# DAG-based Efficient Parallel Scheduler for Blockchains: Hyperledger Sawtooth as a Case Study

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- 3 Motivation
- 4 Framework design and implementation
- 5 Results
- 6 Conclusion and Future Work
  - 7 Related Work



### 1 Research Objective and Introduction

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- The objective is to develop an Efficient Distributed and Secure framework for the Execution of Smart Contracts in Blockchains.
  - Develop framework for concurrent execution of transactions.



 Blockchain is a decentralized distributed immutable ledger shared among untrusted parties<sup>1</sup>.



#### <sup>1</sup>Nakamoto:Bitcoin:2009.

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Enhanced Sawtooth

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 Blockchain is a decentralized distributed immutable ledger shared among untrusted parties<sup>1</sup>.



• Each block contains a set of transactions.

<sup>1</sup>Nakamoto:Bitcoin:2009.

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# Smart Contracts



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- Smart contracts are like a 'class' that encapsulates data and methods.

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- Clients (external to the system) wishing to execute transactions, contact a peer of the system.



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Figure: Clients send Transaction T1, T2 and T3 to block producer (Peer4)<sup>2</sup>

<sup>2</sup> Parwat+:Netys:20	<b>20</b> .
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Figure: Block producer forms a block B4 and computes final state (FS) sequentially

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#### Figure: Block producer broadcasts the block B4





Figure: Validators (Peer 1, 2, and 3) compute current state (CS) sequentially

Image: A match a ma





Figure: Validators verify the FS and reach the consensus protocol

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Figure: Block B4 successfully added to the blockchain

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### Research Objective and Introduction

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- Hyperledger Sawtooth<sup>3</sup> is a modular platform for building, deploying, and running distributed ledgers.
- The modular property of sawtooth, enables enterprises and consortiums to make decisions about their blockchain applications for themselves.





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- The modular property of sawtooth, enables enterprises and consortiums to make decisions about their blockchain applications for themselves.

### Sawtooth Key Features:

- Modular
- Permissioned as well as permissionless infrastructure
- Parallel transaction execution
- Pluggable consensus algorithms
- Multi language support
- Dynamic consensus

#### Sawtooth

sawtooth:url.

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Image: Image:



• While block producers are composing the blocks.



Figure: Block producer create the block and broadcast it to others



- While block producers are composing the blocks.
- While nodes/peers are validating the blocks.



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- While nodes/peers are validating the blocks.



Figure: Validators (Peer 1, 2, and 3) compute current state (CS) sequentially

Image: A math a math



In both stages, the transactions in the block are executed serially in most  $blockchains^4$ :

- Not utilizing the multi-core processors efficiently.
- Results in lower throughput.

#### <sup>4</sup>Dickerson+:ACSC:PODC:2017.



In both stages, the transactions in the block are executed serially in most  $blockchains^4$ :

- Not utilizing the multi-core processors efficiently.
- Results in lower throughput.

Solution: Concurrent execution of SCTs

<sup>4</sup>Dickerson+:ACSC:PODC:2017.



• Validator may incorrectly reject a valid block proposed by the block producer. We call such error as **False Block Rejection (FBR)** error<sup>5</sup>,<sup>6</sup>.

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<sup>&</sup>lt;sup>5</sup>Dickerson+:ACSC:PODC:2017. <sup>6</sup>Parwat+:Netvs:2020.



 Validator may incorrectly reject a valid block proposed by the block producer. We call such error as False Block Rejection (FBR) error.





- We have proposed a concurrent transaction execution framework for blockchains.
- The proposed approach has been thoroughly tested in Hyperledger Sawtooth 1.2.6.
- It is flexible enough for implementation in any blockchain that follows the order-execute paradigm.



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## Framework Design





Figure: Proposed framework in the blockchain

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• The parallel scheduler performs the operations of DAG creation and conflict-free transaction execution.



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  - DAG (Direct Acyclic Graph) to represent the dependencies among the transactions:
    - The nodes of the graph will be the transactions in the block.



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  - The nodes of the graph will be the transactions in the block.
  - An edge represents the dependency between two transactions.





 Dependency: When two transactions are accessing the same data while at least one of which is modifying it.





- Scheduling:
  - Transactions with zero indegree are not dependent on current set of executing transactions.
  - These transactions can be scheduled for execution.



- Scheduling:
  - The out edges are removed of the transactions that have completed execution.


### Framework Design





Figure: Proposed framework in the blockchain

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• The *Malicious block producer* can send an incorrect Block Graph to harm the blockchain, missing some edges, to cause *double spending*. We call such error as **Edge Missing BG (EMB)** error<sup>7</sup>.



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**Solution:** We propose a *Secure Multi-threaded Validator (SMV)* to detect EMB error and rejects the corresponding blocks.



• The *Malicious block producer* can send an incorrect Block Graph with extra edges, to intentionally slow the validation process. We call such error as **Extra Edge BG (EEB)** error.



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Figure: Linked list address data for secure validator

- Edge Validation: There should be an edge connecting each transaction in the read list to every transaction in the write list.
- An edge should also connect any two transactions within the write list.





Figure: Linked list address data for secure validator

- Edge Validation: There should be an edge connecting each transaction in the read list to every transaction in the write list.
- An edge should also connect any two transactions within the write list.
- **In-degree validation:** We track the in-degree of each transaction during edge validation and cross check it with DAG in-degree.



- We have developed two implementations for the proposed DAG scheduler:
  - Linked List
  - Adjacency Matrix





We implemented four transaction families to test the performance of our approach:



We implemented four transaction families to test the performance of our approach:

- IntKey Transaction Family
- SmallBank Transaction Family
- Voting Transaction Family
- Insurance Transaction Family
- Mixed block containing all three



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Experiment 1: Varying the Number of Blocks

- Y-axis: Time in seconds
  - X-axis: Number of blocks
  - Number of threads: 56
  - Degree of dependency: 50% CP3
  - Number of txns: 1000

Figure: Experiment one: Voting

Curves: Serial Scheduler, Tree Parallel Scheduler, LLDAG Scheduler, Adj DAG Scheduler.







- SimpleWallet Transaction Family
  - Y-axis: Time in seconds
  - X-axis: Number of transactions per block
  - Number of threads: 56
  - Degree of dependency: 50% CP2
  - Number of blocks: 20



#### Figure: Experiment two: SimpleWallet

Curves: Serial Scheduler, Tree Parallel Scheduler, LLDAG Scheduler, Adj DAG Scheduler.





- SimpleWallet Transaction Family
  - Y-axis: Time in seconds
  - X-axis: Number of transactions per block
  - Number of threads: 56
  - Number of blocks: 20
  - Number of txns: 1000



# Figure: Experiment three: Mixed Block

Curves: Serial Scheduler, Tree Parallel Scheduler, LLDAG Scheduler, Adj DAG Scheduler.

- Dependency data structure creation or validation time for SimpleWallet Transaction Family
  - Y-axis: Time in seconds
  - X-axis: Number of transactions per block
  - Number of threads: 56
  - Degree of dependency: 50% CP2
  - Number of blocks: 20

Figure: Comparison of data structure creation time.

Curves: Tree Parallel Scheduler, LLDAG Scheduler, Adj DAG Scheduler, Secure Validator







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- We have introduced a concurrent transaction execution framework for blockchain systems.
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- Rigorous testing of our approach has taken place within Hyperledger Sawtooth 1.2.6.
- Our adaptable framework is compatible with any blockchain adhering to the order-execute paradigm.
- The artifact of our framework is evaluated and is available in Figshare repository<sup>8</sup>.

<sup>&</sup>lt;sup>8</sup>Piduguralla:artifact:2023.



- Optimize the framework by improving DAG creation and secure validation is our immediate next step.
- We will be exploring enhancing the fault tolerance and scalability for each blockchain node.

# Thank you





Thank you to ACM-W and Google for sponsoring my attendance and paper presentation at this conference

# **Extras**

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#### **Transaction Families** $\approx$ **Smart Contracts**



Intro

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- The **journal** is the group of validator subcomponents that work together to handle batches and proposed blocks.
- The **Block Completer** initially receives the blocks and batches. It guarantees that all dependencies for the blocks have been satisfied.
- Completed batches go to the **Block Publisher** for batch validation and inclusion in a block.
- Completed blocks go to the **Block Validator** for validation and fork resolution.

Intro

## Sawtooth architecture



- Journal
- Transaction Scheduler
- Transaction Executor
- Transaction Processor
- Global State



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### Life Cycle of a Sawtooth Transaction



Intro

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#### Transaction Processors (IntKey, SmallBank, XO) Register Ger/Set addresses Apply Context Create/ Transaction Radix Merkel Tree Merge/- Context Manager (Global State) Executor Commit Execute Transactions Transaction Scheduler Checking validity Txns for for Txns commit Block Chain Consensus Controller Publisher Check Apply consensus consensus Blocks for Blocks block creation for validations Publish Block Completer Blocks Transactions Blocks Batches Gossip Client Network

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#### • Block Completer:

Receives the blocks and batches from the network

Journal





Journal





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• Block Validator: Performs validation and fork resolution for transactions in the block

# Sawtooth Parallel Scheduler

- Sawtooth tree structure to keep track of dependencies using merkle tree.
- Each data location has read and write lists that contain the ID of the transactions that are accessing them.
- David, Daniel, Dylan.



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### Transaction Executor



- The executor obtains the next transaction from the sceduler.
- Acquires context reference from context manager and state.
- Combines transaction and context for transaction processor.
- The Executor updates the sceduler with the transactions's result with the updated context using locks.



- Sawtooth Global State
  - Sawtooth uses an addressable Radix Merkle tree to store data for transaction families.
  - Merkle tree : stores successive node hashes from leaf-to-root.
  - Radix tree: addresses uniquely identify the paths to leaf nodes.
  - An address is a hex-encoded string of 35 bytes, each node has 2<sup>8</sup> possible children.





Key places for optimization in Hyperledger Sawtooth

• Sawtooth architecture uses tree with addresses as nodes to represent the dependencies.

(Total number of addresses >> Transactions in a block)

- The construction of the tree is done serially.
- Status of all the dependent transactions is checked before scheduling a transaction.

#### (This generates a delay in scheduling the transaction)

- The available transaction are searched from the start of the array each time a transaction is scheduled.
- Locks are used to update transaction status.



- We have developed two implementations for the proposed DAG scheduler:
  - Linked List
  - Ajacency Matrix





- For DAG scheduling the function "Next\_transaction" is modified.
- Transactions are selected for scheduling using the DAG created.
- In selecting a transaction there are multiple C++ modules initiated by python threads.



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- For DAG creation we have modified the "add\_batch" function in Sawtooth scheduler.
- The creation of DAG is done through multiple threads in C++ module.



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Figure: Possible validators in the blockchain


Consensus protocols and transaction throughput are the two significant bottlenecks of blockchain performance.

## **Consensus:**

- Proof of Stake (PoS)<sup>9</sup>
- Proof of Elapsed Time (PoET)<sup>10</sup>
- Practical Byzantine Fault Tolerance (PBFT)<sup>11</sup>

<sup>&</sup>lt;sup>9</sup>Vasim:2014:Blackcoin. <sup>10</sup>sawtooth:url. <sup>11</sup>Castro:2002:ACM.



Consensus protocols and transaction throughput are the two significant bottlenecks of blockchain performance. **Sharding:** 

- Network Sharding<sup>12</sup>
- State Sharding<sup>13</sup>
- Transaction Sharding<sup>14</sup>

<sup>12</sup>DiPETrans:CPE:2022. <sup>13</sup>Zheng+:IEEE:TII:2022. <sup>14</sup>Dang+:SIGMOD:2019.



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Consensus protocols and transaction throughput are the two significant bottlenecks of blockchain performance.

<sup>15</sup>Dickerson+:ACSC:PODC:2017.
<sup>16</sup>Parwat+:Netys:2020.
<sup>17</sup>blockSTM:2022.



Consensus protocols and transaction throughput are the two significant bottlenecks of blockchain performance. **Transaction throughput:** 

## STMs

- Block Graph (BG)<sup>15</sup>
- BG + Smart Validator<sup>16</sup>
- BlockSTM<sup>17</sup>

 <sup>&</sup>lt;sup>15</sup>Dickerson+:ACSC:PODC:2017.
<sup>16</sup>Parwat+:Netys:2020.
<sup>17</sup>blockSTM:2022.



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## **Adjacency Matrix**

Γ0	0	0	0	1	1	0	[0
0	0	0	1	0	0	1	1
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	1
0	0	0	0	0	0	0	0
0	0	0	0	1	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0]

## **In-Degree Matrix**

$$\begin{bmatrix} 0 & 0 & 0 & 1 & 2 & 1 & 1 & 2 \end{bmatrix}$$

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In order to assess the framework's performance across different scenarios, we have devised three conflict parameters (CP):

- CP1 measures the proportion of transactions in the DAG that have at least one dependency
- CP2 represents the ratio of dependencies to the total number of transactions in the DAG
- CP3 quantifies the number of disjoint components, which are subgraphs without interconnections in the DAG.



Parameter that we can change in Sawtooth architecture:

- Number of blocks
- Number of transactions in a block
- Metric for degree of dependency
- Number of threads