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DLattice: A Permission-Less Blockchain Based on DPoS-BA-DAG Consensus for Data Tokenization

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ABSTRACT In today's digital information age, the conflict between the public's growing awareness of their own data protection and the data owners' inability to obtain data ownership has become increasingly prominent. The emergence of blockchain provides a new direction for data protection and data tokenization. Nonetheless, existing cryptocurrencies such as Bitcoin using Proof-of-Work are particularly energy intensive. On the other hand, classical protocols such as Byzantine agreement do not work efficiently in an open environment. Therefore, in this paper, we propose a permission-less blockchain with a novel double-DAG (directed acyclic graph) architecture called DLattice, where each account has its own Account-DAG and all accounts make up a greater Node-DAG structure. DLattice parallelizes the growth of each account's Account-DAG, each of which is not influenced by other accounts' irrelevant transactions. DLattice uses a new DPoS-BA-DAG(PANDA) protocol to reach consensus among users only when the forks are observed. Based on proposed DLattice, we introduce a process of data tokenization, including data assembling, data anchoring, and data authorization. We implement DLattice and evaluate its performance on 25 ECS virtual machines, simulating up to 500 nodes. The experimental results show that DLattice reaches a consensus in 10 seconds, achieves desired throughput, and incurs almost no penalty for scaling to more users.

INDEX TERMS Blockchain, data tokenization, consensus algorithm, byzantine agreement protocols, directed acyclic graph.

I. INTRODUCTION

In this new era of digital information age, people generate a variety of data in their daily lives. On the Internet, they leave browse records and social data. In the Internet of Things, user's health data is collected by wearable devices, and usage data is acquired by smart home applications. Massive amounts of data are used to analyze behavioral and health conditions without the user's knowledge. To make matters worse, criminals use privacy data for blackmail and extortion. The US technology giant Facebook has leaked more than 50 million users' personal information data, reaping huge profits and even affecting the US election [1]. Coincidentally, China Huazhu, a large hotel group, has been reported that more than 100 million users' private data has been stolen by hackers and used for public sales online and blackmail [2].

In the scientific community, Piero Anversa, a well-known professor and leading expert in the cardiovascular field, was identified by his Harvard Medical School and Brigham and Women's Hospital as having 31 papers suspected of data fraud, and major medical journals are requested to withdraw published papers [3]. From these events we can see:

1) The control over the data is difficult to determine. Data is not controlled by the real owner (e.g. the user entity) but by the data producer (such as the equipment manufacturer or the service provider). The real owner of the data lacks the permission to agree and know about the use of data, so that the privacy is not guaranteed [4].

2) Data reliability is poor and can be falsified. Data producers have the ability to tamper with data or even fabricate false data in the centralized database, making it difficult for data collectors (e.g. research institutions), data producers, and real owners of data to establish data trust relationships.

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3) Data cannot be shared efficiently. Because the ownership of the data does not belong to the real owner, resulting in that the data cannot be shared to other paid data collectors conveniently [5].

The new blockchain technology has shown promising natures to solve these issues. Blockchain is a cryptographically secure transactional singleton machine with sharedstate [6], which contains an ordered list of records linked together through chains, trees or DAGs, etc. Blocks are generated by distributed nodes through a consensus mechanism and spread and verified across the whole network [7]. The distributed nature of blockchain implies no single entity controls the ledger, but rather the participating peers together validate the authenticity of records. It is indeed because of its features such as decentralization, tamper-resistance and network datasharing, blockchain has tremendous potential in the fields of data protection and tokenization [8], [9].

Unlike cryptocurrencies which are created on and derived their values directly from the blockchains, digital assets are often issued by real world entities and blockchains are merely a medium to record their existence and exchanges [10]. Multichain [11] offers ledgers for storing and tracking asset history. IOTA [12] issues its token and offers its public ledger as a platform for micro-payment, which makes data been exchanged among IoT devices. Previously, we proposed a method of data assetization and may help promote the data value transferring and data sharing among the Internet of Things based on Ethereum Smart Contracts [5].

Resolution of forks is the core problem faced by any cryptocurrency. Bitcoin [13] and most other cryptocurrencies [6], [14] address forks problem using Proof-of-Work (PoW), where users must repeatedly compute hashes to grow the blockchain, and the longest chain is considered authoritative [15]. The process is particularly energy intensive and time consuming. Proof-of-Stake (PoS) [16] avoids the computational overhead of proof-of-work and therefore allow reducing transaction confirmation time. On the other hand, although the advantage of original PBFT [17] is finality, which once a block is appended, it is final and cannot be replaced, Byzantine Agreement protocols do not work in an open environment efficiently because of bandwidth limitation and having no trusted public-key infrastructure [18].

The main contributions of this paper are as follows:

- We propose a permission-less blockchain, called DLattice, with a novel Double-DAG architecture where each account has its own Account-DAG and all accounts make up a greater Node-DAG structure. DLattice parallelizes the growth of each account's Account-DAG, each of which is not influenced by other accounts' irrelevant transactions. The use of Red-Black Merkle Tree in the account's D-Tree speeds up the efficiency of querying and inserting data assets.
- 2) We design a new DPoS-BA-DAG (PANDA) protocol to reach consensus among users only when the forks are observed instead of executing consensus at a fixed interval. Experimental results show that the protocol

can reach a consensus with latency in 10 seconds while scaling to more users.

3) We introduce a process of data tokenization based on proposed DLattice structure, including data assembling, data anchoring and data authorization.

The rest of the paper is organized as follows: Section II consists of related works, Section III reviews the preliminaries used throughout this paper. In Section IV, the blockchain model is described in detail. A series of methods for data tokenization is presented in Section V. Our PANDA consensus is elaborated in section VI, followed by the attack vectors and security analysis in Section VII. Section VIII presents the implementation and evaluation. Finally, the conclusion and future direction are presented.

II. RELATED WORKS

A. PROOF OF WORK (POW) VARIANTS

PoW protocols require miners to solve complex cryptographic puzzles which is easy to be verified based on their own computing power by cryptographic hashes. Specifically, the solution is a random nonce n such that

$H(n||H(b)) \le M/D,$

for a cryptographic hash function H with a variable number of arguments and range [0, M], a target difficulty D and the current block content *b* [10], [19]. The faster the puzzle is solved by miners, the higher possibility a block is created. A new block is generated every 10 minutes on average in Bitcoin [20].

B. PROOF OF STAKE (POS) VARIANTS

PoS protocols change the puzzle's difficulty to be inversely proportional to the miner's stake in the network [10], [19]. Let bal() be the function that returns the stake, then a miner S can generate a new block by solving the puzzle of the following form:

$H(n||H(b)) \le bal(S)M/D.$

Casper [21] is an Ethereum's upcoming PoS protocol based on smart contract. It allows miners to become validators by depositing Ethers to the Casper account. The contract then picks a validator to propose the next block according to the deposit amount. If the block is confirmed, the validator gets a small reward. But if it is not, the validator loses its deposit [10].

C. BYZANTINE CONSENSUS VARIANTS

Byzantine Agreement (BA) protocols have been used to replicate a service across a small group of servers [22] [23], therefore they are suitable for permissioned Blockchain. PBFT [17] is deterministic and incurs $o(N^2)$ network messages for each round of agreement where N is the number of nodes in the network. Tendermint [24] proposes a small modification on top of PBFT. Instead of having an equal vote, each node in Tendermint may have different voting power, proportional to their stake in the network. Algorand [15] uses a BA* protocol to reach consensus among users on the next set of transactions based on Verifiable Random Function that allows users to privately check whether they are selected to participate in the BA, and to include a proof of their selection in their network messages.

D. DIRECTED ACYCLIC GRAPHS (DAGS) VARIANTS

Nano and HashGraph are some recent proposals for increasing Bitcoin's throughput by replacing the underlying chain structured ledger with a DAG structure. Hashgraph [25] is proposed for replicated state machines with guaranteed byzantine fault tolerance and achieves its fast, fair and secure transactions based on gossip about gossip and virtual voting techniques.

Nano [26] proposes a novel block-lattice architecture where each account has its own blockchain, delivering near instantaneous transaction speed and unlimited scalability and allowing them to update it asynchronously to the rest of the network, resulting in fast transactions with minimal overhead.

III. PRELIMINARIES

A. SYMMETRIC AND ASYMMETRIC CRYPTOGRAPHY

Symmetric Cryptography uses the same cryptographic keys for both encryption of plaintext and decryption of cipher text. The keys may be identical or there may be a simple transformation to go between the two keys. Asymmetric Cryptography is also known as a public key cryptography and uses public and private keys to encrypt and decrypt data. The keys are simply large numbers that have been paired together but are not identical. One key in the pair can be shared with everyone and called the public key. The other key, called the private key, in the pair is kept secretly.

B. CRYPTOGRAPHIC HASH FUNCTION

maps arbitrarily long strings to binary strings of fixed length. And it should be hard to find two different strings x and y such that H(x) = H(y), where H() represents the hash function.

C. DIGITAL SIGNATURES

allow users to authenticate information to each other without sharing any secret keys, based on public key cryptography. To create a digital signature, the hash of the message is created firstly. The private key is then used to encrypt the hash. The encrypted hash is the digital signature.

IV. MODEL DESCRIPTION

A. DEFINITIONS

1) CONSENSUS-PARTICIPATING NODE

Consensus-participating node, $CNode_i \in \{CNode_1, .., CNode_N\}$, where N represents the number of nodes in the system. A consensus-participating node is a piece of software running on a computer that conforms system protocols and joins in the system network. The nodes communicate with each other through the gossip protocol, and their distribution is as shown in Fig. 1. The *CNode* is responsible for recording



FIGURE 1. Overall structure of DLattice. The nodes (CNode), consisting of normal accounts (NorAC) and consensus accounts (ConAC), communicate with each other through the gossip protocol.

the asset ledger and the data ledger, and these ledgers in each *CNode* are the same. When initialized, each *CNode* creates one unique consensus account *ConAC_i*. The account consists of a public-private key pair $\langle Pk_i, Sk_i \rangle$. The public key *Pk* is called the account address, which is used to identify the identity of *CNode_i*, and is exposed to the whole network. The consensus account needs to reserve a certain amount of consensus deposit. At the same time as enjoying the consensus right to obtain other accounts' fork penalty, the node also bears the risk of forfeiture of the consensus deposit for its malicious behaviors. Significantly, the node that owns all tokens of the system at initial state is called the Genesis Node, and it is responsible for the booting of the system.

2) ACCOUNT

The account, $Account_k \in \{Account_1, \ldots, Account_M\}$, where M represents the number of accounts, which has no theoretical upper limit. The account is the main body of actual user's participation in the system, and is composed of a public-private key pair $\langle Pk_k, Sk_k \rangle$, where the public key Pk_k is used to identify the identity of the account and is exposed to the entire network. A user can control multiple accounts, but each account only corresponds to one public key. The private key Sk_k is similar to the password in the ordinary system. The user holding the private key has the actual control of the account. The Sk_k can be used by the account to sign the transaction block or message to clarify the source of them. The accounts include normal account NorAC and consensus account ConAC. The NorAC consists of a currency ledger and a data ledger, which can be used to send and receive currency assets and data assets and to assign access control of the data assets. The structure of account is also shown in Fig. 1. The ConAC has the same function as the NorAC except for the functions described in Definition 1. Each account has its own DAG structure called Account-DAG, which together makes up the Node-DAG.

3) TRANSACTION AND BLOCK

A transaction is an agreement or a certain behavior between the sender and the receiver [27]. In this system, the construction of the transaction requires the account owner to sign with its private key, and a block contains only one transaction, so it is called a Transaction Block in this paper, recorded as TB. The transaction blocks include Creating Transaction Block TB_{create}, Delegating Transaction Block $TB_{delegate}$, Sending and Receiving Transaction Block < TB_{send} , $TB_{receive}|TB_{deal} >$, and Authorization Transaction Block TB_{auth} , etc., as shown in Fig. 2. Both the transfer of the currency asset and the data asset require the confirmation of two transaction blocks. The TB consists of three states, $\sigma(State_{TB}) \in \{S_{sending}, S_{pending}, S_{received}\}, \text{ namely the Send-}$ ing State Ssending, the Pending State Spending and the Received State $S_{received}$. In a transaction process, the TB_{send} is constructed and broadcasted by the sender. At this time, the state of the TB_{send} is $S_{sending}$. After all nodes are received (or the consensus is completed), the state becomes $S_{pending}$. When the receiver is online, the currency assets or data assets will be received according to TB_{send} , the corresponding $TB_{receive}$ or TB_{deal} is constructed, and the TB_{send} 's state becomes $S_{received}$, and the entire transaction process is completed.



FIGURE 2. Anatomy of transaction blocks.

The Creating Transaction Block TB_{create} is used to create user accounts, including creating normal accounts and consensus accounts. The initial *DLTs* of an account come from system allocation or currency transferred from other accounts. $TB_{create} = (H_{PRE}, H_{source}, H_{account}, PoW, Sig)$, where H_{PRE} represents the hash value of the previous transaction block, here is the hash value of the Genesis Header; H_{source} indicates the account address of sender; $H_{account}$ stands for the account address which created this transaction (the public key); *PoW* means the proof of work required to generate this transaction block; *Sig* records the signature of this transaction block with the account's private key.

Sending and Receiving Transaction Block TB_{send} , $TB_{receive}$ and TB_{deal} are used to send or receive currency assets or data assets. The Sending Transaction Block $TB_{send} = (H_{PRE}, H_{owner}, H_{dfp}, Dsp, Value, Token, FP, PoW, Sig)$, where H_{owner} represents the address of the account receiving the block; H_{dfp} is a digital fingerprint of the data; Dsp briefly describes the sending data asset; Value stands

for the price of the data; *Token* represents the amount of currency sent; If only *Token* and no *Value* is in TB_{send} , it just means the transfer of currency. The $TB_{receive} = (H_{PRE}, H_{source}, PoW, Sig)$, where H_{source} indicates the hash value of the corresponding TB_{send} . If *Value* is included in TB_{send} , it indicates the transfer of data assets. The $TB_{deal} = (H_{PRE}, H_{source}, H_{RBMerkle}, Work, Sig)$, where $H_{RBMerkle}$ stores the root of D-Tree of the Account-DAG. When $< TB_{send}, TB_{receive} >$ and $< TB_{send}, TB_{deal} >$ appear in pairs, it indicates that the transfer of currency assets or data assets has been confirmed by the system. The TB_{data} is the representation of TB_{deal} on the D-Tree of the Account-DAG. The TB_{data} is denoted as $TB_{data} = (H_{source}, H_{auth}, PoW, Sig)$, where H_{source} represents the hash value of the corresponding TB_{deal} and H_{auth} is the hash value of the TB_{auth}.

Authorization Transaction Block TB_{auth} is used by the account to determine which account has the access control of the data assets. The Authorization Transaction Block, $TB_{auth} = (H_{PRE}, H_{source}, H_{RBMerkle}, Pld, FP, Pow, Sig)$, where *Pld* records the list of access permission generated by the account through a mixed cryptogram arithmetic (see Section V for details). It is worth noting that these transactions are sent and received from the same account.

Delegating Transaction Block $TB_{delegate}$ is used to assign a consensus node to wield voting power on its behalf. $TB_{delegate}$ is denoted as $TB_{delegate} = (H_{PRE}, H_{DLG}, PoW, Sig)$, where H_{DLG} represents the public key of the delegate node. It is worth noting that $TB_{delegate}$ only indicates that the node is delegated to wield voting power, and the actual currency assets in the account are not transferred.

4) DIGITAL ASSERT

Digital assets are assets in the form of electronic data which are owned or controlled by enterprises, organizations or individuals and are held for sale or in production [27]. In the proposed system, the digital assets are categorized as Currency Asset (CA) and Data Asset (DA), where CA is the token issued by the system, denoted as *DLT*, which is consumed as the equivalent in the process of data transfer and is an important part of data tokenization and a representation of data value. DA is the result of data tokenization. By assembling the raw data and storing it in a distributed database, and protecting the corresponding data fingerprint on the chain, the raw data is tokenized as on-chain assets for sale and transaction.

5) DLATTICE

As shown in Fig. 3(a), DLattice is a DAG structure called Node-DAG, which consists of a Genesis Header and the Account-DAG of accounts. All accounts are organized in the form of Merkle Patricia Tree (MPT) [28] by the Genesis Header. The public key of the consensus account is used as the Key, and the hash value of TB_{create} which is created as an Account Root Block (ARB) is used as the Value to jointly build the MPT. The Account-DAG structure of each account is derived sequentially from its ARB, and



FIGURE 3. (a) Overall structure of Node-DAG; (b) Anatomy of Account-DAG. An older Red-Black Merkle Tree is on the left. After receiving a new DA (hash 0x23), the newer Red-Black Merkle Tree is on the right. And the *TB*_{deal} records the Red-Black Merkle Tree root before updating.

is composed of the Token-Chain (T-Chain) and the Data-Tree (D-Tree). The income and expenditure records of the data asset and the currency asset, which are sent by the account, is recorded by T-Chain in the form of a unidirectional chain.

D-Tree is a Red-Black Merkle Tree [29] combining with T-Chain, which stores the digital fingerprint of the data asset and corresponding access control permissions, as shown in Fig. 3(b). The digital fingerprint of the data in TB_{send} is taken as the Key, while TB_{data} is used as the node to jointly build the Red-Black Tree. The Merkle Root of the Red-Black Tree is recorded in $H_{RBMerkle}$ of TB_{deal} . The complete DLattice structure is formed by the Account-DAG of all accounts.

B. ASSUMPTIONS

Assumption 1: DLattice makes standard cryptographic assumptions such as public-key signatures and hash functions.

Assumption 2:DLattice assumes that honest users run bugfree software and the fraction of money held by honest users is above some threshold h(a constant greater than 2/3), but that an adversary can participate in DLattice and own some money.

Assumption 3: DLattice makes a "strong synchrony" assumption: most honest users can send messages that will be received by most other honest users within a known time bound δ_{term} . And this assumption does not allow network partitions.

Assumption 4:DLattice also makes a "weak synchrony" assumption: the network can be asynchronous for a long but bounded period of time. After an asynchrony period, the network must be strongly synchronous for a reasonably long period again.

Assumption 5:DLattice assumes that if some probability p is negligible, it means it happens with probability at most $O(1/2^{\lambda})$ for some security parameter λ . Similarly, if some event happens with high probability, it happens with probability of at least $1 - O(1/2^{\lambda})$.

C. NOTIONS

Through this paper, we use these notions as shown in Table 1.

TABLE 1. Notions and detailed description.

Notions	Meaning
λ	Security parameters;
h	Threshold of DLTs held by honest users in total DLT;
N	Number of consensus nodes in the current system;
$\delta_{\scriptscriptstyle term}$	A certain time that the messages sent by most honest
	users (e.g., 95%) can be received by most other honest
	users;
$\delta_{{}_{MaxTerm}}$	Maximum term in a consensus process;
$C_{\scriptscriptstyle B}$	Amount of boot nodes;
C_E	Expected size of a consensus committee;
C_P	Actual size of a consensus committee;
$Committee_{seed}$	A consensus committee consisting of consensus identities;
$Epoch_{\scriptscriptstyle Node}$	Epoch of system development. Epoch _{Node} includes the
	Boot Epoch $E_{Booting}$ and the Freedom Epoch $E_{Freedom}$;
$ au_{good}$	Threshold of the honest identity in the total identity,
	including τ_{good}^{boot} in the Boot Epoch and $\tau_{good}^{freedom}$ in the
	Freedom Epoch;
Phase _{Consensus}	Phase of consensus algorithm. <i>Phase</i> _{consensus} includes the
	Vote Phase P_{vote} and the Commit Phase P_{commit} ;
M_{type}	Message types. M_{type} includes Vote Messages M_{vote}
	and Commit Messages M_{commit} .

V. DATA TOKENIZATION

A. DATA ASSEMBLING

Data assembling is to assemble the raw data D_{raw} into a data structure that can be used by DLattice at the generation source of data. This data structure is denoted as, $D = (Pk_P, Pk_O, E_K(D_{raw}), E_{EK}, T, Sig_{SK}(D_{raw}))$, where Pk_P represents the public key of data producer; Pk_O represents the public key of data owner; the source of D_{raw} are rich and varied: it can be the continuous data generated by the device in Internet of Things, or a digital file, or a medical file, or recorded data generated between people's communication (e.g. cases, prescriptions between doctors and patients etc.). The types of D_{raw} include: binary stream (images, documents, videos, etc.), URL, etc. $E_K(D_{raw})$ indicates that the data producer uses a random AES key to symmetrically

encrypt the raw data, and the AES key is asymmetrically encrypted with the Pk_O of data owner and is stored in E_{EK} . Only the data owner who owns the corresponding private key Sk_O can decrypt the ciphertext to obtain D_{raw} . $Sig_{SK}(D_{raw})$ indicates that the data producer uses its private key Sk_P to sign D_{raw} , the signature can be verified only by the Pk_P of the data producer. T represents the timestamp of the data generation. The data structure D can be stored in a distributed database (IPFS [30] currently) to obtain a digital fingerprint. The digital fingerprint is stored in the H_{dfp} of TB_{send} .

B. DATA AUTHORIZTION

If the data owner wants to authorize the data to other accounts for access, the public key Pk_{other} is needed for asymmetrical encryption of $\langle key, iv \rangle$. As shown in (1), edk_k is stored in the *Pld* of the TB_{auth} . If the user obtains edk_k from the *Pld* of the TB_{auth} , and acquires the symmetric encryption key by using his private key Sk_{other} and (2), the data can be decrypted by using (3), thereby realizing the access control of the data asset by using the hybrid encryption mechanism.

$$edk_k \leftarrow E_{ECC}(\langle key, iv \rangle || Pk_{other})$$
 (1)

$$\langle key, iv \rangle \leftarrow D_{ECC}(edk_k || Sk_{other})$$
 (2)

$$D_{raw} \leftarrow D_{AES}(Cipher|| < key, iv >)$$
 (3)

C. DATA ANCHORING

Data anchoring is to anchor the digital fingerprint of data assets on the blockchain after data assets in distributed storage. Data anchoring is the core of data tokenization. The digital fingerprint obtained from data storage is used to construct a TB_{send} and it will be broadcasted to the entire network. Once TB_{send} is received by all the consensus nodes in the system, it will be added to the T-Chain of the corresponding account. If there is a fork, it may be appended after the consensus is reached (see Section VI for details). When the receiver is online, the data asset is checked first to see whether the demands of the receiving account are met, and then the TB_{deal} (the current Red-Black Merkle Tree Root is saved in $H_{RBMerkle}$) will be created to receive the digital asset and pay. Finally, the TB_{data} is created, and the Red-Black Merkle Tree is updated on its D-Tree to complete the transfer of data assets.

VI. DPoS-BA-DAG(PANDA)

A. NODE BOOTSTRAPPING

The development of system is divided into the Boot Epoch and the Freedom Epoch as the number of consensus nodes increases, denoted as $\sigma(Epoch_{node}) \in (E_{boot}, E_{freedom})$. In the initial Boot Epoch, the Genesis node reviews the online and storage capabilities of the new nodes (these nodes may be trusted large medical institutions, companies or government research institutions, etc., which are endorsed by their social credibility), and assigns certain initial DLT_{init} to the consensus account of these nodes to complete the joining of the boot node. The committee consisting of boot nodes is called *BootCommittee*, and its size is [4, *C*_B]. The nodes less than the threshold τ_{good}^{boot} are allowed to be accidentally offline, and the DLT_{total} satisfies:

$$DLT_{total} = C_B \times DLT_{init},$$

where C_B represents the amount of boot nodes. In the Boot Epoch, each node knows the exact number of nodes in the current system. When the allocation of DLT_{total} is completed (the amount of nodes $N > C_B$ at this moment), the system enters the Freedom Epoch, and the newly joined nodes can be added to the system at will by purchasing DLT from other accounts in the system. It is noteworthy that common users can create a normal account at any time by purchasing DLT from a node that has joined the system.

B. FORK OBSERVATION

It can be seen from Definition 3 that in DLattice, the transaction block *TB* can only be constructed by the sender, so it is impossible to be forged by a third party, which means that a malicious account can generate a fork by constructing different *TB*_{send}s with an identical previous hash H_{PRE} on its own T-Chain.

Assume that an account has constructed multiple transaction blocks with identical H_{PRE} , as shown in Fig. 4, recorded as $List_{TB} = \{TB_{send}, TB'_{send}, TB''_{send},\}$, and broadcasted them to the entire network. A node will observe a set $\{TB_{send}, ..., TB'_{send}\}$ with identical H_{PRE} , thus forming a fork. Because T-Chain is a unidirectional chain, it is necessary for all nodes in the network to pick a certain TBfrom $List_{TB}$ and add it to its Account-DAG by the consensus algorithm.



FIGURE 4. A fork occurs when two (or more) signed transaction blocks reference the same previous block. Older transaction blocks are on the left; newer blocks are on the right.

If a node not observe any forks, the *TB* will be added to Account-DAG directly. When a fork is observed by a node (the node is called a Candidate Consensus Node, denoted as *Candidate_{seed}*, where *seed* is the corresponding H_{PRE}), due to the incentive of Fork Penalty, the *Candidate_{seed}* who wants to get Fork Penalty will actively participate in the consensus following these steps in Fig. 5.



FIGURE 5. Flow chart of PANDA consensus

C. CONSENSUS IDENTITY SETUP

When a fork is observed, each *Candidate_{seed}* begins to calculate its own consensus identities and participate in the consensus to resolve this fork.

In the E_{boot} , each *Candidate_{seed}* has a unique consensus identity:

$$ID_{seed} \leftarrow < Pk, Seed, hash, proof, message, Sig_{sk} >$$

at each phase of each term of the consensus. The generation of *hash,proof* and *message* will be detailed in Part D.

In the $E_{freedom}$, the hash value:

 $hash \leq w_i/W$

that satisfies the PoS condition is calculated locally and secretly by *Candidate_{seed}* to constitutes a consensus identity:

$$ID_{seed} \leftarrow < Pk, Seed, ID_{pos} < hash >, Sig_{sk} >,$$

together with the information such as its public key to participate in this consensus. It is worth noting that nodes are able to generate multiple identities in local secretly for consensus at each phase of the consensus based on their voting power in the $E_{freedom}$. Where w_i is the sum of the voting power the node holds and represents; W is the total voting power. These parameters together determine the computational difficulty of the consensus identity. It can be obtained from Lemma 1 that the larger the voting power of the node, the more consensus identities will be generated in the same number of attempts, as well as the greater the probability of obtaining Fork Penalty.

D. COMMITTEE FORMATION

The *Candidate_{seed}* secretly generates the consensus identity in local, and the consensus committee that resolves this fork is also formed at the same time. The consensus committee is denoted as *Committee_{seed}*. In the *E_{boot}*, each *Candidate_{seed}* generates a unique consensus identity to participate in *Committee_{seed}*. In the *E_{freedom}*, each *Candidate_{seed}* generates multiple consensus identities secretly and locally based on its voting power to form a *Committee_{seed}*, as shown in Algorithm 1. And the *Committee_{seed}* at the *P_{vote}* and *P_{commit}* are different, denoted as *Committee_{seed}(vote)* and *Committee_{seed}(commit)* respectively.

The ConsensusIDGeneration() (Algorithm 1) is used to generate the consensus identity at the phase $P_{consensus}$ in e term. According to Lemma 2, each node calculates the consensus identity for C_E times secretly and locally based on its voting power. If the identity conforms to the PoS condition, it can vote in the corresponding consensus phase.

The Verifiable Random Function (VRF) [31] is used to calculate a hash value secretly and locally, and the consensus identity that satisfies the PoS condition is calculated according to the hash value. The identity satisfies that each node can only calculate its own consensus identity instead of being calculated in advance by other nodes, while other nodes can verify the identity only after being broadcasted.

Algorithm 1 ConsensusIDGeneration(): Generation of Consensus Identity

Inpu	t: ctx, Seed, P _{consensus}
1: i	if <i>ctx</i> . <i>E</i> _{boot} then
2:	$< hash, proof > \leftarrow VRF_{Sk}(Seed P_{consensus} e)$
3:	$ID_{seed} \leftarrow < Pk, Seed, hash, proof, Sig_{sk} >$
4:	if $e \% \delta_{MaxTerm} == 1$ then
5:	$ctx.List_{ID}[Seed][e][P_{consensus}].$
	$append(ID_{seed})$
6: 0	else if ctx.E _{freedom}
7:	for $index = 0$; $index < ctx.C_E$; $index + +$
8:	$< hash, proof > \leftarrow VRF_{Sk}$
	$(Seed P_{consensus} e index)$
9:	message \leftarrow < Seed, $P_{consensus}$, e, index >
10:	$ID_{pos} \leftarrow < hash, proof, message >$
11:	$ID_{seed} \leftarrow < Pk, Seed, ID_{pos}, Sig_{sk} >$
12:	if $e \% \delta_{MaxTerm} == 1$
	&&hash $\leq ctx.w_i/ctx.W$ then
13:	$ctx.List_{ID}[Seed][e][P_{consensus}].$
	$append(ID_{seed})$
14:	end for
15:	end if

In order to simplify the expression, in this paper, the private key Sk_i and the public key Pk_i of each consensus account $ConAC_i$, the sum of the voting power w_i the node owns and represents, the total voting power W of the system, and other information such as system configuration are collectively referred to as the context information of $ConAC_i$, denoted as ctx.

The VerifyID() (Algorithm 2) is used to verify whether the consensus identity ID_{seed} is in consensus committee $Committee_{seed(P_{consensus})}$ at the phase $P_{consensus}$.

Algorithm 2 VerifyID(): Verifying A Consensus Identity Whether in the Consensus Committee

Input: ID _{seed} , P _{consensus}
Output:TrueorFalse
1: $\langle Pk, Seed, ID_{pos}, Sig \rangle \leftarrow \text{ProcessID}(ID_{seed})$
2: $\langle hash, proof, message \rangle \leftarrow ID_{pos}$
3: $< P_{consensus}, e, index > \leftarrow message$
4: if !VerifySignature(<i>Pk</i> , <i>Sig</i>) then return False
5: if ctx.E _{boot} then
6: if \neg <i>VerifyVRF</i> _{Pk} (hash, proof,
$Seed P_{consensus} e$) then
7: return True
8: else if <i>ctx</i> . <i>E</i> _{freedom}
9: if \neg <i>VerifyVRF</i> _{Pk} (<i>hash</i> , <i>proof</i> ,
$Seed P_{consensus} e index)$
10: $\&\&(hash \le ctx.w_i/ctx.W)$ then
11: returnTrue
12: end if
13: return Flase

E. CONSENSUS

At the same time as the formation of the consensus committee, the consensus begins accordingly. The consensus is divided into two phases $\sigma(Phase_{consensus}) \in (P_{vote}, P_{commit})$. At the P_{vote} , the selected members of *Committeeseed(vote)* shall select a TB to vote, and all consensus nodes collect the vote results. At the P_{commit} , the members of committees Committeeseed(commit) will start the commit voting based on the collected vote results, and all nodes collect the commit voting results. If a node counts commit voting results exceeds the threshold τ_{good} , the consensus is reached on this node.

In a strongly synchronous network, it is optimal to reach a consensus within the time of $2 \times \delta_{term}$. The message propagation complexity is $o(C_P^2)$, where C_P is the actual size of the consensus committee. It is worth noting that in the E_{boot} , each node has a unique identity for consensus, $C_P = C_B$; however in the $E_{freedom}$, each node has multiple consensus identities based on its voting power, and these consensus identities of the node are combined and then broadcasted. At this time, $C_P \approx C_E$.

In a weakly synchronous network environment, if the member of *Committeeseed(vote)* does not receive enough votes, the Committeeseed(vote) continues to vote, as shown in Algorithm (3, 4, 5), and a consensus can be reached according to Lemma 3 and 4. If the consensus has not yet been reached in the limited term $\delta_{MaxTerm}$, it will be suspended. After a certain period of time, the consensus will restart. When the strong synchrony comes, the reaching consensus can be guaranteed.

Algori	thm 3 PANDA_CONSENSUS()
Inpu	it: ctx, Seed
Outj	put: M_{type}, e, H_{TB}
1:	$e \leftarrow 1; H_{selected_TB} \leftarrow Empty; H_{TB}$
	$\leftarrow Empty; List_{TB} \leftarrow \{\}$
2:	while $e \leq \delta_{MaxTerm}$ do
3:	$List_{TB} \leftarrow CollectTBlocks(H_{PRE})$
4:	$H_{selected_TB} \leftarrow \text{ForkSelection}(ctx, List_{TB})$
5:	CommitteeMsg(ctx , H_{PRE} , $H_{selected_TB}$, P_{vote} , e)
6:	$H_{TB} \leftarrow \text{CountMsg}(ctx, H_{PRE}, P_{vote})$
7:	if $H_{selected_TB} == H_{TB}$ then
8:	CommitteeMsg(ctx , H_{PRE} , H_{TB} , P_{commit} , e)
9:	$H_{TB} \leftarrow \text{CountMsg}(ctx, H_{PRE}, P_{commit})$
10:	if TIMEOUT $\neq H_{TB}$ then
11.	COMMIT II

11	l:	return	<	COMMIT	', e,	H_{TB}	>
----	----	--------	---	--------	-------	----------	---

12: e + +

13: end while

The consensus node monitors the presence of the Spy identity (definition in section B of part VII) during the counting process, and Evd will be collected and broadcasted to the entire networks as soon as the Spy identity is discovered (e.g. an identity ID_i discovers that an identity ID_i has voted for both H_a and H_b in a certain term of the consensus voting, then the evidence $Evd < Pk_i, Pk_j, \{H_a, Sig_a\}, \{H_b, Sig_b\}, Sig >$ will be saved and broadcasted). Upon the knowledge and

verification of other nodes, the node corresponding to the Spy identity is blacklisted, and the voting of the blacklisted node is ignored in the following consensus. The consensus deposit of the node is deducted at the end of the consensus. Therefore, the best choice for a malicious node is to select only one TB to vote, and try to delay the consensus time as much as possible, or not to vote at all.

The CommitteeMsg() (Algorithm 4) is the algorithm used by members of the Committeeseed to send messages. The type of the sent message $\sigma(M_{type})$ is divided into (M_{vote}, M_{commit}) according to the phase in which the consensus is located, where M_{vote} is the message used by the phase P_{vote} to vote for the selected TB, while M_{commit} is the message used by the phase P_{commit} to commit the TB based on the collected vote results.

Algorithm 4 CommitteeMsg(): Broadcasting Messages by **Committee Members**

Input: ctx, Seed, H_{TB}, P_{consensus}, e 1: $M_{type} = GetMsgType(P_{consensus})$ 2: $index = e/\delta_{MaxTerm} + 1$ **if** $List_{ID_{seed}} \leftarrow ctx.List_{ID}[Seed][P_{consensus}][index]$ 3: 4: !isEmpty(*List*_{IDseed}) **then** 5: SendMsg(*M*_{type}, *H*_{TB}, *List*_{ID_{seed}, *Sig*_{ctx.sk})} 6: end if

The CountMsg() (Algorithm 5) is used by the consensus nodes to collect and count the number of messages. If the received message amount exceeds the threshold τ_{good} , the hash of the corresponding transaction block and its term are returned; if the threshold is not exceeded within δ_{term} , TIMEOUT is returned.

Algorithm 5 CountMsg(): Counting Messages
Input: ctx, Seed, M _{type}
Output: <i>H</i> _{TB} or <i>TIMEOUT</i>
1: <i>start</i> \leftarrow Time(); <i>counts</i> \leftarrow {}; <i>voters</i> \leftarrow {}
2: $msgs \leftarrow CollectGobalMsgs(M_{type}).iterator()$
3: while <i>True</i> do
4: if Time() > <i>start</i> + <i>ctx</i> . δ_{Term} then TIMEOUT
5: $m \leftarrow msgs.next()$
6: $P_{consensus} \leftarrow \text{GetPhase}(M_{type})$
7: $\langle ID_{seed}, H_{TB} \rangle \leftarrow \operatorname{ProcessMsg}(m)$
8: if !VerifyID(<i>ID</i> _{seed} , <i>P</i> _{consensus}) then continue
9: if $ID_{seed} \in voters[ID_{seed}.e][M_{type}]$ then continue
10: $counts[ID_{seed}.e][M_{type}][H_{TB}] + +$
11: if counts[$ID_{seed}.e$][M_{type}][H_{TB}] $\geq \tau_{good}$ then
12: return H_{TB}
13 end while

VII. ATTACK VECTORS AND SECURITY ANALYSIS

A. ATTACK VECTORS

1) DOUBLE SPENDING ATTACK

Double-spending is the core problem faced by any cryptocurrency, where an adversary holding \$1 gives his \$1 to two

TABLE 2. Potential problems in each step of PANDA protocol and the corresponding lemmas which resolve them.

Step	Potential problems	Lemma
Identity Setup	Too many malicious identities	Lem.1
Committee Formation	Bias the committee distribution	Lem.2
Consensus	Cannot reach consensus	Lem.3,4

different users [15]. DLattice prevents double-spending by Fork Penalty and PANDA consensus.

First, each transaction block *TB* is required to reserve the Fork Penalty (FP) at their creation. When the fork occurs, the honest node selects a *TB* from the fork set, and then resolves the fork on the basis of PANDA consensus. All participating identities in the consensus have the opportunity to obtain the FP of the *TB*. The algorithm for allocation of fork penalty is shown as Algorithm 6. It is worth mentioning that the FP will be obtained only if the XOR distance between the consensus identity ID_{seed} and the previous hash H_{PRE} is less than the threshold $\tau_{penalty}$, so the more *DLT* the consensus account holds, the greater probability to obtain the penalty.

Algorithm 6 ForkPenaltyAllocationCheck(): Allocation of Fork Penalty

Input: ctx, Seed, e **Output:** True or False 1: $flag \leftarrow False$ 2: $List_{IDseed} \leftarrow ctx.List_{ID}[Seed][e]$ 3: **for** i = 0; $i < Len(List_{IDseed})$; i + +4: $dist = List_{IDseed}[i] \oplus Seed$ 5: **if** $dist \le ctx.\tau_{penalty}$ **then** $flag \leftarrow$ True 6: **end for** 7: **reture** flag

2) SYBIL ATTACK

If there is no trusted public key infrastructure in a system, a malicious node can simulate many virtual nodes, thereby creating a large set of sybils. An entity could create hundreds of nodes on a single machine [32].

However, since the identities of these nodes in consensus process are created in proportion to their account balances, adding extra nodes into the network will not gain an attacker extra vote. Therefore, sybil attack will bring no advantage.

3) DDOS ATTACK

A distributed denial-of-service (DDoS) attack is a malicious attempt to disrupt normal traffic of a targeted server, service or network by overwhelming the target or its surrounding infrastructure with a flood of Internet traffic [33].

According to the previous analysis, in a strongly synchronous network, the consensus is reached within the first term. At this time, the member of $Committee_{seed(vote)}$ and $Committee_{seed(commit)}$ at the consensus phase are noninteractively selected based on VRF, which has a posteriority to prevent DDoS attacks and collusion among committee members. If the consensus is not reached in first term (possibly due to the randomness of generation of the committee or a weakly synchronous network environment), the *Committee*_{seed}(vote) may indeed suffer DDoS attacks due to exposure. However, first, the attack will not affect other consensus committee to resolve other forks. Second, the development of the entire system will not be affected because only the consensus committee resolving the fork generated by malicious users will suffer from DDoS attack. Finally, thanks to the existence of the FP, committee members who have suffered DDoS attacks will eliminate the DDoS attack as soon as possible to reach consensus, so as to obtain rewards.

4) FLUCTUATION OF NODES

Generally, the amount of consensus nodes will show a trend of growth over time, as shown by the green line in Fig. 6. Before the time t_1 , the system is in the E_{boot} , each *Candidate_{seed}* only has a consensus identity; when the time is at t_2 , the system enters the $E_{freedom}$ from the E_{boot} , each *Candidate_{seed}* may have multiple consensus identities; but when the time reaches t_3 (on the blue curve), and the nodes in the system have less than C_B for various reasons, the system is still in the $E_{freedom}$ (and it will not go back to the E_{boot}). If the remaining active honest nodes still have the voting power of h, although the actual amount of nodes is less than the size C_B of the *BootCommittee*, the actual amount of generated identities C_P still satisfy $C_E \approx C_P$. According to Lemma 2, at most $C_P/3-1$ consensus identities are controlled by the Byzantine node, so that an effective consensus can still be reached.



FIGURE 6. Schematic diagram of fluctuation of Nodes.

B. SECURITY ANALYSIS

In this section, we provide security analysis for how DLattice prevents potential threats and works securely based on several assumptions clarified in Section IV. We also discuss how the byzantine adversary gains no significant advantage.

Definition Spy. If the behavior of an identity is dishonest and is discovered, we call this identity a Spy, and we can obtain evidence based on dishonest behavior, which we callEvd, like voting for H_a at the same time as voting for H_b at the phase P_{vote} , or other behaviors like that.

Definition Ballot. If a node receives at least τ_{good} votes at the phase P_{vote} , we call it the observation of a Ballot. And the node can only vote or commit this Ballot at the phase P_{vote} or P_{commit} in the later term [34].

Lemma 1 (Consensus Identity Generation): In the Consensus Identity Setup phase of the $E_{freedom}$, each consensus identity is generated based on the voting power held by the node. The generation of consensus identity and the number of calculating attempts obey the exponential distribution.

Proof: Assume that β indicates the number of attempts required to generate a consensus identity; θ indicates the probability of generating a consensus identity at one attempt. The probability of generating a legal consensus identity within β attempts is:

$$P\{x \le \beta\} = 1 - P\{x > \beta\} = 1 - (1 - \theta)^{\beta}$$

 $= 1 - e^{\beta \log(1-\theta)}.$

Considering $\theta \ll 1$ (in general), thus $\log(1 - \theta) \approx -\theta$, and we can achieve:

$$P\{x \le \beta\} \approx 1 - e^{-\theta\beta}.$$

Therefore, the consensus identity generation and the required number of attempts obey the exponential distribution. If we set $\theta = w_i/W$, where w_i refers to the voting power of the node, Wrefers to the total voting power, then:

$$P\{x \le \beta\} = 1 - e^{-\frac{w_i\beta}{W}}.$$

When the total voting power W = 12000 and the voting power of two consensus nodes are $w_i = 10$ and $w_j = 20$ respectively, the probability of generating a legal consensus identity in the $\beta = 400$ calculations is shown in Fig. 7. It's shown in the figure that when β is a fixed value, the greater the voting power, the greater the probability of generating a legal identity.



FIGURE 7. Generation of consensus identities and the number of attempts obey an exponential probability distribution, where the orange curve represents $w_i = 20DLT$, and blue curve illustrates $w_i = 10DLT$.

Lemma 2 (Number of Consensus Identities): In the Committee Formation phase of the $E_{freedom}$, the candidate consensus nodes generate consensus identities based on their voting power and establish a consensus committee *Committee*_{seed(Pconsensus)}. The system guarantees that no multiple consensus will be reached in the consensus committee.

Proof Sketch: According to Lemma 1, the candidate consensus nodes generate consensus identities base on their voting power. The probability of a consensus account owned

voting power w_i generating k consensus identities within β calculations is:

$$P\{x=k\} = {\beta \choose k} \left(\frac{w_i}{W}\right)^k \left(1 - \frac{w_i}{W}\right)^{\beta-k}.$$

The expectation is $E = \beta w_i/W$. According to Assumption 3, the *DLT*_{good} held by honest node and *DLT*_{total} of the systems always satisfy:

$$h = DLT_{good} / DLT_{total}$$
.

If the total voting power is $W = DLT_{total}$, the voting power of the honest nodes is $w_{honest} = DLT_{good}$, the voting power of the malicious nodes is $w_{adversary} = DLT_{bad}$. The consensus identity expectation generated by the honest nodes is $E_{bad} = \beta w_{adversary}/W$, the consensus identity expectation generated by the malicious nodes is $E_{bad} = \beta w_{adversary}/W$, so the consensus identity that the system expects to generate is $C_E \approx \beta$, and the honest identity accounts for about *h* of the total.

Assume that the maximum and minimum identities generated by consensus nodes, the honest nodes and the malicious nodes are all_{max} , all_{min} , h_{max} , h_{min} , a_{max} and a_{min} respectively. We can list equations as follows:

$$P_{unit} = \frac{1}{W}, P_{honest} = w_{honest} \times P_{unit}, P_{adversary}$$

$$= w_{adversary} \times P_{unit}$$

$$P\{x < h_{max}\} = \sum_{k=0}^{h_{max}} {\binom{\beta/P_{honest}}{k}}$$

$$P\{x < a_{max}\} = \sum_{k=0}^{a_{max}} {\binom{\beta/P_{adversary}}{k}}$$

$$P\{x < a_{max}\} = \sum_{k=0}^{a_{max}} {\binom{\beta/P_{adversary}-k}{k}}$$

$$P\{x < all_{max}\} = \sum_{k=0}^{all_{max}} {\binom{\beta/P_{unit}}{k}}$$

$$P\{x < all_{max}\} = \sum_{k=0}^{all_{max}} {\binom{\beta/P_{unit}-k}{k}}$$

$$P\{h_{min} < x \le \beta/P_{honest}\} = \sum_{k=h_{min}}^{\beta/P_{honest}-k} {\binom{\beta/P_{honest}}{k}}$$

$$P\{a_{min} < x \le \beta/P_{adversary}\} = \sum_{k=a_{min}}^{\beta/P_{adversary}-k} {\binom{\beta/P_{adversary}}{k}}$$

$$P\{a_{min} < x \le \beta/P_{unit})^{\beta/P_{unit}-k}$$

$$P\{a_{min} < x \le \beta/P_{unit})^{\beta/P_{adversary}-k}$$

$$P\{all_{min} < x \le \beta/P_{unit}\} = \sum_{k=a_{min}}^{\beta/P_{unit}} {\binom{\beta/P_{unit}}{k}}$$

And then we set:

$$\begin{cases} P\{x < h_{\max}\} \ge 1 - 2^{-\lambda} \\ P\{x < h_{\min}\} \ge 1 - 2^{-\lambda} \\ P\{h_{\min} < x \le \beta\} \ge 1 - 2^{-\lambda} \\ P\{a_{\min} < x \le \beta\} \ge 1 - 2^{-\lambda} \\ P\{a_{\min} < x \le \beta\} \ge 1 - 2^{-\lambda} \\ P\{x < all_{\max}\} \ge 1 - 2^{-\lambda} \\ P\{all_{\min} < x \le \beta/P_{unit}\} \ge 1 - 2^{-\lambda} \end{cases}$$



FIGURE 8. The maximum and minimum number of all identities *all*, honest identities *h*, and malicious identities *a* that the system may generate with different security parameters.

Figure 8. The maximum and minimum number of all identities all, honest identities h, and malicious identities a that the system may generate with different security parameters.

When β is equal to 100, 200, 300, 400 and 500, respectively, the calculation results of different security parameters λ are shown in Fig. 8. At the same time, the relationship between *all*_{max}, *h*_{min} and *a*_{max} should be satisfied as follows:

$$\begin{cases} ID_{good} > 2 \times a_{\max} \\ ID_{good} \le h_{\min} \\ 2 \times ID_{good} > all_{\max} \end{cases}$$

The system requires at least ID_{good} honest identities to avoid multiple consensus results being reached during the consensus process. The value of ID_{good} depends on the security parameters. When the security parameter is $\lambda = 20$, the most ideal result is $\beta = 500$ and $ID_{good} = 306$; when $\lambda = 15$, the result is $\beta = 400$ and $ID_{good} = 250$; when $\lambda = 10$, $\beta = 200$ and $ID_{good} = 123$. The values above ensure that no multiple consensus results will be reached at the phase P_{commit} .

Lemma 3 (Proof of Safety): In the consensus process, if the consensus identities reach a consensus on a TB_{send} in the fork set $\{TB_{send}, ..., TB'_{send}\}$, no consensus will be reached on the other TB'_{send} .

Proof: C_P represents the actual size of the consensus committee; X indicates the number of honest identities that have committed TB_{send} in the *e* term, while $1 \le X \le ID_{good}$; at the phase P_{vote} in the e+1 term, X honest identities have to continue to vote as same as in the *e* term due to the existence of *Ballot*; Y stands for the number of malicious identity which can do anything, and $Y < ID_{good}/2$; Z indicates the number of remaining identities. And these parameters satisfy $X + Y + Z = C_P$; Z_0 indicates the number of identities in the remaining identities that have voted at the phase P_{vote} in term e;

 $Z - Z_0$ indicates the number of identities that have not yet voted;

Once X identities have committed TB_{send} , the remaining Y + Z identities will not reach a consensus on the TB'_{send} , that is, to prove:

$$Y + Z - Z_0 < ID_{good}$$
.

We can prove it by contradiction, assume that:

$$Y + Z - Z_0 \ge ID_{good} \Rightarrow Y + Z - Z_0 + X \ge ID_{good} + X$$
$$\Rightarrow C_P - Z_0 \ge ID_{good} + X \Rightarrow X + Z_0 \le C_P - ID_{good}.$$

 $\Rightarrow CP - Z_0 \ge ID_{good} + X \Rightarrow X + Z_0 \ge CP - ID_{good}.$ Since $C_P = Y + ID_{good} < 3 \times ID_{good}/2$, then $X + Z_0 < ID_{good}/2$.

Assume that all malicious identities have voted on the TB_{send} in the term e, $X + Y + Z_0 > ID_{good}$, also because $Y < ID_{good}/2$, then $X+Z_0 > ID_{good}/2$, which is inconsistent with the assumption; if some malicious identities Y' have voted on the TB_{send} in the term e, $X + Y' + Z_0 \ge ID_{good}$, also because $Y' < Y < ID_{good}/2$, so $X + Z_0 > ID_{good}/2$, which is also inconsistent with the assumption.

Lemma 4 (Proof of Liveness): In the consensus phase, if a consensus identity is locked on *Ballot* of a *TB* in the *e* term, when term e' > e, if the node find a new *Ballot'*, and the *Ballot* in the *e* term is unlocked while the new *Ballot'* is locked, thus ensuring the continuation of the consensus.

Proof Sketch: In the P_{commit} , due to the existence of *Ballot*, some nodes may commit for *Ballot* while the other nodes is committing for *Ballot'*, and the votes from both parties are just equal that led to the failure of reaching a consensus. At the P_{vote} , if the node finds the *Ballot'* of higher term, it indicates that the current system is more inclined to reach a consensus for *Ballot'* of higher term, so the node unlocks the *Ballot* of lower term and locks *Ballot'* of the higher term. And at the P_{commit} , the nodes will commit the new locked *Ballot'*.

VIII. IMPLEMENTATION AND EVALUATION

We implement DLattice and the goals of our evaluation are twofold. We first measure the latency and throughput of DLattice when the network size increases. The second goal is to compare DLattice to other related consensus protocols including Bitcoin, Ethereum and PBFT, etc.

A. IMPLEMENTATION

We implement a prototype of DLattice in Golang [35], consisting of approximately 4000 lines of code. We implement a gossip network by using go-libp2p library (go-libp2ppubsub) [36] where each user selects a small random set of peers to gossip messages to. Elliptic Curve Cryptography (ECC) encryption algorithm is used for asymmetric encryption while the symmetrical algorithm adopts AES algorithm. SHA-256 is a cryptographic hash function for us to calculate hash value. And we use the VRF outlined in Goldberg [37]. The signature algorithm adopts Elliptic Curve Digital Signature Algorithm (ECDSA).



FIGURE 9. Latency to reach consensus using PANDA (a) and PBFT (b) respectively with 50 to 500 consensus nodes. The broken line in (a) represents the number of identities participating in the PANDA consensus.

TABLE 3.	Impleme	ntation	Parameters.
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Parameter	Meaning	Value
λ	Security Parameter	10
h	Weight of the <i>DLT</i> held by the honest node	4/5
	in the total DLT	
DLT_{total}	Total <i>DLT</i> in DLattice	12000
DLT_{init}	Initially allocated amount of DLT per boot	60
	node	
$C_{\scriptscriptstyle B}$	Size of a boot committee	200
$C_{_E}$	Expected size of a consensus committee	200
$ au_{good}^{boot}$	Threshold of the honest identities in total	2/3
	identity in the Boot Epoch	
$ au_{good}^{freedom}$	Number of the honest identities in the Freedom	123
	Epoch	
$\delta_{\scriptscriptstyle term}$	Time of each term	20s

Table 3 shows the parameters in implementation of prototype of DLattice; we mathematically validate these parameters λ , $C_E \tau_{good}^{freedom}$, etc. in Section VII. h = 4/5 means that an adversary would need to control 20% of DLattice's currency in order to create a fork. δ_{term} should be high enough to allow users to receive messages from committee members, but low enough to allow DLattice to make progress if it does not hear from sufficiently many committee members. We conservatively set δ_{term} to 20 seconds.

B. EVALUATION

We run several experiments with different settings on Ali-Cloud ECS servers to measure the latency and throughput of DLattice. We vary the number of consensus nodes in the network from 50 to 500, using up to 25 ECS instances. Each AliCloud ECS instance is shared at most by twenty nodes, and has 4 AliCloud vCPUs and 8 GB of memory.

1) LATENCY

Latency is the amount of time that it takes from the creation of a transaction until the initial confirmation of it being accepted by the network [38]. The latency of Bitcoin and Ethereum is 576.4 seconds (from Block Height 556800 to 556810) [39] and 12 seconds (from Block Height 7002602 to 7002612) [40] respectively in the livenet.

The latency of transaction in DLattice is instantaneous, so we just consider the consensus latency in this section. We implement a consensus algorithm similar to PBFT for Boot Epoch of DLattice. The consensus latency of the algorithm is shown in Figure 9(b), where the consensus latency includes the time to generate consensus identity and time to reach consensus. As the number of consensus nodes increases from 50 to 500, the time continues to rise. Similarly, PANDA is implemented for Freedom Epoch of DLattice. During the experiment, when the number of nodes increases from 50 to 500 and the corresponding voting weight decreases from 240 to 24, the consensus latency is shown in Figure 9(a). As shown in Figure 10(a), since the size of the consensus message of PANDA (about 0.86 kb) is larger than that of PBFT (about 0.4 kb) messages, the latency of PBFT is smaller than that of PANDA when the consensus nodes are less than 250. As the number of nodes increases, the number of identities participating in the consensus in PANDA is oscillating around the expected consensus identities, as shown in the broken line in Figure 9(b), and the consensus identity in PBFT increases with the number of nodes, so the difference between two latency is growing larger. Figure 10(a) shows the comparison among the latency of DLattice with Boot Epoch and Freedom Epoch (PBFT is used when consensus nodes are less than 200 in the Boot Epoch, and PANDA is used when nodes are more than 200 in the Freedom Epoch), the latency of DLattice-PBFT (PBFT only) and that of DLattice-PANDA (PANDA only).



FIGURE 10. (a) Latency to reach consensus in DLattice with 50 to 500 consensus nodes; The blue curve represents DLattice, the red curve represents DLattice-PBFT, and the green curve represents DLattice-PANDA. (b)Throughput of DLattice with 50 to 500 consensus nodes.

TABLE 4.	Comparison bet	ween DLattice a	and existing	blockchain	protocols in	1 academia	and industry.
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	Nakamoto	P	oS	DPoS	BFT	DAG	DLattice
Candidate	Bitcoin [12]	Algorand [15]	Ouroboros [40] Dfinity [46]	EOS [47] BitsShares [48]	IBM Blockchain [49]	Nano [26]	This work
Candidate	Bitcoin-NG [14]		Dinniy [40]	Dissilates [40]	Tendeminit [24]		
Identity-less	Yes √	Ν	lo	No	No	No	Yes √
Bandwidth	Constant√	Constant√		Constant√	$O(n^2)$	Constant√	Constant√
Posteriority	No	Yes √	No	No	No	No	Yes √
Storage-pruned	No	Ν	lo	No	No	Yes √	Yes √

2) THROUGHPUT

One of the end goals of blockchain is to replace the current infrastructure (like financial back-end of many institutions around the world, which handles thousands of transactions per second (TPS)), it will need to scale to meet and/or exceed the TPS to prove its viability. A higher throughput will also open the doors to more interesting and intensive applications of blockchain technology [41]. The Bitcoin network processes up to 3 TPS (from Block Height 556800 to 556810) [39] and Ethereum processes up to 127 TPS (from Block Height 7002602 to 7002612) [40] in the livenet. And Nano claims that it has theoretical 7000 TPS [42], and experimental 756 TPS in the beta network stress test [43].

From the foregoing, transaction block types of DLattice include TB_{send} , $TB_{receive}$, TB_{auth} etc., where $TB_{receive}$ has an average size of about 0.5 kb, and the size of the TB_{auth} varies with the number of authorizations. and average size of TB_{send} is about 0.7 kb. Therefore, during the experiment, the time required to receive 25,000 sending transaction blocks is counted. All numbers are averaged after 10 times. We start with a network of 50 consensus nodes, and then rise to 500 nodes in the last setting. The throughput of DLattice is shown in Figure 10(b). As the number of DLattice nodes deployed per ECS instance increases, the throughput of DLattice is decreasing due to hardware constraints. However, since the sending of transaction block of each account are asynchronous with other accounts so it is unnecessary to wait for miners to pack transactions like traditional blockchains. Although it does not reach 7000 TPS in Nano (Because Nano's block is smaller, and DLattice records more information about data tokenization), it is still close to 1200 TPS when less than four nodes are deployed per ECS instance (However, each computer is likely to deploy only one DLattice node in a real environment). We will further optimize its throughput in the future experiments and practical scenarios.

3) COMPARISON TO RELATED SYSTEMS

The comparison between DLattice and the existing blockchain consensus protocols is shown in Table 4. Compared with the traditional Nakamoto consensus algorithm, the DLattice with PANDA consensus solves the problem of high energy consumption; compared with the traditional BFT consensus, the consensus identity has a posteriority, that is, the randomly elected consensus committee is able to prove its identity without revealing it in advance. In addition, as the number of nodes increases, there is no significant change in network bandwidth consumption. The round-based Algorand lacks economic incentives, and the signature data is large, which has strict requirements on network bandwidth. The chain-based Ouroboros [44] is established in a strong synchrony network and the slot leader has been selected in advance (these drawbacks have been improved by [45]). Inspired by Nano, DLattice builds a Double-DAG architecture that is dedicated to the tokenization of data. Compared with Nano, DLattice slightly sacrifices the processing speed and throughput rate of transactions, but the random selection of consensus identity reduces the risk of DDoS attacks and the possibility of collusion among nodes. Moreover, if the consensus process is in a strong synchrony network, the consensus can be reached within the first term.

IX. CONCLUSION AND FUTURE WORK

In this paper, we propose a new permission-less blockchain, called DLattice, with a Double-DAG architecture where each account has its own Account-DAG and all accounts make up a greater Node-DAG structure. DLattice parallelizes the growth of each account's Account-DAG, each of which is not influenced by other accounts' irrelevant transactions, resulting in fast transactions with minimal overhead. The core of DLattice is DPoS-BA-DAG (PANDA) protocol which helps users reach consensus with low latency only when the forks are observed. Based on proposed DLattice structure, we introduce a series of methods for data tokenization, including data assembling, data anchoring and data authorization. DLattice tokenizes data as on-chain assets for sale and transaction, making them circulate and transfer securely and efficiently. Through security analysis, we demonstrate DLattice can prevent some attack vectors such as Double-Spend, Sybil attack, etc. Experimental results show that DLattice reaches a consensus in 10 seconds, achieves desired throughput, and incurs almost no penalty for scaling to more users.

The shortcomings of this paper are that i) the current DLattice prototype only anchors the digital fingerprint of the data asset, while the raw data is stored in the IPFS, but due to the lack of incentives, the data may be lost with the accidental offline of the IPFS nodes. The function of the consensus node shall be optimized in the following study, making it not only participate in the consensus but also has the ability to store data assets; ii) smart contracts are not currently supported; iii) in the process of consensus, if the consensus is not reached in the first term, and the identity of the corresponding consensus committee membership will be exposed and vulnerable to DDoS attacks. These issues are the focus of research in the following work.

In the future studies, we consider introducing DLattice to healthcare and the Internet of Things to achieve the tokenization of medical data and IoT data. One possible application is to manage chronic diseases by tokenizing the medical examination data, health data collected by wearable devices and exercise prescription data issued by doctors based on our previous experience in the field of health informatics. In this way, the physiological and exercise data of users are effectively protected while being asserted, and the data can be efficiently shared and transferred among scientific research institutions, hospitals, health equipment manufacturers, and even insurance companies.

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