NORTHWESTERN UNIVERSITY

Unchaining the Blockchain Network Layer

A DISSERTATION

SUBMITTED TO THE GRADUATE SCHOOL IN PARTIAL FULFILLMENT OF THE REQUIREMENTS

for the degree

DOCTOR OF PHILOSOPHY

Field of Computer Science

Ву

Uri Klarman

EVANSTON, ILLINOIS

March 2019

ProQuest Number: 13807200

All rights reserved

INFORMATION TO ALL USERS

The quality of this reproduction is dependent upon the quality of the copy submitted.

In the unlikely event that the author did not send a complete manuscript and there are missing pages, these will be noted. Also, if material had to be removed, a note will indicate the deletion.



ProQuest 13807200

Published by ProQuest LLC (2019). Copyright of the Dissertation is held by the Author.

All rights reserved.

This work is protected against unauthorized copying under Title 17, United States Code Microform Edition © ProQuest LLC.

ProQuest LLC. 789 East Eisenhower Parkway P.O. Box 1346 Ann Arbor, MI 48106 – 1346 © Copyright by Uri Klarman 2019

All Rights Reserved

ABSTRACT

Unchaining the Blockchain Network Layer

Uri Klarman

Blockchains are an exciting new type of Peer-to-Peer (P2P) distributed systems, which enable parties to transact directly, and maintain the record of said interactions in a distributed manner. A unique feature of blockchains is their ability to maintain a consensus without requiring knowledge on the number of participants, nor their identities, opening the door for cross-border, self-organized, decentralized, open ecosystems. The original blockchain, Bitcoin, aims to be a Global P2P Electronic Cash System, and to replace fiat money, banks, payment-processors, and other financial middlemen. Other blockchains, e.g., Ethereum, aim to remove middlemen from other types of interactions, such as replacing custodians with Smart Contracts, and to securely store credentials, identities, health records, and private information.

While blockchains have the potential to be transformative in many fields, their real-world usage is held back by practical limitations. First and foremost, for a blockchain to be used at a global scale, it must be capable of handling a high volume of transactions; for Bitcoin to replace Visa, MasterCard, PayPal and other payment processors, it must be

capable of processing roughly 5,000 transactions per second (TPS), the average number of TPS these companies process today [26, 74]. To support online shopping, it must support peak demand, which for Alibaba stands at 325,000 TPS [109]. In contrast to these significant requirements, Bitcoin can only process 3–4 TPS. Other significant limitations include the centralization and wastefulness of blockchain mining, the procedure which records transactions in the blockchain.

Research in the blockchain field had thus far focused on new cryptographic primitives and alternative blockchain protocols to address these real-world challenges, while the networking aspects were largely ignored. In this thesis, I propose a definition for the blockchain Network Layer, and provide evidence that the Network Layer is the bottleneck and root-cause for some of the most pressing challenges blockchains face today. I further propose new networking primitives and novel network utilization methods, and explore how they can be used to overcome said challenges, including scalability, mining centralization, and mining wastefulness, as well as to utilize blockchains to decentralize existing knowledge silos. First, I provide the necessary background to understand the operation of blockchains, and a definition for the blockchain Network Layer. Then, I present an analysis which outlines how the Network Layer is the bottleneck for blockchain scalability, and suggest a new networking primitive, the Blockchain Distribution Network (BDN) to overcome both blockchain scalability and mining centralization. Lastly, I present novel networking methods which enable blockchains to be utilized in new fields, focusing on the decentralization of the search engines market, and mitigate mining wastefulness.

Thesis Committee

Aleksandar Kuzmanovic, Northwestern University, Committee Chair Fabián Bustamante, Northwestern University, Committee Member Peter A. Dinda, Northwestern University, Committee Member Cristina Nita-Rotaru, Northeastern University, Committee Member

Acknowledgements

First, I would like to thank my advisor, mentor, and partner, Aleksandar Kuzmanovic, for his continuous support of my research, and for his wise guidance. His focus on exciting ideas, his confidence in our ability to overcome any obstacle we encounter, and his genuine enthusiasm about our joint work, are the cornerstones for my approach towards science, research, and academia.

I would further like to express my gratitude to my co-advisor, Fabián Bustamante, for supporting my research, for sharing his insights on conducting research across multiple domains and its implications, and for his valuable feedback and advice. My sincere thanks also go to the other members of my committee, Peter Dinda and Cristina Nita-Rotaru, for their valuable insight and candid feedback. Their insights and comments during my proposal had a significant effect on the shaping of my thesis, for which I am grateful.

I thank my lab-mates and fellow students at the Northwestern Networking Group: Marcel Flores, Ning Xia, Marc Warrior, Qurat-Ul-Ann Akbar, Andrew Kahn, and Alexander Wenzel, for their camaraderie, technical assistance, and wise advice. It had been my pleasure to work alongside each and every one of you. Additional thanks go to the entire bloXroute Labs team, and to Soumya Basu in particular, for investing countless hours in the development and deployment of bloXroute, bridging the gap between clever ideas and solid reality.

I would like to thank my parents, brothers, in-laws, nephews and nieces, for continuously supporting me in this endeavor, and throughout my life. Finally, I would like to thank my wife Yaara, without whom I would have never set out on this exciting academic journey, nor would it had been half as exciting.



Table of Contents

ABSTRACT	3
Thesis Committee	5
Acknowledgements	6
List of Figures	12
Chapter 1. Introduction	16
1.1. The Blockchain Network Layer	17
1.2. Blockchain Networking Resources	18
1.3. Thesis Organization	18
Chapter 2. Thesis	20
Chapter 3. Blockchain Fundamentals and the Blockchain Network Layer	21
3.1. The Operation of Bitcoin	21
3.1.1. Bitcoin Users	21
3.1.2. Nodes, Miners and Validators	22
3.1.3. Block Mining	24
3.1.4. Blockchain Security	25
3.1.5. Forks	26
3.1.6. Mining Pools	28

3.1.7.	Alternative Blockchain Designs	30
3.2. Th	e Blockchain Stack and the Network Layer	31
3.2.1.	Layer-1: Consensus Layer	31
3.2.2.	Layer-2: Intermittent Consensus Layer	32
3.2.3.	Layer-3: Inference Layer	33
3.2.4.	Layer-0: Network Layer	34
Chapter 4.		35
	alysis of the Blockchain Scalability Problem	35
4.1.1.	Scalability Constraints	36
4.1.2.	Block Propagation Time Analysis	37
4.1.3.	Forks, Security and Usability	39
4.1.4.	Decentralization	41
4.1.5.	Block Size and Inter-Block Time Interval	41
4.2. Rel	lated Work	42
4.2.1.	Centralized Propagation Systems	42
4.2.2.	Off-Chain Scaling Solutions	44
4.2.3.	On-Chain Scaling Solutions	44
4.3. Blo	ockchain Distribution Network (BDN): a New Networking Primitive	45
4.3.1.	Trust Model	46
4.3.2.	System Components	47
4.3.3.	bloXroute Scalability Improvement	48
4.3.4.	bloXroute's Provable Neutrality	50
4.3.5.	Adversary Behaviors, System Failure, and Safety Measures	55

4.4. blo	Xroute Empirical Evaluation	62
4.4.1.	Real-World Performance	62
4.4.2.	High TPS Performance	66
4.5. Min	ning Decentralization	70
Chapter 5.	Webcoin: Decentralizing Search Engines with Blockchain Networking	
	Resources	73
5.1. Fro	m Bitcoin to Webcoin	77
5.1.1.	Webcoin's Goals	77
5.1.2.	Webcoin's Non-Goals	78
5.1.3.	Proof-of-Work Wastefulness	79
5.2. The	e Webcoin Protocol	81
5.2.1.	Webcoin's Proof-of-Work	81
5.2.2.	Index Collectors	83
5.3. We	b Indexing and Index Validation	85
5.3.1.	Statistical Index Validation	86
5.3.2.	Statistical Validation Accuracy	87
5.4. We	bcoin's Security	88
5.4.1.	Block Mining	90
5.4.2.	Block Validation	94
5.4.3.	Resource Aggregation and Security	95
5.4.4.	Minimal Inter-Block Time	96
5.5. We	bcoin Evaluation	97
5.5.1.	Crawling Feasibility	97

1	1
1	. 1

5.5.2. Network Usage	100
5.5.3. Mining at Large Scales	103
5.5.4. Collectors' Properties.	105
5.6. Related Work	105
5.7. Discussion	107
Chapter 6. Conclusion	111
References	113

31

47

51

List of Figures

- 3.1 The blockchain stack. The Network Layer (Layer-0) supports the operation of the Consensus Layer (Layer-1), which encapsulates blockchain functionalities. The Intermittent Consensus Layer (Layer-2) extends these functionalities outside the consensus, while the Inference Layer (Layer-3) adds new functionalities outside the consensus.
- 4.1 The components of the bloXroute system: the bloXroute BDN, and the Peer Network nodes utilizing it. Each Peer Network node runs a Gateway process as an intermediary between its blockchain application and the bloXroute BDN.
- 4.2 Naive block propagation using bloXroute. (1) Blockchain node passes block to local bloXroute Gateway. (2) Gateway transmits block to bloXroute server. (3) bloXroute server streams block to all bloXroute servers as first bytes arrive. (4) bloXroute servers stream block to all Gateways as first bytes arrive. (5) Gateways validate block structure, and pass block to blockchain nodes.
- 4.3 Encrypted block propagation using bloXroute. (1) Blockchain node passes block to local bloXroute Gateway, which encrypts block. Then, propagation follows path of naive propagation (solid line). (2) Gateways

	form a P2P network, where each notifies its peer of encrypted blocks	
	received. p_1 and p_2 both notify p_{source} of receiving encrypted block.	
	(3) Once p_{source} learns its peers received the encrypted block, it sends	
	encryption key to its peers, to be propagated to all Gateways. (4) Upon	
	receiving the encryption key, each gateway decrypts the encrypted block	
	and pass it to the blockchain node it serves.	52
4.4	Indirect relay of encrypted block to bloXroute. (1) As in encrypted	
	block propagation, blockchain node passes block to local bloXroute	
	Gateway, to be encrypted. (2) Gateway transmits encrypted block to	
	a Gateway peer, to be relayed to a bloXroute server. Encrypted block	
	then propagates, followed by its encryption key, as in encrypted block	
	propagation (solid line).	53
4.5	The ratios by which bloXroute compresses the blocks mined on January	
	1st, 2019 on the Bitcoin (BTC), Bitcoin Cash (BCH), and Ethereum	
	(ETH).	63
4.6	The average timeline for the average block to propagate in the	
	bloXroute testbed. Blocks requires roughly 1 to be propagated in a	
	provably-neutral fashion to the entire Bitcoin network deployed in the	
	testbed.	68
4.7	CDF of the transactions per second (TPS) processed in blocks mined	
	during 20 trials of the bloXroute testbed. Each trial includes the mining	
	of 20 consecutive blocks.	69

5.1	Webcoin mining process: (left) (1) Miner crawls webpages along a	
	directed path, (2) miner indexes webpages, hashes the index, propagates	
	digest to peers, (3) collectors request and receive compressed indices	
	from miners. (right) (4) Miners wait until some miner becomes eligible	
	to mine a new block, (5) eligible miner propagates block and index,	
	accelerated by collectors, (6) each miner verifies the block, compares	
	index to past digest, and verifies a small subset of webpages.	80
5.2	The mining process of a new Webcoin block, performed every second.	91
5.3	CDF of the number of seconds between the mining of consecutive blocks.	
	Vertical line represents target at 600 seconds.	97
5.4	The partitioning of miners to quintiles (20% units) according to their	
	download bandwidth, and the percentage of blocks mined by nodes in	
	each quintile.	99
5.5	CDF of the number of seconds required for miners to crawl webpages	
	for indexing, per index size.	100
5.6	Network usage of a Webcoin miner deployed on a PlanetLab node,	
	during the mining of two consecutive blocks utilizing an index size	
	of 1000 webpages. Dashed lines mark the periods in which mining is	
	prohibited (between 1 and 7). Numbers mark the events of the mining	
	process: (1) block is mined by another miner, (2) block and index	
	download from peers, (3) block and index propagation on the upload	
	direction, index validation on the download direction, (4) Web crawling	

and indexing, (5) block and index propagation completion, (6) Web crawling completion, (7) block mining begins. 101



CHAPTER 1

Introduction

The Bitcoin white paper [75], published in October 2008, describes a new type of Peer-to-Peer (P2P) distributed system – the blockchain. In a blockchain ecosystem, participants may transact among themselves, and their transactions are periodically batched into blocks which are recorded by all peers. This results in chain of blocks, the blockchain, which defines a consensus over which transactions took place. To add a new block of transactions to the blockchain, the Bitcoin protocol requires a Proof-of-Work (PoW), i.e., a proof of performing a difficult computational-intensive task. This requirement prevents sybil attacks from influencing the consensus, and alleviate the need for peers to have knowledge of the number of participants or their identities. In the decade since Bitcoin's inception, many blockchains were launched in an attempt to improve upon, repurpose, substitute, or complement Bitcoin. While some blockchains are almost identical to Bitcoin, others had experimented with wide range of changes to the protocol, including altering its PoW, replacing its PoW with Proof-of-Stake (PoS) and other alternatives, altering the time interval between blocks and the number of transactions each can contain, running complex scripts, obfuscating transactions, and others.

Despite Bitcoin becoming a household name, and despite a market cap of hundreds of billions of dollars for blockchain-based cryptocurrencies, blockchain usage remains negligible when compared to major payment processors such as MasterCard, Visa, and PayPal,

or to online shopping giants such as Alibaba and Amazon. While the credit card companies and PayPal combined handle roughly 5,000 transactions per second (TPS) on average, and Alibaba had processed over 325,000 TPS at peak demand, Bitcoin can only process 3–4 TPS. This limitation, which is common to all blockchains, is often referred to as the "scalability problem", and is considered amongst the most pressing and difficult challenges blockchains face. Other significant challenges include mining centralization, i.e., the coalescence of miners into mining pools which undermine blockchains' security, blockchain utilization, and the wasteful nature of PoW mining.

1.1. The Blockchain Network Layer

Possible solutions for the scalability problem and other pressing challenges had been the source of heated discussions among Bitcoin and blockchain enthusiasts, researchers, and developers. However, due to to cyber-security and cryptography origins of this community, these discussions had mostly focused on novel cryptographic primitives, new protocols, and alternative consensus schemes. The networking aspects of blockchains had largely been ignored, and often considered to be a blackbox infrastructure which is agnostic to the operation of blockchains. Indeed, it is not uncommon to see all networking aspects abstracted away in these discussions, marked only as edges in graph representations of blockchain systems.

In this dissertation I propose a definition for the blockchain Network Layer, and the functionalities which fall under it. I further show that the Network Layer is the root-cause of the scalability problem, and in contrast to common belief, it is the Network

Layer which holds the key for some of the most pressing challenges blockchains face, including scalability and mining centralization.

1.2. Blockchain Networking Resources

Most of the networking resources consumed by Blockchain systems are utilized at the blockchain Network Layer. However, it is possible for blockchains to utilize their networking resources in other fashions to achieve additional goals. In this dissertation, I present how novel network utilization techniques enable blockchains to consume networking resources, rather than computational resources, which can be leveraged to decentralize critical networking tasks and to mitigate mining wastefulness, focusing on Web search engines.

1.3. Thesis Organization

The remainder of this dissertation is structured as follows: First, in Chapter 2 I present the thesis statement, which captures the overarching scheme of the individual chapters incorporated in this dissertation. Then, in Chapter 3, I provide the necessary background to understand the operation of blockchains and some of the major challenges they face, and provide a definition for the blockchain Network Layer. In Chapter 4, I present an analysis of the scalability problem, and demonstrate that its root-cause is a bottleneck at the blockchain Network Layer. I further outline a new networking primitive, the Blockchain Distribution Network (BDN), which enables blockchains to overcome both the scalability problem and blockchain mining centralization, and present empirical results from the deployment of bloXroute, the first Blockchain Distribution Network. Next, in Chapter 5 I present a novel networking utilization method to enable the application of

blockchains in new fields, focusing on the decentralization of the search engine industry, and to mitigate mining wastefulness. Finally, in Chapter 6 I summarize my contributions and conclude.



CHAPTER 2

Thesis

The blockchain Network Layer and the networking resources utilized by blockchains hold the key to some of the most pressing challenges blockchains face, including scalability, mining centralization, utility, and wastefulness.

CHAPTER 3

Blockchain Fundamentals and the Blockchain Network Layer

In this chapter I provide an overview of the operation of Bitcoin to demonstrate the fundamental principals of blockchains, and the necessary background to understand the importance of the blockchain Network layer. I then continue to outline the blockchain stack, and provide a definition for the blockchain Network Layer and the functionalities it includes.

3.1. The Operation of Bitcoin

3.1.1. Bitcoin Users

Bitcoin [75, 10] is the first blockchain system, and the first cryptocurrency to gain significant popularity and to become a household name. While some cryptocurrencies predate Bitcoin [9, 29], none had gained any significant traction outside the cypherpunk community [50]. At its core, Bitcoin is a Peer-to-Peer (P2P) Electronic Cash System which allows its users to hold a balance of Bitcoins, and to transact Bitcoins among themselves. Said transactions are batched into blocks, which are recorded by all peers, and the resulting chain of blocks, i.e., the blockchain, defines a consensus over which transactions took place. While the Bitcoin white paper itself describes the blockchain as a distributed timestamp server, it is oftentimes referred to as a distributed ledger, as its main function is to record financial transactions and balances.

To understand how Bitcoin transactions are created and the blockchain maintained, assume a user, Alice, wishes to buy an item from a different user, Bob, and to pay in Bitcoin. Each Bitcoin user controls a wallet, which is a simple private and public key pair. The public key (or addresses derived from the public key) are used to maintain user balances, while the private key is used to prove ownership over said balances. To pay Bob, Alice locally creates a new transaction $t_{A\to B}$, which specifies an amount of Bitcoins which is to be passed from her address to Bob's address, and then signs it using her private key. Alice then sends $t_{A\to B}$ to the Bitcoin nodes she is connected to, to be propagated to the entire Bitcoin P2P network.

It is worth noting that Alice and Bob are Bitcoin users, and therefore in control of their Bitcoin wallets, and that any Bitcoin user may control any number of wallets, each of which controlling any number of public keys and addresses. However, Alice and Bob may or may not be running a Bitcoin node.

3.1.2. Nodes, Miners and Validators

The Bitcoin white paper refers to participants in the P2P network which maintain a local copy of the blockchain and attempt to produce new blocks as "nodes". However, later work had led to a more fine-grained, yet somewhat ambiguous, terminology to describe the different kinds of blockchain participants. First, a comparison made in the Bitcoin white paper between the creation of a new block and the mining of gold had led to the use of the term *mining* to describe the creation of new blocks using Proof-of-Work (PoW), and the term *miner* to describe a node engaged in mining. Second, some [4] consider the term "node" to also describe participants which maintain a local copy of the blockchain without

attempting to produce new blocks. These participants are often referred to as non-mining nodes. Lastly, some blockchains had experimented with the use of Proof-of-Stake (PoS) and other mechanisms to replace Bitcoin's use of PoW, where the producers of new blocks are referred to as validators [114, 113] or block-producers (BPs) [24]. Throughout this thesis I use the term "miner" to describe participants which attempt to produce new blocks by any means, and the term "non-mining node" to describe participants which do not attempt to produce new blocks. Lastly, I use the general term "nodes" to describe participants of all kinds, including both miners and non-mining nodes.

Every Bitcoin node to receive $t_{A\to B}$ would validate that:

- (1) The balance of Alice's addresses specified in $t_{A\to B}$ is greater or equal to the amount spent.
- (2) $t_{A\to B}$ contains a signature which can only be created with knowledge of Alice's private key.

If these two conditions are met, $t_{A\to B}$ is deemed valid, and any node to receive it will propagate it to its peers. While all Bitcoin nodes would receive and propagate transactions, only miners attempt to aggregate the transactions they receive into a new block, to be appended to the blockchain. It is only after transactions are included in the blockchain that they are considered to have taken place, while transactions which still await to be included are not.

There are two monetary incentives for miners to engage in mining. First, each block contains a unique transaction, called the *coinbase transaction*, which passes some amount of Bitcoins to its miner's address. Thus, miners do not attempt to produce a new block from the kindness of their hearts. Rather, they compete, as each miner attempts to