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# Transaction Allocation in Sharded Blockchain Systems

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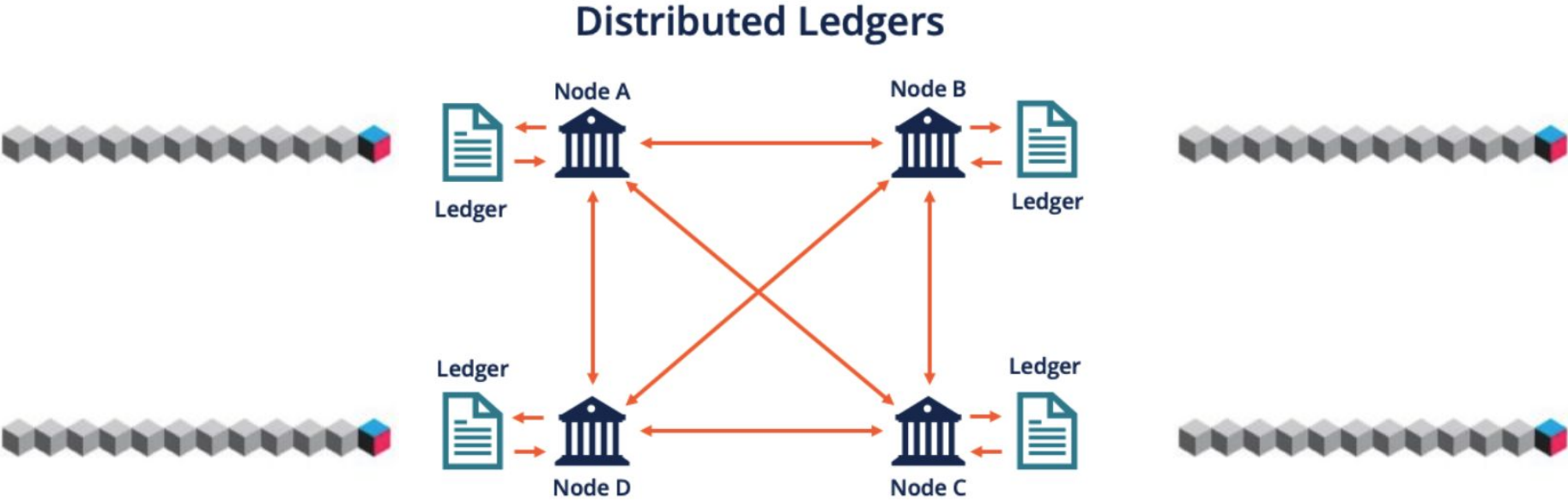
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# Blockchains

# Permissionless Blockchains

Immutable distributed ledgers



# Scalability Problem — Low Throughput

- **Bitcoin [1]**

First blockchain proposed in 2008

Market Cap: about 419 billion USD [3]

UTXO model (Unspent Transaction Outputs)

Throughput: about 7 transactions/second (TPS)

- **Ethereum [2]**

Smart contracts enabled blockchain

Market Cap: about 140 billion USD [3]

Account/Balance model

Throughput: about 15 transactions/second (TPS)



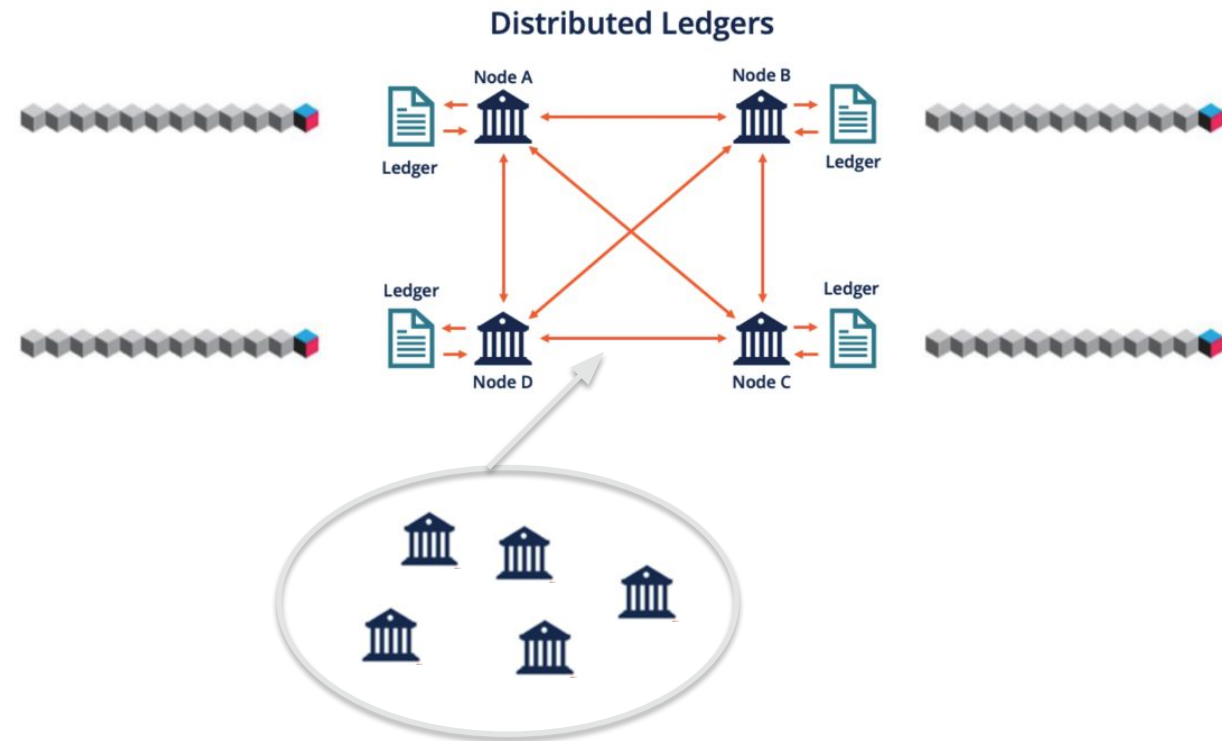
[1] S Nakamoto, "Bitcoin: A peer-to-peer electronic cash system," 2008.

[2] <https://ethereum.org/en/>

[3] <https://coinmarketcap.com/>, Data fetched on 14/June/2022

# Scalability

Loosely speaking, throughput should increase linearly with the number of miners. However, Bitcoin and Ethereum remain about 7 and 15 TPS, no matter how many miners involved.





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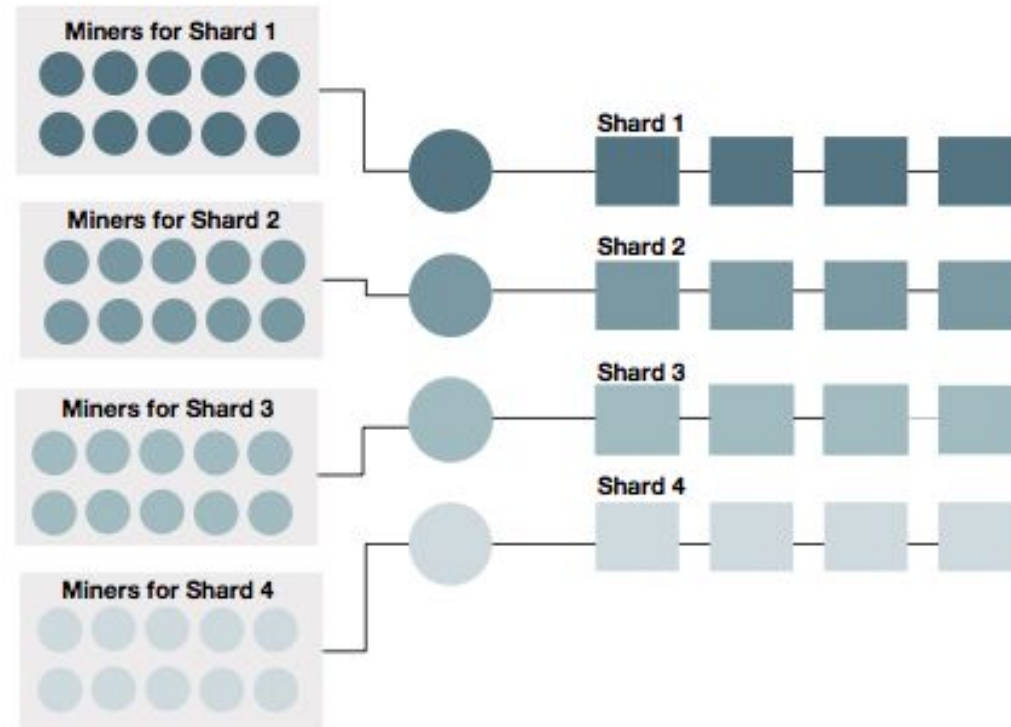
# Sharding Techniques

# Blockchain Sharding

Sharding protocols allocate Txns and Miners into multiple shards for parallel processing.

# Miners → # Shards → # TPS

Linear throughput improvement!







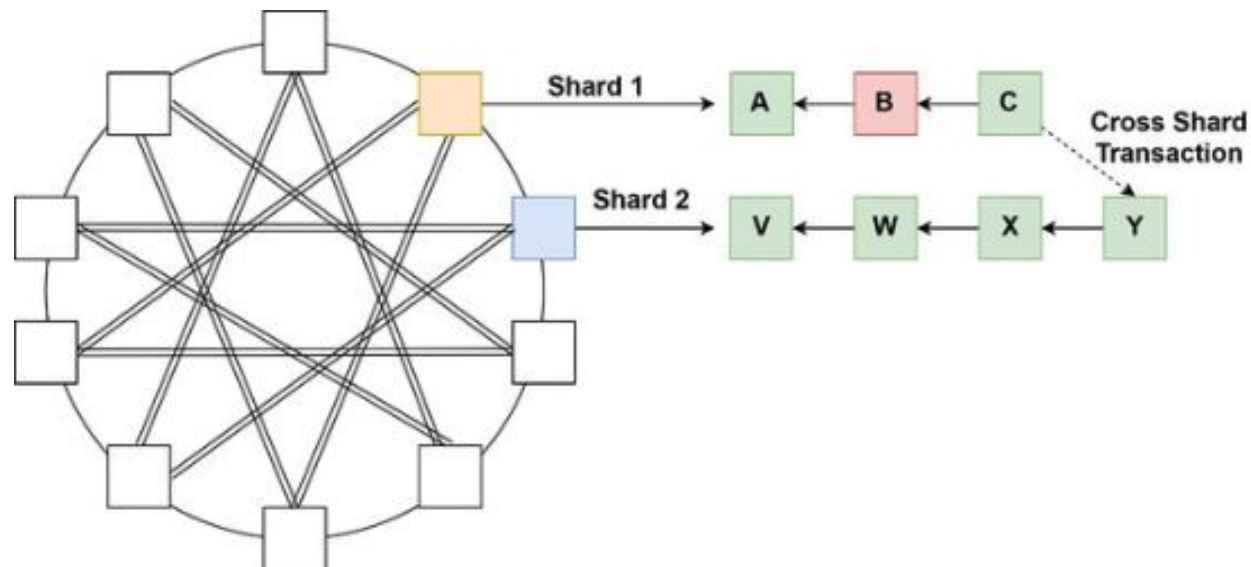
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# Cross-shard Transactions

# Cross-shard Transactions

- This occurs when affected accounts of a Tx are in different shards.
- The transaction modifies state in different shards.
- They have to communicate and achieve consensus.
- Expensive to process!



Alice in Shard C

Money Transfer

Bob in Shard Y

Amritraj Singh, PUBLIC BLOCKCHAIN SCALABILITY: ADVANCEMENTS, CHALLENGES AND THE FUTURE



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# Research Question

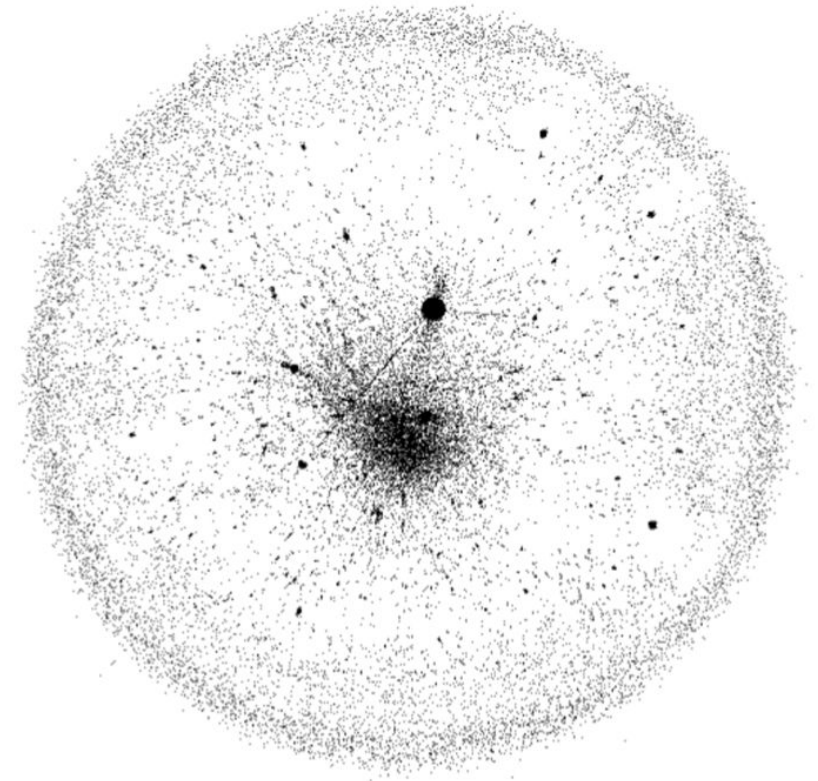
# Transaction Allocation to reduce the occurrence of Cross-shard Transactions

Two directions to tackle with cross-shard transactions:

1. Efficient cross-shard consensus,
2. Reducing the occurrence of cross-shard transactions.

Basic Idea: Account Allocation determines cross-shard transactions!

→ Put intensively-interacted accounts into one shard!





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# Related Works

# Sharding Protocols in Permissionless Blockchains

[4-6] focus on the security design and efficiency of cross-shard consensus

Hash-bash allocation — e.g.  $\text{SHA256}(\text{address}) \bmod k$ , where  $k$  is the number of shards. [4]

- Random to historical transaction patterns.
- Huge amount of cross-shard transactions, more than 90% [7]

[4] M Al-Bassam, A Sonnino, S Bano, D Hrycyszyn, and G Danezis, “Chainspace: A sharded smart contracts platform.” NDSS, 2018

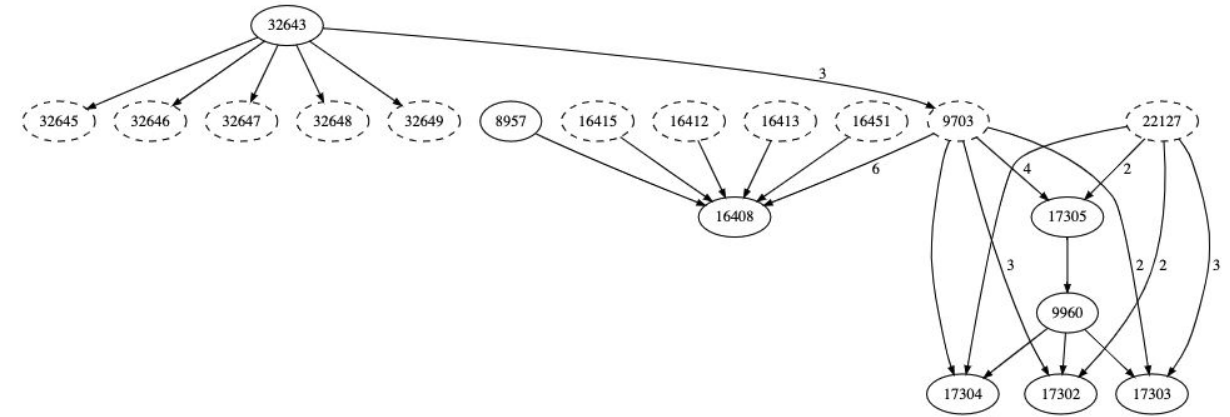
[5] J Wang and H Wang, “Monoxide: Scale out blockchains with asynchronous consensus zones,” in *16th USENIX Symposium on Networked Systems Design and Implementation*, 2019

[6] E Kokoris-Kogias, P Jovanovic, L Gasser, N Gailly, E Syta, and B Ford, “Omniledger: A secure, scale-out, decentralized ledger via sharding,” in *IEEE Symposium on Security and Privacy (S&P)*, IEEE, 2018

[7] G Wang, ZJ Shi, M Nixon, and S Han, “Sok: Sharding on blockchain,” in *Proceedings of the 1st ACM Conference on Advances in Financial Technologies*, 2019

# TRANSACTION ALLOCATION

- UTXO-based (ICDCS'19 [9])
- Account-based
  - Transaction-level approach (AFT'21 [11])
  - Graph-based approach
    - First identified this problem, METIS graph partition for solution. (DSN-W'18 [8])
    - Targeting on storage problem, also using METIS for allocation. (TNSM'21 [10])
    - Targeting on hot-shard problem, also using METIS for allocation. (INFOCOM'22 [12])



METIS [13] considers the number of inter-group links and degree balance for partition.

[8] E. Fynn and F. Pedone, "Challenges and pitfalls of partitioning blockchains," in 2018 48th Annual IEEE/IFIP International Conference on Dependable Systems and Networks Workshops (DSN-W). IEEE, 2018

[9] LN Nguyen, TD Nguyen, TN Dinh, and MT Thai, "Optchain: Optimal transactions placement for scalable blockchain sharding," in *IEEE 39th International Conference on Distributed Computing Systems (ICDCS)*, IEEE, 2019

[10] A Mizrahi and O Rottenstreich, "State Sharding with Space-aware Representations," *IEEE Transactions on Network and Service Management*, 2021

[11] M Kro1, O Ascigil, S Rene, A Sonnino, M Al-Bassam, and E Riviere, "Shard scheduler: Object placement and migration in sharded account- based blockchains," in *Proceedings of the 3rd ACM Conference on Advances in Financial Technologies*, 2021

[12] H Huang, X Peng, J Zhan, S Zhang, Y Lin, Z Zheng, and S Guo, Brokerchain: A cross-shard blockchain protocol for account/balance-based state sharding," in *IEEE INFOCOM*, 2022.

[13] Karypis, G., & Kumar, V. (1997). METIS: A software package for partitioning unstructured graphs, partitioning meshes, and computing fill-reducing orderings of sparse matrices.



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# Our Proposed Method

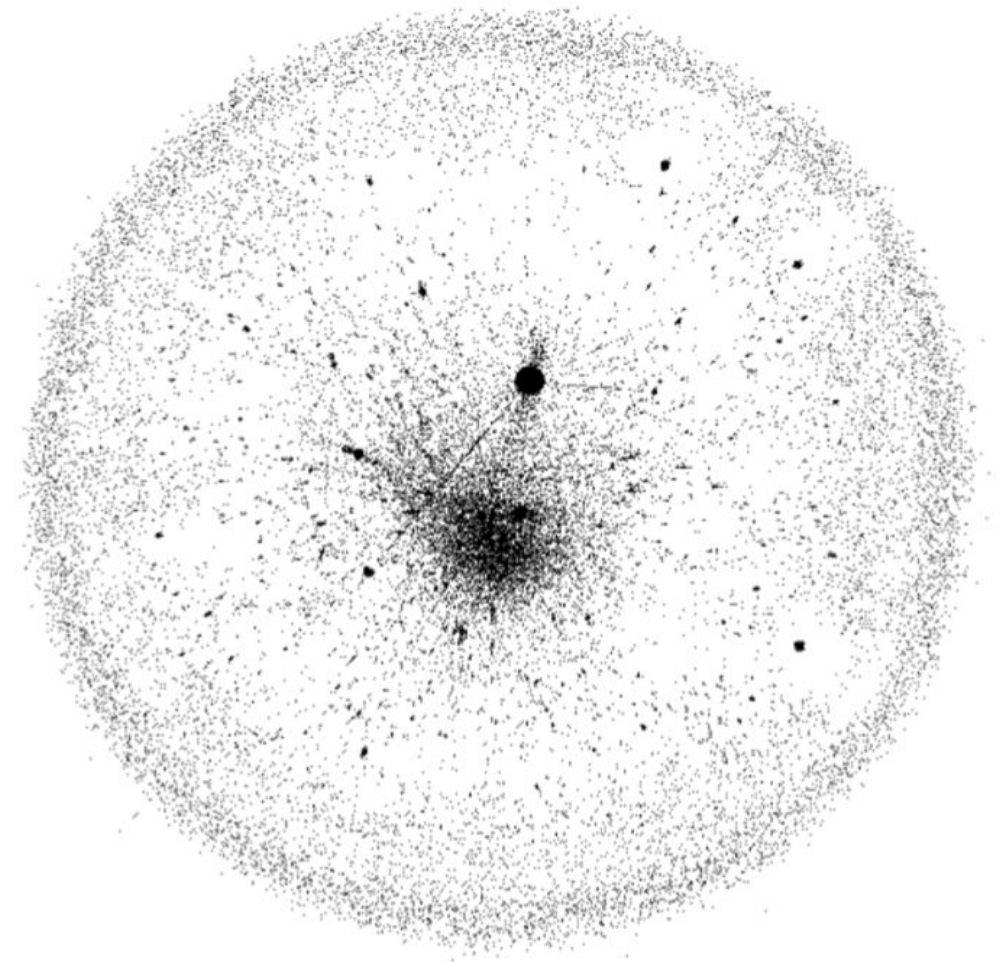


Our Paper has been accepted and will be presented at IEEE ICDE 2023.

*“TxAllo: Dynamic Transaction Allocation in Sharded Blockchain Systems. IEEE International Conference on Data Engineering, ICDE-23, Anaheim, California, United States, April 3 - 7, 2023 (CORE A\*)”*

# Challenges

- ❖ Workload balance among shards
  - long-tail distribution of accounts activeness
- ❖ Fast execution
  - large-scale data and keeping growing
- ❖ Deterministic algorithm for easy verification



# Our Contributions

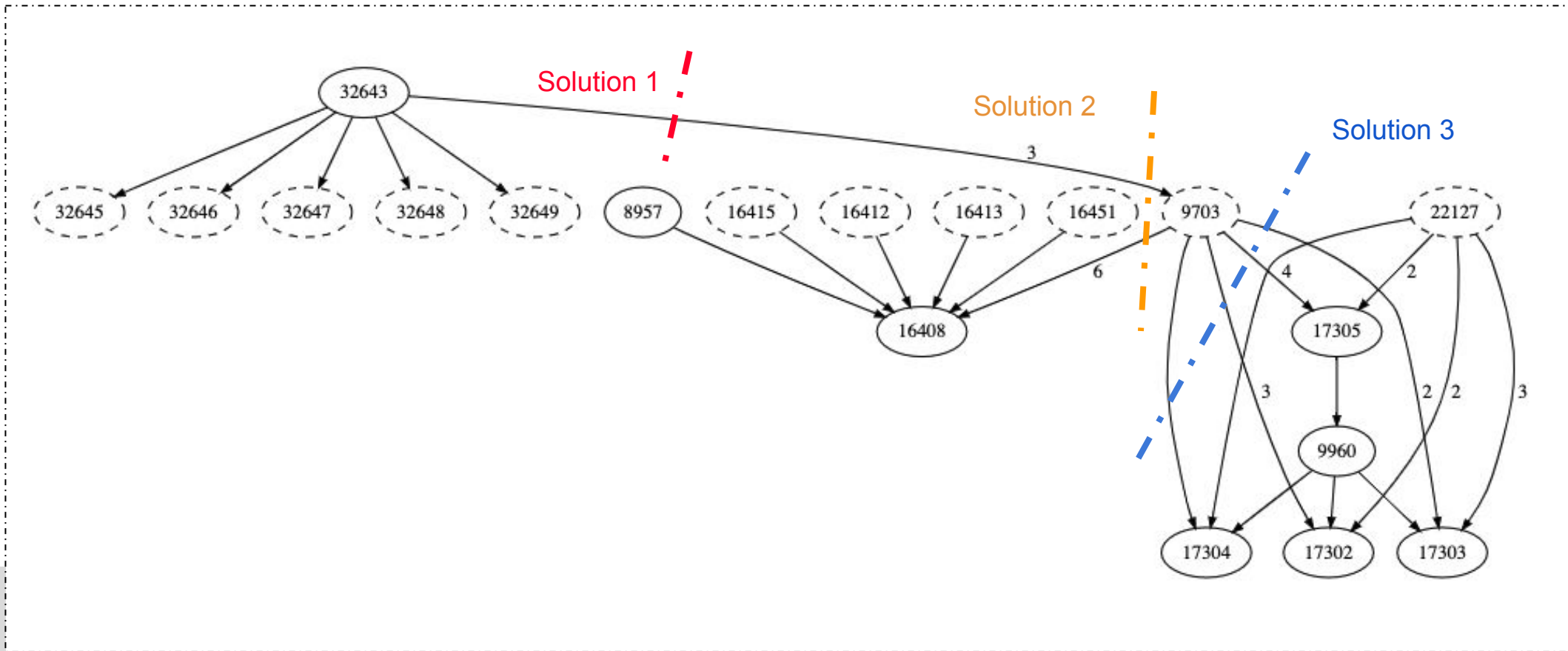
- ❖ We convert this problem to community detection problem on a graph.
  - We define the key concepts on the graph including **cross-shard Tx, processing workload in each shard, throughput, Tx confirmation latency**.
  - We **unify** the optimization target to **one** function, i.e. throughput, considering both **cross-shard Tx ratio** and **workload balance**.
- ❖ We propose a dynamic allocation mechanism TxAllo.
  - Deterministic
  - Adaptive updating – using previous allocation and new transaction patterns
  - Fast execution
- ❖ We implement TxAllo on Ethereum data with over 91m Txs and 10m accounts.
  - Significant improvement in terms of performance and running time

# Motivation Example (k=2)

Hard to tell which solution is the best.

- Solution 1 – imbalanced
- Solution 2 and 3 – more inter-shard cuts

An unified allocation target is required.



# Optimization Target— Throughput

Minimize the number of cross-shard transactions, with workload balance bounded by the processing capacity.

Workload

Difficulty parameter

Processing capacity in each shard

Throughput when capacity is enough

Throughput

$$\sigma_i = \sum_{v \in V_i, u \in V_i} w_{\{v,u\}} + \eta * \sum_{v \in V_i, u \notin V_i} w_{\{v,u\}}.$$

$\eta$

$\lambda$

$$\hat{\Lambda}_i = \sum_{v \in V_i, u \in V_i} w_{\{v,u\}} + \frac{\sum_{v \in V_i, u \notin V_i} w_{\{v,u\}}}{2}$$

$$\Lambda_i = \begin{cases} \hat{\Lambda}_i, & \sigma_i \leq \lambda \\ \frac{\lambda}{\sigma_i} * \hat{\Lambda}_i, & \sigma_i > \lambda \end{cases}.$$

Basic idea: loop for accounts

Each of them joins the shard with optimal throughput

Basic idea: Only change the allocation for accounts which appear in newly-included blocks.



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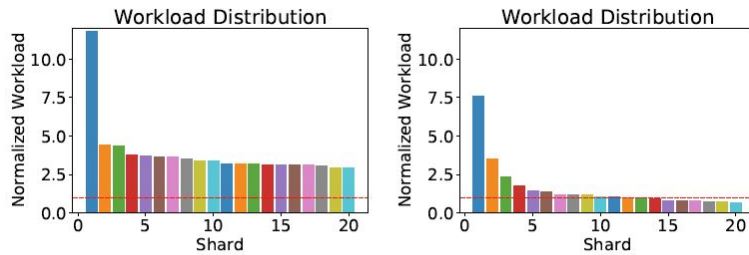
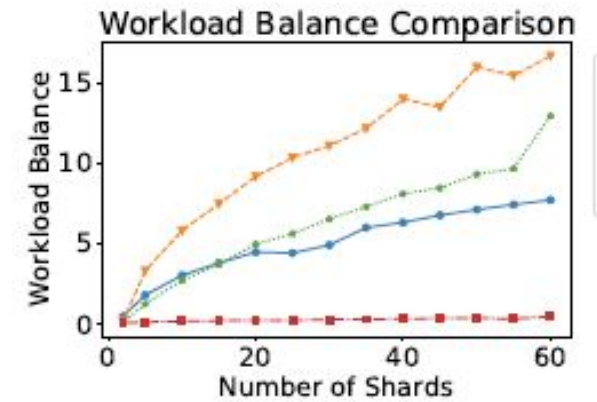
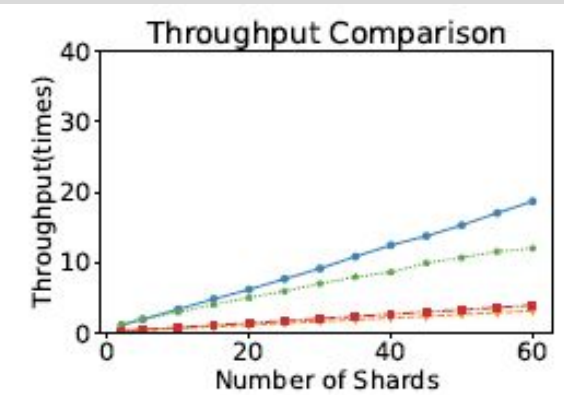
# Experimental Results



- Over 91m Txs and 12m accounts Ethereum data.
- Implementation with Python 3.8 on Intel Xeon Gold 6150 CPU and 250 GB memory
- Evaluations:
  1. Cross-shard Transaction Ratio
  2. Workload Balance, i.e. standard deviation of workload
  3. Throughput
  4. Transaction confirmation latency
  5. Algorithm running time

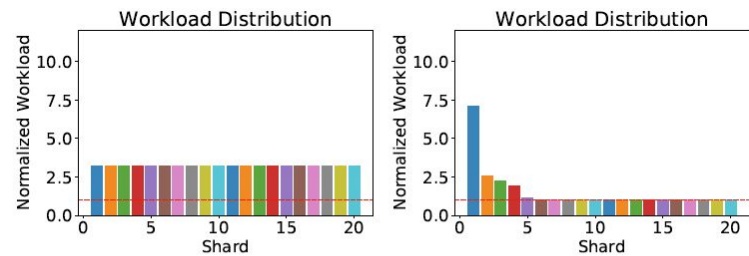
# Key findings – Global Algorithm

- ❖ ~200 seconds running time/ ~400s METIS-based algorithm,  
Within 60 shards:
  - ~12% Cross-shard transactions/~27% METIS
  - Better Throughput and workload balance



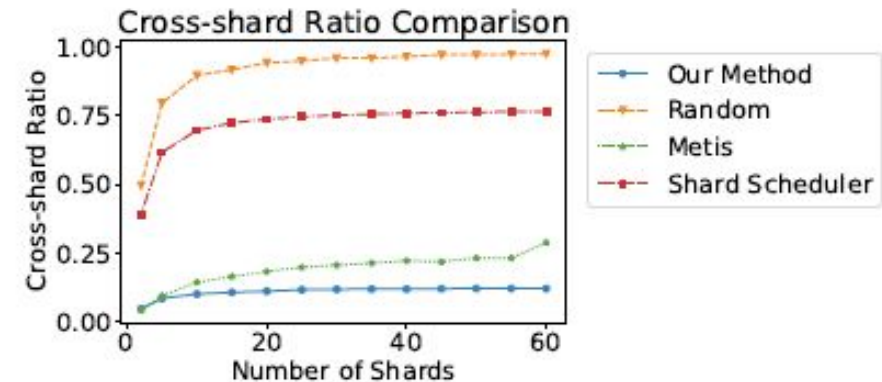
(a) Random

(b) METIS



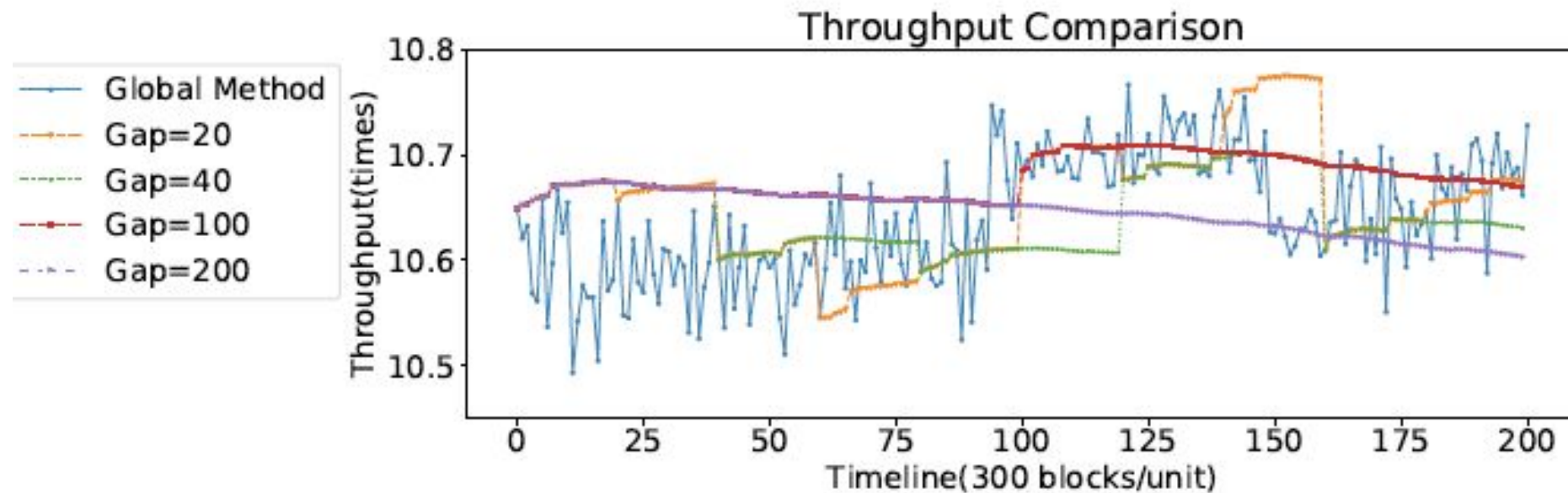
(c) Shard Scheduler

(d) Our method



## Key findings – Adaptive Algorithm

- ❖ ~0.5 seconds running time/ ~200s global algorithm,
- ❖ less than 1% performance loss than global algorithm.





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# Conclusions

# Conclusions

- Convert to Community Detection on graph
- A fast and deterministic algorithm
- Directly optimize throughput on graph
- Significant performance improvement on ETH data



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**THANK YOU!**