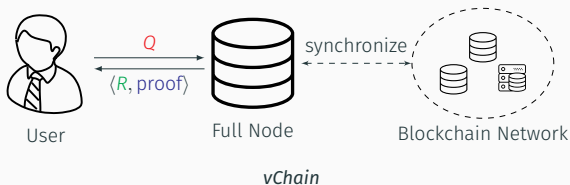
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## Solution #2: Verifiable Computation

- Verifiable Computation (VC)
  - Computation is outsourced to untrusted service provider
  - Service provider returns results with cryptographic proof
  - Users verify integrity of results using the proof

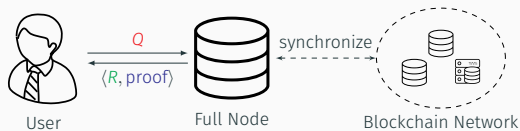
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- **Outsource** queries to full node and **verify** the results using VC
  - General VC: **Expressive** but high overhead
  - Authenticated Data Structure (ADS)-based VC: **Efficient** but requiring customized designs



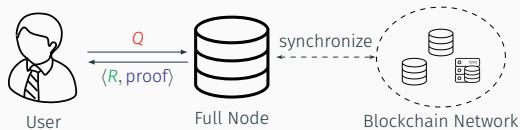
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- **Problem:** Integrity-assured Search over Blockchain Data



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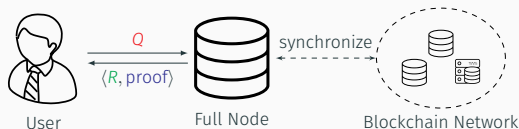
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- **System Model:**
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  - Users become **light nodes**
  - Queries are outsourced to **full nodes**
- **Full node not trusted**
  - Program glitches
  - Security vulnerabilities
  - Commercial interest
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- **Problem:** Integrity-assured Search over Blockchain Data

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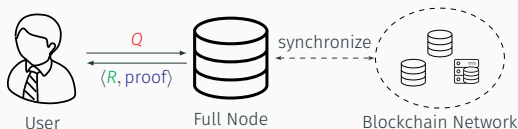
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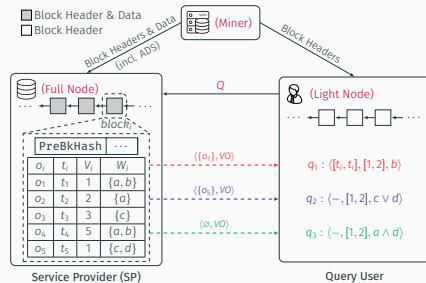
- **Security requirements**

- **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 conditions



# vChain — System Overview

- **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



System Model of vChain

- Data Model

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

- Boolean Range Queries

- Find all Bitcoin transactions happening in certain period  
Tx:  $\langle \text{time, transfer amount, \{“send address”, “receive address”\}} \rangle$   
 $q = \langle [2018-05, 2018-06], [10, +\infty], \text{“send:1FFYc”} \wedge \text{“receive:2DAAf”} \rangle$
- Subscribe to car rental messages with certain price and keywords  
Tx:  $\langle \text{time, rental price, \{“type”, “model”\}} \rangle$   
 $q = \langle -, [200, 250], \text{“Sedan”} \wedge (\text{“Benz”} \vee \text{“BMW”}) \rangle$

# Challenges

- How to construct ADS for **unbounded** and **append-only** blockchain data?
- How to design a **one-size-fits-all** ADS scheme that supports **dynamic queries** over **arbitrary attributes**?
- How to leverage **intra/inter-block optimization** techniques to improve query efficiency?
- How to make the system **highly scalable** to a large number of subscription queries?

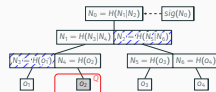
# Cryptographic Building Block

- 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



*Merkle Hash Tree*

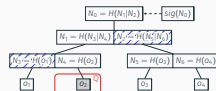
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*Merkle Hash Tree*

- Cryptographic Multiset Accumulator [PTT11]

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

# Basic Solution

- Consider *a single object* and *boolean query*
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  - Extend the block header with *AttDigest*
  - $AttDigest = acc(W_i) = Setup(W_i, pk)$ 
    - Constant size regardless of number of elements in  $W_i$
    - Support  $ProveDisjoint(\cdot)$  &  $VerifyDisjoint(\cdot)$



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  - **Match:**
  - **Mismatch:**



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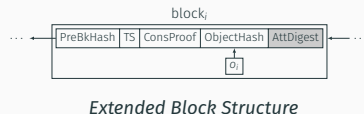
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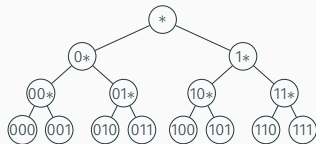
*Extended Block Structure*

## Example of Mismatch

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

## Extension to Range Queries

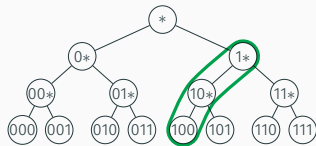
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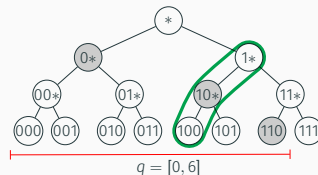
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- Numerical value can be transformed into a set of binary **prefix elements**
  - **Example:**  $\text{trans}(4) = \{1*, 10*, 100\}$ 
    - \* denotes wildcard matching operator



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  - **Example**:  $\text{trans}(4) = \{1*, 10*, 100\}$   
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- Range can be transformed into an equivalent **boolean expression** using a binary tree
  - **Example**:  $[0, 6] \rightarrow 0* \vee 10* \vee 110$   
Equivalence set:  $\{0*, 10*, 110\}$

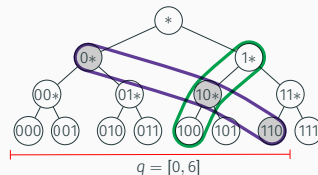


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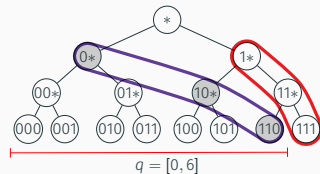
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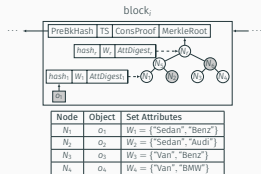
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    - $4 \in [0, 6] \rightarrow \{1*, 10*, 100\} \cap \{0*, 10*, 110\} = \{10*\} \neq \emptyset$
    - $7 \notin [0, 6] \rightarrow \{1*, 11*, 111\} \cap \{0*, 10*, 110\} = \emptyset$

## Batch Verification & Subscription Queries

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- **Idea**: we can aggregate them to speed up query processing

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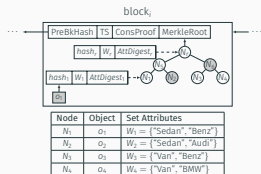
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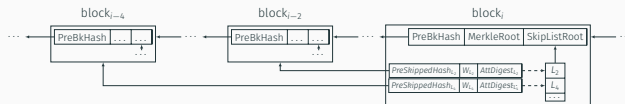
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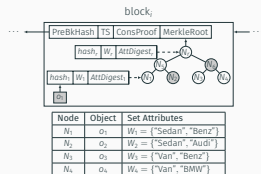
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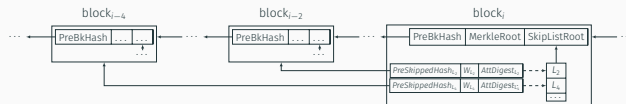
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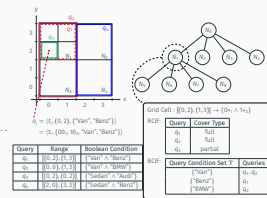
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  - **Inverted Prefix Tree:** aggregate similar subscription queries from users



*Intra-Block Index*



*Inter-Block Index*



*Inverted Prefix Tree*

# 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

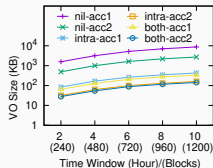
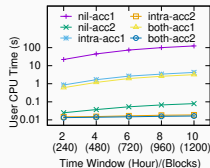
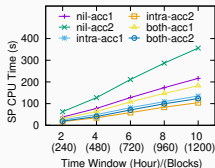
- Numerical range selectivity

- 10% for 4SQ
- 50% for ETH

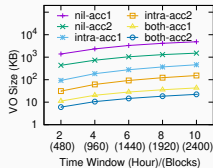
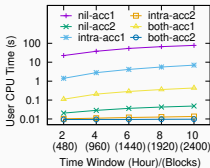
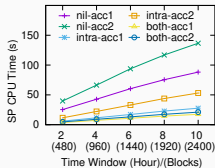
- Disjunctive Boolean function size

- 3 for 4SQ
- 9 for ETH

4SQ



ETH



Time-Window Query Performance

Thanks  
Questions?



# References

- [HCW+18] 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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