

Exploring the Evolution and Future of Distributed Computing: From Legacy
Systems to Blockchain Paradigms

@Gas_Limit

CSIT429: Parallel and Distributed Computing

January 20, 2024

Distributed Computing is a framework that reduces hardware costs and optimizes performance for computing processes. Consider distributed computing analogous to a collaborative group project, where each participant contributes from different locations. This framework effectively divides complex tasks across several computers, each tackling a portion, thereby enhancing the overall processing efficiency.

The purpose of distributed computing is to distribute computational tasks between multiple computers, functioning cohesively as a single cohesive system.¹ A spectrum of computational tasks exist in the distributed computing field, which range from completely parallel, in scenarios of high inter-process communication, to partially parallel where computing uses high communication due to sharing of processes that run on different nodes.

Granularity pertains to the size of a task each processor needs to work. These can be categorized into fine, medium, and coarse grain.¹ Granularity in distributed computing can be equated to puzzle pieces of varying sizes. Each task, akin to a puzzle piece, varies in size - from fine to coarse. Similar to how smaller puzzle pieces provide more detail but require more intricate assembly, fine-grained tasks in computing offer detailed processing but necessitate enhanced coordination.

A node is a computational entity that executes computing operations within a distributed system.¹ In a distributed system, nodes function comparably to individual contributors within a large corporation. Each node, akin to an employee, has a specific operational role, collectively ensuring the system's efficacy, much like employees ensure the smooth operation of a company.

¹ Md. Firoj Ali and Rafiqul Zaman Khan, "Distributed Computing: An Overview," International Journal of Advanced Networking and Applications 7, no. 1 (2015): 2630

Tasks embody the logical parts of an overall processing task, which are distributed across all of the nodes. The topology of a distributed system is the arrangement of nodes in a network, and determines complexity of task's coordination.¹ Key performance indicators include the performance of the system are execution time, throughput, system utilization, and turnaround time.¹

The advantage of distributed computing is that it facilitates handling complex, resource-intensive tasks by harnessing the collective capabilities and storage of multiple machines. The system is using distributed tasks geared towards enhancing reliability, scalability, and efficiency, and adapt to varying computing demands.² Despite its advantages, there are many benefits, administering and configuring such systems can be challenging due to their complexity and the need for coordination across different machines.²

There are several applications for distributed computing environments, One of the initial applications was grid computing which is often used for scientific research, engineering, and data-intensive applications.³ Cloud computing is another form where it is used for services including on-demand self-service, broad network access, resource pooling, dynamic increase or reduction of systems also called rapid elasticity.⁴

Prominent cloud service providers include AWS, Microsoft Azure, and Google cloud. The impact of cloud computing in our daily lives often goes unnoticed. When we store photos on a cloud service or use web-based email, we engage with cloud computing, which operates on a

² "What Is Distributed Computing?," Amazon Web Services, accessed January 20, 2024.

³ Velibor Božić, "Research Proposal: Distributed Computing Systems," (March 2023), doi: 1, 10.13140/RG.2.2.33017.75361.

⁴ Velibor Božić, "Research Proposal: Distributed Computing Systems," 2.

network of remote servers, much like how utility services such as electricity are available ubiquitously.

Another example for distributed computing is Edge Computing, where it focuses on local processing, decentralized architecture, and utilizes edge devices like routers and IoT devices.⁴ Fog computing is a form where it employs heterogeneous devices and emphasizes proximity to data sources for reduced latency and improved performance. Lastly, the most recent innovative implementation of distributed computing is Blockchain based technologies.⁵

Contemporary blockchain applications are the popular cryptocurrencies, Bitcoin and Ethereum. The blockchain is a ledger, which is an immutable log of transactions.⁵ Blockchain technology can be conceptualized as a digital ledger, resembling a bank's ledger system, but fortified with enhanced security and transparency. Each block in the blockchain is akin to a ledger page, recording transactions in a secure, chronological order.

Distributed computing fundamentals are precursor concepts of blockchain.⁵ A widely recognized application scenario of blockchain is for supply chain management where it uses Byzantine fault-tolerant consensus.⁵ Public blockchains are a public ledger that focuses on cryptographic aspects and consensus mechanisms like Proof of Work.⁵ Smart contract functionalities have been introduced with the Ethereum Network, which are object oriented applications for transactional operations.⁶ There are many innovations in blockchain that emphasize the importance of understanding distributed computing processes.⁵

A fundamental distinction between distributed computing and blockchain lies in their operational approach. While distributed computing delegates different tasks to various nodes,

⁵ Maurice Herlihy, "Blockchains from a Distributed Computing Perspective," 1, no. 1 (January 2018): 1-6, doi:/10.1145.

⁶ Maurice Herlihy, "Blockchains from a Distributed Computing Perspective," 1, no. 1, 2.

emphasizing task-specific processing and efficiency, blockchain, in contrast, distributes consensus among all participating nodes. This distinction is crucial in understanding their respective applications and implications. In distributed computing, the focus is on dividing a complex task into smaller, manageable parts, which are then processed independently by different nodes. Conversely, blockchain technology leverages the power of consensus to maintain a unified and secure ledger across all nodes, ensuring data integrity and trust in a decentralized environment.

There is a rich history of distributed computing, starting in 1960 where there was the introduction of commercial mainframes using punch cards, leading to the development of cathode ray terminals for direct programming input. In the 1970's, there was the emergence of minicomputers, Ethernet, and X.25 technology, alongside the development of ARPANET and TCP/IP protocols.⁷⁸

In the 1980's, there was the spread of the 2 and 3-tier Systems, which were IBM PC's and LAN networking, development of NetWare and NFS, introduction of DNS, and early examples of 3-tier systems with middleware.⁷ RPC, or Remote Procedure Call was another innovation introduced around that time, which is a middleware in distributed systems. The 1990's brought the growth of N-tier Systems, which were the internet, and WWW.⁷ It introduced the web-based systems, and evolution of programming environments and frameworks.

One of the biggest applications of distributed systems is Cloud computing, which evolved from grid computing.⁷ It plays a key role in data management and resource sharing in large organizations. Some characteristics of cloud computing are on-demand service, broad network

⁷ "History of Distributed Computing," Stanford University Computer Science Department, accessed January 20, 2024.

⁸ "Chapter 2: Distributed Computing," University of Maryland, Baltimore County, accessed January 20, 2024.

access, resource pooling, rapid elasticity, and measured service.⁷ One service models that appear in cloud computing are Software as a Service (SaaS) such as Netflix. Another model is Platform as a Service (PaaS) for platforms like Google Cloud. Infrastructure as a Service (IaaS) which is used in DigitalOcean.⁹ Private, community, public and hybrid clouds are deployment models of cloud computing.¹⁰ The challenges of cloud computing are data management, regulatory compliance, and virtualization complexities.¹¹

Another large use of distributed computing is Distributed databases, which consists of independent components on different machines. It involves storing parts of the database in multiple physical locations.¹² Most products and applications nowadays rely on distributed databases. Distributed databases are managed by distributed database management systems, also known as DDBMS.¹²

Blockchain can be seen as a parallel to the distributed computing world. It first began with the creation of Satoshi Nakamoto in 2008. Blockchain technology is described as a complex reflection of distributed computing principles.⁵ Blockchain is a secure ledger database shared in a distributed network.¹³ It eliminates the need for third parties in transaction verification.¹³ Public blockchain offers a trust mechanism in transactions between unknown entities.¹³

⁹ Brittainy King, "IaaS vs. PaaS vs. SaaS: What's the Difference?," DigitalOcean, January 6, 2022.

¹⁰ Derrick Rountree and Ileana Castrillo, "Chapter 1 - Introduction to the Cloud," in *The Basics of Cloud Computing: Understanding the Fundamentals of Cloud Computing in Theory and Practice* (2014), 1-17.

¹¹ Cem Gurkok, "Chapter 63 - Securing Cloud Computing Systems," in *Computer and Information Security Handbook* (Third Edition) (2017), 897-922.

¹² Pawan Kumar Pandey, "Growing Impact of Distributed Computing and Distributed Database," *International Journal of New Media Studies (IJNMS)* 10, no. 1 (January-June 2023): 44.

¹³ Mohit Kaushal and Sheel Tyle, "The Blockchain: What It Is and Why It Matters," Brookings Institution, January 13, 2015.

Although Bitcoin is the most popular, blockchain has much broader applications outside of peer to peer payments.¹³ It empowers anonymous exchange of digital assets, and uses sophisticated algorithms to confirm transactions.¹³ One of the largest uses of blockchain and cryptocurrency is DeFi, or decentralized finance which is an alternative financial infrastructure built on the Ethereum blockchain.¹⁴ It utilizes smart contracts to replicate traditional financial services in a more open and transparent manner.¹⁴

DeFi operates without intermediaries, relying on code for transaction execution and interest-earning lending platforms.¹⁴ The backbone of DeFi protocols is smart contracts, which ensure secure and verifiable transactions.¹⁴ There are different token standards, which are adopted requirements that the developer community has standardized.¹⁴ Decentralized exchanges are applications that let users exchange assets like a traditional stock exchange, only now trades are managed by computer code instead of an intermediate party.¹⁴ There are many other applications like debt markets, on-chain asset management, and many more concepts that are developed continually both seen in traditional financial systems, and entirely new concepts not offered outside of blockchain.

The pinnacle of blockchain technology is the consensus mechanism. Consensus mechanisms are protocols that help all nodes in a blockchain network agree on the validity of transactions.¹⁵ Algorithms ensure that each new block added to the blockchain is the one and only version of the truth that all nodes agree on. Having a strong consensus mechanism is crucial

¹⁴ Fabian Schär, "Decentralized Finance: On Blockchain- and Smart Contract-Based Financial Markets," Federal Reserve Bank of St. Louis Review 103, no. 2 (Second Quarter 2021).

¹⁵ Ziad Hussein, May A. Salama, and Sahar A. El-Rahman, "Evolution of blockchain consensus algorithms: a review on the latest milestones of blockchain consensus algorithms," Cybersecurity 6, Article 30 (2023).

in maintaining the integrity and security of the blockchain, preventing double-spending and fraudulent activities.¹⁵

These mechanisms contribute to the immutability of the blockchain, making it nearly impossible to alter recorded data retroactively. Blockchain's consensus mechanisms are analogous to the jury decision-making process in legal trials. Nodes in a blockchain must collectively agree on the validity of transactions, similar to how a jury reaches a unanimous decision, thereby upholding the blockchain's integrity.

There is a large importance in distributed computing for blockchain. They enable a decentralized approach, removing the need for a central authority, which is a fundamental aspect of blockchain technology.¹⁶ In a distributed network, conflicts about transaction orders are inevitable; consensus mechanisms resolve these conflicts.¹⁶ The choice of consensus mechanism of each blockchain can significantly impact the scalability, efficiency, and security of the network.¹⁷

As blockchain technology evolves, consensus mechanisms are also evolving to address the challenges like energy consumption, and ensuring faster transaction processing.¹⁶ The first type of consensus mechanism ever created was 'Proof of Work' made famous by Bitcoin. Proof of work works by having network participants, nodes, also known as miners, solve cryptographic hash puzzles, which require extensive computation effort and energy to validate and record transactions in a new block.¹⁷ The difficulty of these puzzles is dynamically adjusted to ensure a consistent time interval for block creation.¹⁷ The first miner to find a valid solution broadcasts it

¹⁶ J. Zarrin, H. Wen Phang, L. Babu Saheer, et al., "Blockchain for Decentralization of Internet: Prospects, Trends, and Challenges," *Cluster Computing* 24 (2021): 2841–2866, <https://doi.org/10.1007/s10586-021-03301-8>.

¹⁷ Satoshi Nakamoto, "Bitcoin: A Peer-to-Peer Electronic Cash System," 2008, www.bitcoin.org.

to the network, receiving cryptocurrency rewards and transaction fees upon verification and acceptance by other nodes.¹⁷

The second most well-established blockchain network Ethereum, switched their consensus mechanism to a 'Proof of Stake' model in September of 2022.¹⁸ Instead of having miners, validators are randomly chosen to create new blocks and validate transactions based on the number of coins they hold and are willing to 'stake' as collateral.¹⁹

Unlike Proof of Work, Proof of Stake relies less on computational power, instead using staked coins to secure the network, with validators being rewarded with transaction fees proportionate to their stake, thereby reducing energy consumption and enhancing scalability.^{19 20} This method helps to secure the network while incentivizing participants to act honestly, as malicious behavior could lead to the loss of their staked assets.^{19 20}

A variant of Proof of Stake is a consensus mechanism called 'Delegated Proof of Stake' where a blockchain network uses a voting mechanism where coin holders vote to elect a limited number of delegates for validating transactions and creating new blocks.²¹ This approach aims to balance efficiency and speed in achieving consensus with a degree of decentralization, as it relies on elected representatives rather than the broader network of participants.²¹

In an even more centralized model, 'Proof of Authority' is a consensus mechanism where transactions and blocks are validated by approved validators, who are pre-selected based on their

¹⁸ Romain Dillet, "Ethereum Switches to Proof-of-Stake Consensus After Completing The Merge," TechCrunch, September 15, 2022.

¹⁹ Sunny King and Scott Nadal, "PPCoin: Peer-to-Peer Crypto-Currency with Proof-of-Stake," August 19, 2012

²⁰ "Ethereum Consensus Specifications," GitHub, accessed January 20, 2024.

²¹ "DPoS (Delegated Proof of Stake)," BitShares, accessed January 20, 2024.

reputation and identity.²² This method focuses on identity as a stake, offering a more energy-efficient and faster process than Proof of Work, but it centralizes trust in a smaller number of participants, which contrasts with the decentralized ethos of traditional blockchain models.²² There are other consensus mechanisms models in blockchain, but in this paper we have only touched on the most broadly acknowledged ones.

In blockchain, there are issues with scalability, which refers to the capacity of a blockchain network to manage a growing amount of transactions and users effectively.²³ The concern is the network's ability to handle increased transaction loads without significant performance degradation.^{23 24} There are solutions that involve optimizing the speed and volume of transactions that can be processed within a certain time frame.

Scalability directly impacts transaction processing times.^{23 24} Limited scalability can result in slower transaction speeds.²³ Consider the scalability issues in blockchain as analogous to managing urban traffic congestion. As the volume of transactions (akin to traffic) increases, the network faces delays and higher costs. Reduced scalability can lead to higher transaction fees, as users might have to pay more to prioritize their transactions.

²² "Proof-of-Authority Chains," OpenEthereum, accessed January 20, 2024,

²³ Jordan Adams, "What Are The Blockchain Scalability Issues And How Can They Be Solved?" Doubloin, August 13, 2023.

²⁴ Notomoro, "Blockchain Scalability: Transforming the Future of Decentralized Technology," Webisoft, October 5, 2023.

The scalability trilemma highlights a trade-off between scalability, security, and decentralization.^{23 24} Improving scalability can sometimes compromise security or lead to increased centralization.²⁴ Scalability challenges have led to innovative solutions like Layer 2 protocols, sharding, and new consensus mechanisms aimed at enhancing blockchain performance without compromising security or decentralization.^{23 24}

Sharding involves dividing the blockchain's entire network into smaller partitions known as 'shards'. Each shard contains its own independent state and transaction history.^{23 24} The benefit of sharding is that it significantly increases the network's capacity and transaction throughput as each shard processes transactions independently.^{23 24} Some of the challenges of sharding include implementation complexity and maintaining cross-shard communication securely.²⁴

Ethereum has plans to implement sharding to improve its scalability, but it has been pushed back to implement a variant of sharding dubbed “Proto-danksharding” which aims to optimize the transaction cost of Layer 2 protocols as soon as possible.²⁵ Layer 2’s are protocols whose goals are to improve the scalability issues that Ethereum, often referred to as a Layer 1 blockchain has, improving transaction speed and reducing transaction costs while inheriting the decentralization of Ethereum.

One type of Layer 2 uses Off-Chain Scaling that works on top of a blockchain to process transactions off the main chain.^{23 24} Another type of scaling solutions are ‘Payment Channels’ which allow for rapid, low-cost transactions between parties. The Lightning Network for Bitcoin is a prime example.^{23 24}

‘State Channels’ are another popular solution to scale Ethereum. They are similar to payment channels but more general-purpose, allowing participants to conduct numerous

²⁵ "Danksharding," Ethereum, accessed January 20, 2024.

interactions off-chain before finalizing the transaction on-chain.^{23 24} A popular implementation of a state channel is a Plasma network. It is a framework for building scalable applications, Plasma creates child blockchains anchored to the main Ethereum blockchain.^{23 24} This can be seen in Polygon's Proof of Stake blockchain.²⁷

A type of state channel that currently sees the most on-chain activity and total funds are Rollups.²⁶ They bundle multiple transactions into a single transaction on the main chain, reducing the overall load. There are two types: Optimistic and Zero-Knowledge (ZK) Rollups.²⁷

There are several other blockchains which aim to solve the issues Ethereum has while being interoperable with it and also work in a similar fashion. One of the other solutions is to make all blockchains interoperable with each other. Research is ongoing into interoperability protocols to connect various blockchains, enhancing overall network efficiency.²⁸ This can be seen in protocols like Chainlink's CCIP, Wormhole, Layerzero, Axelar and more.

When comparing blockchain and distributed computing in traditional systems, there are many similarities and differences. Both involve a decentralized architecture where processing is distributed across multiple nodes in the network.²⁹ They provide redundancy, meaning if one node fails, others can take over, ensuring high availability and fault tolerance.²⁹ Both rely on network communication protocols to enable nodes to communicate and coordinate their actions.²⁹

²⁶ "Polygon Blockchain Explained: A Beginner's Guide to Matic," CoinTelegraph, accessed January 20, 2024.

²⁷ "Optimistic Rollups vs. Zero-Knowledge (ZK) Rollups," Thirdweb, accessed January 20, 2024.

²⁸ "What Is Blockchain Interoperability?" Chainlink Education Hub, last updated August 9, 2023.

²⁹ DLT Magazine Editorial Team, "Exploring the Blockchain Technology: Distributed Computing in Action," DLT Magazine, December 8, 2023.

Blockchain uses specific consensus mechanisms like Proof of Work and Proof of Stake to validate transactions or blocks, which is not typically a feature in traditional distributed systems. Blockchain offers an immutable ledger, where once data is recorded, it cannot be changed. Traditional distributed systems do not inherently have this feature.²⁹

Blockchain provides transparency and trust among participants without needing a central authority. Traditional distributed systems usually involve some central control or trust authority.²⁹ Traditional distributed computing is focused on achieving computational efficiency and resource sharing for a variety of applications. In contrast, blockchain is primarily used for secure, transparent, and tamper-proof record-keeping.²⁹

Blockchain organizes data in a chain of blocks, each linked to the previous one, which is different from the varied data structures used in traditional distributed computing. Security in blockchain is integrated into its architecture via cryptographic techniques, whereas traditional distributed systems may employ various external security measures. Blockchain can be public, which is open to anyone or private which is restricted to certain members, while traditional distributed systems are typically operated by and within organizations.²⁹

There are many emerging trends coming out of the distributed computing paradigm. Pervasive networking technology is becoming increasingly integrated into distributed systems.³⁰ There's a growing focus on ubiquitous computing, emphasizing small and portable devices in distributed environments.³⁰ An increasing demand for multimedia services is influencing the development of distributed systems.³⁰ The concept of distributed systems as a utility is gaining traction, indicating a shift in how these systems are viewed and utilized.³⁰ Looking ahead, distributed computing could be integral in developing smart cities, where various systems like

³⁰ "Trends in Distributed Systems," BrainKart, accessed January 20, 2024.

traffic lights and public transportation are interconnected, optimizing urban life in a manner similar to a well-coordinated harmony.³¹

In the world of blockchain, there are many potential future developments. From Bitcoin's emergence to a wide range of applications in various sectors, blockchain is transforming industries like finance, healthcare, supply chain, education, and real estate.³² The rise of Decentralized Finance and different token standards pose significant transformation to how people interact with money. Blockchain is predicted to merge with other technologies, opening new applications and may become a standard for data security.³²

The future of blockchain extends to applications such as secure online voting systems, revolutionizing traditional processes by ensuring transparency and security in electoral systems, and a paradigm shift in how democratic processes are conducted.³² Scalability issues and regulatory challenges exist, but blockchain offers transparency, efficiency, and security benefits for businesses and individuals.³² Their role will be crucial in blockchain adoption and regulation.

In this research paper, we've delved deeply into the realm of distributed computing, exploring its characteristics, history, and its profound impact on modern computing. At its core, distributed computing has been instrumental in reducing hardware costs and enhancing performance, achieving this by distributing tasks across multiple computers to function as a singular, cohesive system. This technology spans from completely parallel systems, which require minimal communication, to partially parallel systems that rely heavily on the exchange of

³¹ Pablo Chamoso, Alfonso González-Briones, Fernando De La Prieta, Ganesh Kumar Venayagamoorthy, and Juan M. Corchado, "Smart City as a Distributed Platform: Toward a System for Citizen-Oriented Management," *Computer Communications* 152 (February 15, 2020): 323-332.

³² "The Future of Blockchain," Klever, accessed January 20, 2024, <https://klever.org/en/blog/the-future-of-blockchain>.

information due to the shared processes running on different nodes. A key aspect of this technology is the granularity of tasks and the crucial role of nodes, which are the operational entities in these systems. The arrangement of these nodes, or the system's topology, along with performance parameters like execution time, throughput, and efficiency, are central to understanding distributed computing's effectiveness.

The advantages of distributed computing are bountiful, most notably its enhanced reliability, scalability, and efficiency, making it adept at managing computationally intensive and resource-demanding processes. However, these benefits come with the challenge of administering and configuring such intricate systems, needing sophisticated coordination across various machines. In terms of application, distributed computing has been a game-changer in several areas, including grid computing for scientific research, cloud computing platforms like AWS, Microsoft Azure, and Google Cloud, and in more localized forms like edge and fog computing. Perhaps the most striking application has been in the realm of blockchain technology, where distributed computing principles have paved the way for innovations in cryptocurrency, supply chain management, and the development of smart contracts.

Reflecting on the historical journey of distributed computing, we observe its evolution from the commercial mainframes of the 1960s, using punch cards, to the sophisticated cloud computing and blockchain technologies of today. Blockchain, in particular, stands as a reflection of distributed computing principles, offering a secure, decentralized ledger system that has extended far beyond its initial application in Bitcoin to a wide array of industries.

As we consider the future of distributed computing, it's apparent that its impact will only continue to grow. The integration of distributed computing with emerging technologies such as artificial intelligence, the Internet of Things, and big data is likely to lead to even more

intelligent and interconnected systems. The evolution of blockchain and cryptocurrencies, with ongoing improvements in scalability and security, promises to further transform financial systems and other industry sectors. Additionally, as our reliance on these distributed systems increases, there will be an enhanced focus on developing robust security protocols and privacy safeguards.

In summary, the journey of distributed computing from its growing stages to its current state has been marked by significant advancements and groundbreaking impacts. Its future, combined with rapid technological advancements and increasing digital interconnectedness, holds promising potential for further revolutionizing the way we process and manage data in a multitude of applications.

Bibliography

Adams, Jordan. "What Are The Blockchain Scalability Issues And How Can They Be Solved?"

Doubloin, August 13, 2023. <https://www.doubloin.com/learn/blockchain-scalability-issues>.

Ali, Md. Firoj, and Rafiqul Zaman Khan. "Distributed Computing: An Overview." International Journal of Advanced Networking and Applications 7, no. 1 (2015): 2630.

https://www.researchgate.net/publication/280977301_Distributed_Computing_An_Overview.

Amazon Web Services. "What Is Distributed Computing?" Accessed January 20, 2024.

<https://aws.amazon.com/what-is/distributed-computing/>.

Božić, Velibor. "Research Proposal: Distributed Computing Systems." March 2023. doi: 10.13140/RG.2.2.33017.75361.

Chamoso, Pablo, Alfonso González-Briones, Fernando De La Prieta, Ganesh Kumar Venayagamoorthy, and Juan M. Corchado. "Smart City as a Distributed Platform: Toward a System for Citizen-Oriented Management." Computer Communications 152 (February 15, 2020): 323-332.

Chainlink Education Hub. "What Is Blockchain Interoperability?" Last updated August 9, 2023.

<https://chain.link/education-hub/blockchain-interoperability>.

CoinTelegraph. "Polygon Blockchain Explained: A Beginner's Guide to Matic." Accessed January 20, 2024.

<https://cointelegraph.com/learn/polygon-blockchain-explained-a-beginners-guide-to-matic>.

Dillet, Romain. "Ethereum Switches to Proof-of-Stake Consensus After Completing The Merge." TechCrunch, September 15, 2022.

<https://techcrunch.com/2022/09/15/ethereum-switches-to-proof-of-stake-consensus-after-completing-the-merge/?guccounter=1>.

DLT Magazine Editorial Team. "Exploring the Blockchain Technology: Distributed Computing in Action." DLT Magazine, December 8, 2023.

<https://distributed-ledger.tech/articles/exploring-the-blockchain-technology-distributed-computing-in-action/>.

"DPoS (Delegated Proof of Stake)." BitShares. Accessed January 20, 2024.

<https://how.bitshares.works/en/master/technology/dpos.html>.

"Ethereum Consensus Specifications." GitHub. Accessed January 20, 2024.

<https://github.com/ethereum/consensus-specs>.

"The Future of Blockchain." Klever. Accessed January 20, 2024.

<https://klever.org/en/blog/the-future-of-blockchain>.

"History of Distributed Computing." Stanford University Computer Science Department.

Accessed January 20, 2024.

https://cs.stanford.edu/people/eroberts/courses/soco/projects/distributed-computing/html/body_history.html.

Herlihy, Maurice. "Blockchains from a Distributed Computing Perspective." 1, no. 1 (January 2018): 1-6. <https://doi.org/10.1145/>.

Hussein, Ziad, May A. Salama, and Sahar A. El-Rahman. "Evolution of blockchain consensus algorithms: a review on the latest milestones of blockchain consensus algorithms." Cybersecurity 6, Article 30 (2023).

Kaushal, Mohit, and Sheel Tyle. "The Blockchain: What It Is and Why It Matters." Brookings Institution, January 13, 2015.

<https://www.brookings.edu/articles/the-blockchain-what-it-is-and-why-it-matters/>.

King, Brittany. "IaaS vs. PaaS vs. SaaS: What's the Difference?" DigitalOcean, January 6, 2022.

<https://www.digitalocean.com/blog/iaas-paas-saas-whats-the-difference>.

Nakamoto, Satoshi. "Bitcoin: A Peer-to-Peer Electronic Cash System." 2008. www.bitcoin.org.

Notomoro. "Blockchain Scalability: Transforming the Future of Decentralized Technology."

Webisoft, October 5, 2023. <https://webisoft.com/articles/blockchain-scalability/>.

Pandey, Pawan Kumar. "Growing Impact of Distributed Computing and Distributed Database."

International Journal of New Media Studies (IJNMS) 10, no. 1 (January-June 2023): 44.

"Proof-of-Authority Chains." OpenEthereum. Accessed January 20, 2024.

<https://openethereum.github.io/Proof-of-Authority-Chains>.

Rountree, Derrick, and Ileana Castrillo. "Chapter 1 - Introduction to the Cloud." In The Basics of Cloud Computing: Understanding the Fundamentals of Cloud Computing in Theory and Practice, 1-17. 2014.

Schär, Fabian. "Decentralized Finance: On Blockchain- and Smart Contract-Based Financial Markets." Federal Reserve Bank of St. Louis Review 103, no. 2 (Second Quarter 2021).

<https://research.stlouisfed.org/publications/review/2021/02/05/decentralized-finance-on-blockchain-and-smart-contract-based-financial-markets>.

Thirdweb. "Optimistic Rollups vs. Zero-Knowledge (ZK) Rollups." Accessed January 20, 2024.

<https://blog.thirdweb.com/optimistic-rollups-vs-zero-knowledge-zk-rollups/>.

"Trends in Distributed Systems." BrainKart. Accessed January 20, 2024.

https://www.brainkart.com/article/Trends-in-Distributed-Systems_8524/.

University of Maryland, Baltimore County. "Chapter 2: Distributed Computing." Accessed January 20, 2024.

<https://userpages.umbc.edu/~jianwu/is651/651book/is651-strapdown.php?f=is651-Chapter02.md>

Zarrin, J., H. Wen Phang, L. Babu Saheer, et al. "Blockchain for Decentralization of Internet: Prospects, Trends, and Challenges." *Cluster Computing* 24 (2021): 2841–2866.

<https://doi.org/10.1007/s10586-021-03301-8>.