# **SoK: Consensus Protocols in Blockchains**

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Abstract. When Nakamoto invented Bitcoin, the first generation of cryptocurrencies followed it in applying POW (Proof of Work) consensus mechanism; due to its excessive energy consumption and heavy carbon footprints, new innovations evolved like Proof of Space, POS (Proof of Stake), AI-based consensus protocols, and a lot more with many variants for each. Furthermore, the emergence of more blockchain applications and kinds beyond just cryptocurrencies needed more consensus mechanisms that is optimized to fit requirements of each application or blockchain kind; examples range from IoT (Internet of Things) blockchains for sustainability applications that often use variants of BFT (Byzantine Fault Tolerance) algorithm, and consensus needed to relay transactions and/or assets between different blockchains in interoperability solutions. This paper tries to gather and organize all existing consensus protocols in the blockchain world with a focus on cryptocurrencies and interoperability solutions. We summarize the main consensus protocols with their academically recognized variants and collect other variants from white papers. We point out to existing surveys and systematic review papers, fill the gaps, and add the new; the aim is to introduce a comprehensive overview of the topic, along with the links to go deeper into every detail.

Keywords: Blockchains, consensus, BFT, POW, POS.

# 1 Introduction

Blockchains inherit the *Byzantine Generals Problem* from distributed information systems that is usually addressed using *state machine replication* approach; when a distributed information system replicates its servers to tolerate malfunctioning or malicious servers (referred to as *Byzantine*), it is supposed to answer enquiries and execute concurrent update requests to its replicated servers in a *consistent* and *live* manner [1,2]. That's quite similar to when block proposers each constructs a block with all needed certificates and references to previously delivered blocks and then compete to append their constructed block into the blockchain; choosing a certain block may change the Blockchain status in a way that render other competing blocks invalid.

The mechanism and criteria on which a block is selected from all proposed competing blocks is called the *consensus protocol*. Typically, a consensus protocol involves a *fair* selection criterion between valid blocks (heaviest computation for POW and probabilistic stakes ratio for POS); also, a reliable message exchange protocol to negotiate the selection between participating nodes where a malicious node may broadcast a wrong message or not broadcast at all hoping to cause a DoS

attack; finally, the usual *lock-commit* paradigm known in distributed databases [3] maybe mapped to forks handling strategies in single blockchains, but it **is** part of cross-chain consensus protocols when things get more complicated [4].

One may view blockchains as an asynchronous environment since there is no unified system clock, where deterministic consensus is impossible in the asynchronous setting<sup>1</sup>. Fortunately, blockchains are described as *alpha synchronous* (synchronization is achieved within time alpha) [5], since all Blockchains and their applications define a *finality time* after which most nodes have received (confirmed) the final block. The family of *Byzantine Fault Tolerance (BFT)*, from 1999 [6], style protocols operate in *rounds* in this *partially synchronous model*, by *electing a round leader* to start the broadcast, and can tolerate (*guaranteed to terminate achieving a consensus*) within a maximum threshold of *33%* malicious or faulty (so called *Byzantine*) nodes; *Tendermint* [7] as depicted in Fig.1 is a classical blockchain era example, while *Honeybadger* [8] and [1] are consensus protocols that could work in an asynchronous setting.

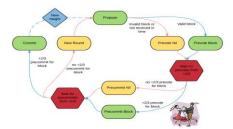


Fig1. The Tendermint protocol rounds (taken from [7])

The dynamically varying, possibly large<sup>2</sup>, number of participating nodes makes the consensus problem more complicated in blockchains [9, 5/lec9] since the committee that should agree upon a block is not predefined<sup>3</sup>. Therefore, either a new innovation is deployed, like *POW longest chain* consensus, or a strategic selection phase is first applied to select a committee (group) and then a proprietary *BFT* protocol is applied to the fixed size committee; examples include the Helium blockchain [10] consensus protocol where nodes compete in submitting *Proof of Coverage* (internet coverage) [11] to select a group then a *Honeybadger BFT* variant is applied<sup>4</sup>, and the use of the Tendermint protocol in Cosmos and Terra ecosystems [7].

M. J. Fischer, N. A. Lynch, and M. S. Paterson, Journal of the ACM, 1985, https://groups.csail.mit.edu/tds/papers/Lynch/jacm85.pdf

<sup>&</sup>lt;sup>2</sup> Ironically, the small number of participating relay nodes in cross chain bridges and interoperability solutions is sometimes a problem (); we will elaborate more on this later on the paper.

<sup>&</sup>lt;sup>3</sup> For a compact brief see (htttps://youtu.be/uWyJhNbJMn8)

<sup>&</sup>lt;sup>4</sup> This may have changed since the migration with Solana and hotspots stopped mining *HNT* tokens (switched to *IOT* tokens) and became NFTs on Solana (https://docs.helium.com/solana/migration/hotspot-operator/)

Other challenges [12] in the blockchain environment consensus include, but not limited to, time and/or bandwidth especially with interoperability and cross chain applications when there are more than one blockchain involved [section2 in 13,14,15], the number of compromised nodes the network could tolerate, and the degree of fairness and decentralization [16] in the committee selection. Hence, there are endless variants of consensus mechanisms out there, and the literature holds continuous innovations [17,18], general [19,20,21] and application specific [22,23] surveys and comparative studies[24]; the literature also holds theoretical contributions [25,26,27] and textbook style material [5,7,28].

In this paper we try to present a consolidated view of the complete picture, naturally focusing on only some of its details, and at the same time guiding the reader to all available material we have encountered. Section 2 summarizes most important consensus criteria used in different blockchain applications, while section 3 discusses design issues along with some examples of consensus in interoperability solutions; finally, section4 concludes the paper.

# 2 Main Types of Consensus Protocols Used in Blockchains

In this section we will try to cover the main consensus mechanisms in chronological order of their appearance along with their subvariants. Previous efforts include peer reviewed papers like [12,19,20,21], and an encyclopedia site [29].

### 1. Byzantine Fault Tolerant (BFT)

The traditional *BFT* [6], or a variant of it, remains suitable for private permissioned and consortium blockchains. For example, Estonia governmental *KSI* blockchain uses a proprietary *BFT* protocol [30,31]; also, *Federated BFT* [32] is used in payment-protocol-based blockchain platforms such as *Stellar*<sup>5</sup>; the default choice for sustainability applications blockchains is usually *Practical BFT* (*PBFT*) and could then be compared with other options [33]. In addition, as mentioned above, *BFT* style protocols are usually the second phase after committee selection in many blockchain applications, with *Tendermint* [7] being the most celebrated example.

#### 2. POW

The basic idea originated in the 90's as a protection from spam and DoS attacks by performing some non-trivial amount of computation that outweighs the expected attack revenue; POW failed in spam email protection [34] but became a breakthrough in cryptocurrency consensus since Bitcoin 2008 [35] as the heavy computation can prevent (with overwhelming probability<sup>6</sup>) different attacks (double spending, selfish mining, sybil

<sup>&</sup>lt;sup>5</sup> Some material on the internet includes *Ripple* too as a federated BFT example, however (https://www.mdpi.com/1999-5903/12/3/53) explains in detail that only *Stellar*, which forked from *Ripple*, does and thus have the (<n/3) byzantine nodes threshold while Ripple consensus (RPCA) can tolerate only (<n/5).

<sup>&</sup>lt;sup>6</sup> POW only provides probabilistic finality, while POS has provable finality.

attacks)<sup>7</sup> unless attackers possess 50% of all existing computational power. Basically, miners compete to solve a cryptographic puzzle with a predefined difficulty level, combine it with their proposed block and try to append it to the chain; from the different possible future chains (new system state) nodes elect the longest chain (more accurately, the one with the heaviest computation) and the choice is considered finalized, escrow time, after 6 blocks. Despite all its merits, the high energy consumption along with its carbon footprint remains a significant argument against POW; attempts to decrease it by performing the computation only on certain key blocks include *Bitcoin-NG* [36].

# 3. Proof of Space/Capacity

In 2013, [37] suggested to dedicate a significant amount of memory or disk space as a greener alternative to POW computation. First crypto applications of proof of Storage include, [38], Signum (2014) and Spacemint (2015), while Chia (2018) deploys a variant called **Proof of SpaceTime** which necessitates reserving the storage for an amount of time<sup>8</sup>. Naturally, a variant of the latter is most suitable for distributed storage systems like **Filecoin**<sup>9</sup> which has a 2-phase protocol (Expected Consensus EC [39]); a probabilistic Byzantine fault-tolerant consensus protocol runs a leader election among a set of storage providers to submit a block every time epoch, where the likelihood of being elected depends on how much provable storage a miner contributes to the network.

#### 4. Proof of Activity

First suggested in 2014 paper with *Litecoin* Creator, Charlie Lee, as one of its authors and could be viewed as an improvement over POW. Miners solve an easier puzzle for empty blocks, then a set of validators from coin holders (an early variant of POS) verify the transactions part of the block and reward is split between miners and validators [40]; such an arrangement also harden the 51% hash power attack in POW to necessitate 51% malicious validators (coins holders) in addition. Proof of Activity is used in *Decred* and *Espers*<sup>10</sup>;

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<sup>&</sup>lt;sup>7</sup> **Double spending** is trying to spend the same coins more than once, **selfish mining** is trying to mine several blocks secretly to produce a fork with a longer chain than the existing one (thus invalidates all TXs and mining rewards after the fork), and **Sybil attack** is for a single attacker to create a vision of multiple nodes creating a false majority (since it is a permissionless anonymous setting, nothing prevents from splitting your hash power into several addresses); however, the POW mechanism protects from all such attacks unless the attacker controls at least 50% of all available hash power worldwide.

<sup>&</sup>lt;sup>8</sup> Check appendix A, page 68, in [26] for a more theoretical enlightenment.

Wikipedia includes *arweave* too (a distributed storage that follows a structure called *blockweave* similar to blockchains but not one); however, we have found that *arweave* used *Proof* of *Access* for some time (https://www.reddit.com/r/a:t5\_67b622/comments/u37ldb/arweave\_consensus\_protocol\_poa/) and seems to switched to another protocol inspired by *Perma coin* 7 months ago as shown in (https://github.com/ArweaveTeam/arweave-standards/blob/master/ans/ANS-103.md)

<sup>10</sup> https://decred.org, https://espers.io

a different variant that shares the same name, but targets incentivizing participation, appeared recently in *Fastex* [41] uses a smart contract deployed by validators to evaluate a user's activity level before granting the chance of being a validator or a block producer. *Proof of Contribution* introduced in 2021, [42], is a similar idea.

# 5. Proof of Burn (POB)

Instead of spending the money on energy consumption and mining devices, just remove it from circulation and increase coin scarcity (and hence its price) instead of increasing carbon emissions. The idea so called "burning" coins appeared in 2019 [43], and is used in *Slimcoin*<sup>11</sup>; infact, burning crypto got more popularity in burning tokens of different exchange tokens [44], cross chain asset transfer, and of course burning ratio of the fees like in the *Near* protocol and Ethereum *EIP-1559*. Also, a recent 2024 paper [45] suggests upgrading cryptocurrencies with new tokens using *POB* via multicurrency auction.

#### 6. Proof of Elapsed Time (PoAT)

Was originally developed by Intel engineers and contributed to Hyperledger Sawtooth [46] to replace the POW heavy computation by generating a random waiting time using a trusted execution environment (TEE) and select the least waiting time as the leader; Proof of Luck (PoL) [47] on the other hand chooses the one with highest random number as the leader. In 2017, [48] studied PoET under a theoretical framework and found that it can be attacked by  $\theta(\log \log n/\log n)$  fraction of the nodes<sup>12</sup>, then [49] introduced a more practical simplified version (ET) of both PoET and PoL in 2021. PoET's GitHub is now archived, and a following experimental PoET2 was also archived [50]; PoL may capture the attention [51] from time to time since its first appearance 2016, but we also have not encountered any real implementation. However, the idea of leader selection based on randomly generated numbers, Verifiable Delay Functions and Verifiable Random functions VRF, is deployed in the consensus mechanisms of a number of layer-1 blockchains [52] including Algorand, Cardano, Internet Computer, and *Polkadot* to randomly select block producers; only those generate their random numbers in software code and are considered POS variants.

## 7. Proof of Stake (POS)

Although, *Peercoin* [53] claims to be the pioneer cryptocurrency using POS in 2012, the massive use of POS and its many variants started in 2017. The basic idea is that block selection is done probabilistically according to staked tokens; such an arrangement is more efficient (higher TX throughput) and consumes less energy, and also has introduced the possibility of *slashing* bad behavior (since stakes are registered, the evaluation smart contract mentioned in [41] proof of activity is possible). However, POS attacks are

<sup>11</sup> https://slimcoin.info

<sup>&</sup>lt;sup>12</sup> That's less than 1/3 the nodes for n>10; i.e., worse than *BFT* 

wider leading to more complicated and varying designs that can only tolerate only 27.8% <sup>13</sup> malicious nodes in some cases [54]; an example threat to start with is predicting the randomization process in selecting the block builder and a possible solution is to use VRFs as just mentioned above [52]. Nothing at stake attacks are named so because, unlike selfish mining in POW, forking and creating an alternative longer chain at any desired block in history costs nothing but simulating the randomization selection process. If slashing is the only defense, Long range attacks may wait enough to build a reputation and maybe withdraw their staked tokens before revealing the attack, some versions may even steal pretty old withdrawn keys with high credibility [55]; Cardano Ouroboros<sup>14</sup> protocol [56] use a warm up epoch and a withdrawal epoch where tokens remain locked without their owner being selected, also see videos 21&22 in [54] for details on how VDFs can be used to defend such attacks. Some criticize POS as more centralized and less democratized, since selection according to stakes could be viewed as "making the rich richer", we believe that hash power or mining devices in POW, space in PoSpace, internet coverage in PoCoverage,...etc. also costs money so it is nearly the same; however, some like Axeler [57] avoid vote monopoly by using a quadratic voting mechanism to slow down (by the square root) the growth of a validator voting power with the increase of his stake. Finally, POS has many variants that contains almost all what follows, Multi Token POS (MPOS) [58] could be viewed as the multi-chain version; in nearly all versions, there is a group (committee) selection phase then there is a leader selection phase (not necessarily BFT style, although the most common<sup>15</sup>) among the group members.

### 8. Delegated Proof of Stake (DPOS)

In *DPOS* stake tokens are not physically transferred to another wallet, but instead are utilized through a staking service provider in a staking pool [59]. Most sites refer to Cardano *Ouroboros* protocol [56] as a *DPOS* example, also Aptos [60], and TRON [61]; EOS [62] consensus protocol, *EOSIO*, involves a *DPoS* phase to elect the active producers who will be authorized to sign valid blocks in the network, then the actual process of confirming each block until it becomes final (irreversible) is performed in an *asynchronous BFT* manner. Introducing staking pools in *DPOS*, like mining pools in *POW*, make things easier and increases the number of *Transaction Per Second (TPS)* compared to *POS*; could be viewed by some as allowing participation with less than the minimum stake, and by others as concentrating power into staking service providers<sup>16</sup>. The authors in [63]

<sup>&</sup>lt;sup>13</sup> Driven from "e" value (e=2.78)

<sup>&</sup>lt;sup>14</sup> We will see in next section more variants of ouroboros deployed in interoperability solutions.

<sup>15</sup> Ethereum L2 for example combines longest chain voting LMD-Ghost with a PBFT protocol named Casper to achieve liveness and consistency.

According to [63], EOS has only 21 validators and TRON has 27; also, staking pools in Ethereum (like *Lido*) allow participation with less than 32 ETH, and at the same time holds % of total stakes.

suggest what they describe as a tweak to *DPOS*, *Preferential delegated proof of stake (PDPoS)*, where block creators have to stake more tokens in order to validate or assemble TXs sent directly to mainnet, while TXs sent to L2 costs less to users, rewards less to block creators, and maybe delayed to 24hrs; an arrangement that seems like a city for the rich and a city for the poor is claimed to give much higher TPS. It's also worth mentioning that we found an 2024 paper [64] that deploys *DPOS* in an intelligent task scheduling system using blockchains.

### 9. Proof of Authority (PoAu)

Suggested by Ethereum founder Gavin in 2017 [65], a variant of POS, where [65,66,67] instead of choosing block miners based on their stakes in cryptocurrency tokens, a small group of authorities are selected as transaction validators by their identity or reputation 17 staked in the network. When it started, *Ronin* [68] used Proof of Authority consensus between limited validators to relay *Axie Infinity players* TXs through *Ronin-chains*; now it first selects a set of validators using *DPOS*, then validators take turns producing blocks in *PoAu* manner.

### 10. AI-Based Consensus

Instead of wasting computation and energy in solving puzzles, computation is used to achieve something useful like training neural networks or machine learning tasks; the first appearance of the idea we encountered was in 2018 [69] and 2019 [70], follow up variants include [18,71,72].

#### 11. Application Specific Kinds

The literature, and the market, both hold enormous number of application optimized consensus innovations; we have mentioned Helium *Proof of internet Coverage* [10], this paper [73] defines *Proof of Absence* for its IoT blockchain system consisting of 10 devices at maximum, the survey in [12] mentions *Proof of Movement* used in healthcare blockchain systems, and there will always be a lot more. Also, Hyperledger Fabric as an example provides a variety of consensus protocols like Kafka [74], Raft [75], and PBFT, and allows for the integration of any desired consensus (the pluggable consensus feature) to extend its interoperability features [76,77]. Finally, it is worth mentioning that Wikipedia contains an "AI-generated" consensus protocol, [78], *Proof of Identity*.

## 12. DAG Consensus Protocols

This innovation [79] comes to replace the second phase, after choosing the set of validators in *POS* style protocols; instead of electing a round leader [5,6,7] to start the broadcast in traditional BFT variants, a *Directed Acyclic Graph (DAG)* is constructed to reflect the data dependency between Transactions (to guarantee *safety*) then all validators start to build and broadcast blocks in parallel to speed up the process. Round after round a *safe* total ordering is achieved (on a number of blocks instead of just one, and

<sup>&</sup>lt;sup>17</sup> The theme is similar whether it is called Proof of *Reputation/Activity/Authority*, it is some form of evaluation function coded in a smart contract.

while still keeping the 33% byzantine threshold) either by excluding equivocating (contradicting) blocks or preventing their construction from the beginning [80,81]. DAG-based consensus protocols include DAG-Rider and Bullshark, and are currently deployed by many blockchain companies like Aptos [82] and Chainlink [83]; Aptos introduced the *Proof of Availability* idea in *Narwhal* where only meta data about the transactions are broadcasted till a consensus is reached to save bandwidth, while Chainlink removed the voting phase using lock before finalize (recall [3]) *BBCA* broadcast. Finally, as it might cross one's mind, on whether *DAG*-based total ordering schemes affect *MEV* (*Miner Extracted Value*), the Aptos lab discussed it [84] in light of their original paper [82], while chainlink also introduced their DAG-based protocol called *Fino* [85] that integrates MEV-resistance features into DAG-based BFT, before [83]

# 3 Consensus Across Chains in Interoperability Solutions

Reaching consensus in a multi-chain environment is much more complicated; for a start, safety involves more than one ledger like the simple combined (train-hotel) and (plane-hotel) reservation example in [4]; then selecting validators set or relay nodes is more complicated and involves more threats as depicted by the long history of cross chain attacks in their short lifetime [86].

# 3.1 Interoperability solutions classification

Most of the literature follow classifications presented in [87] that first divides them into heterogeneous solutions between different kinds of blockchains with Hyperledger as the most dominating example and we have just mentioned [74-77] how it offers flexibility by supporting pluggable consensus protocols in addition to Raft and Kafka. Then, there are Blockchain of Blockchains (BOB) solutions that provide a Cross Chain Communication extra layer blockchain to handle transactions between EVM like blockchains; famous contributors to the consensus literature like Chainlink [52,81,83], COSMOS [7], Polkadot [88], and Horizen [89] fall in this category, where innovations may include efficiency improvements like DAG-BFT approaches, and are most concentrated in choosing the validators committee in ways that provide enough rewarding incentives [68,90] and guarantee decentralization [52] and attack defense [57]. The last category, public connectors that include all notary systems like side chains and bridges have the same challenges of key leakage and possible collusion more magnified since they can only provide smaller number of validators [91,13]. The authors in [92] examine in detail the security of many interoperability solutions including some that deploy POW instead of BFT consensus and some that use distributed private key control; we have also mentioned POB interoperability solutions in [45], Metaverse specialized solutions in [14], and Axeinfinity game in Ronin [68].

#### 3.2 Case Studies

We will go through some case examples in this subsection; the reader interested in more may check the consensus mechanism of interoperability solutions listed in [87,92,13].

#### > Polkadot

For a start Polkadot [88] uses Nominated POS, NPOS, where stakers can vote to nominate validators who are willing to dedicate the time and resources to run a validator node. Then a hybrid consensus (2 protocols) is applied to split block production protocol, BABE, from handling forks and guaranteeing finality protocol, GRANDPA. Blind Assignment for Blockchain Extension (BABE) is comparable to a recent ouroboros variant than Latus called *Praos* [93]; epochs are divided to slots (~6 secs) and validators are assigned to slots based on their stakes via a VRF, if more than one validator are selected to one slot they race to finish the block and if no validator is selected a backup round-robin validator selection is used18. GRANDPA (GHOST-based Recursive ANcestor Deriving Prefix Agreement) is run by validator nodes in parallel to reach provable finality through consecutive rounds of validators voting (on chains instead of single blocks); so BABE builds on the chain finalized by GRANDPA and if there are forks afterwards, it favors the chain with more primary blocks (generated thru VRF selection not round-robin). Finally, Polkadot supports a bridge, BEEFY (Bridge Efficiency Enabling Finality Yielder), to remote, segregated blockchains like Ethereum; BEEFY operates on top of GRANDPA, utilizing a consensus extension and a light client protocol<sup>19</sup>.

### > Bool Network

The original paper in 2022 [94] proposed a relay chain scheme that is based on secure multi-party computation and distributed private key management over an evolving hidden committee; the committee is elected using a <u>Ring verifiable random function (Ring VRF) protocol</u>, where the real public key of a VRF instance can be hidden among a ring. Furthermore, all the <u>key management procedures are executed in the TEE</u>, such as Intel SGX, to ensure the privacy and integrity of partial key components; although identities are hidden, committee members who behave maliciously can be detected and disqualified, and the cost of launching DoS or double-spending attacks is high. The (https://Bool.network/) site promotes itself as a <u>Bitcoin verification layer that turns all blockchains into Bitcoin layer 2</u>.

<sup>18</sup> The videos in [54] points out that random number generation in POS systems will naturally lead to such cases and discusses different alternatives.

<sup>&</sup>lt;sup>19</sup> BEEFY uses Merkle Mountain Ranges (MMR) as an efficient data structure for storing and transmitting block headers and signatures, which is almost the same Utreexo forest data structure introduced in Bitcoin as a stateless server providing worst case O(log n) Merkle proofs to stateless clients.

#### Subsidy Bridge

A general and decentralized relay scheme with special incentive design similar to Bitcoin mining. The main idea, [95], is to keep utility of honest relayers (basic subsidy from target chain + transaction fee from cross-chain users) always positive even when users are temporarily inactive. It's worth mentioning that the designers of Latus [90] too, although a POS variant, emphasize that it is very important for the consensus security to continue issuing blocks, even if empty to keep the rewarding incentive.

### > Deterministic Cross-Blockchain Token Transfer (DEXTT)

All observer candidates use their private keys to sign the cross-chain transactions as soon as they discover it, *the observer the minimum signature value* [96] is considered the contest winner and thus broadcast the transaction and wins the witness reward; *VETO transactions* reporting double spending and penalizing bad behavior are subject to the same contest with a reward incentive. Finally, in their evaluation implementation the authors used three geth nodes in *Proof of Authority* (*PoA*) mode, creating three private blockchains, to ensure a reproducible and uniform ecosystem of blockchains.

# Practical AgentChain

Agentchain appeared in 2019 [97] and could be viewed as a *Proof of Reputation* consensus side chain that uses multi-signature schemes; trading operators can be combined as several decentralized trading groups by locking tokens to ensure credibility. Users choose a "reputable" trading group and deposit assets to the trading group's multi-signature address on the existing blockchain. Then the assets will be mapped to *AgentChain* by the trading group, on which token fair exchange is supported. However, the design was in the conceptual stage with poor implementation; a follow-up paper introduced *Practical AgentChain* [98] in 2022 that introduced a complete system with more functionalities.

## ➤ Identity-Based Encryption (IBE-BCIOT)

Proposed electing proxy nodes according to a clustering algorithm based on density peaks [99]; aiming to elect nodes with efficient computing power, the algorithm assumes that if the cluster centers are surrounded by neighbor nodes with lower local density and the distance between any nodes is relatively large, then the clustering center will be defined as the local maximum of the data point density. Then, the elected proxy nodes are authenticated through a trusted cross-chain notary deploying an *Identity Based Encryption (IBE)* algorithm; this shares some resemblance with the AI generated *Proof of Identity* in [78]. Finally, selected nodes reach consensus using *PBFT*.

# 4 Conclusions & Future Work

We introduced in this systemization of knowledge paper a compact consolidation on blockchains consensus protocols trying to cover all aspects and point out to all significant work in the literature. The paper also shed some extra light on consensus schemes used in interoperability solutions. We hope this paper can be a starting point that provides the necessary reading material for researchers and developers, with enough guidance to go deeper.

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