

BLOCK WITHHOLDING RESILIENCE

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ABSTRACT. It has been known for some time that the Nakamoto consensus as implemented in the Bitcoin protocol is not totally aligned with the individual interests of the participants. More precisely, it has been shown that block withholding mining strategies can exploit the difficulty adjustment algorithm of the protocol and obtain an unfair advantage. However, we show that a modification of the difficulty adjustment formula taking into account orphan blocks makes honest mining the only optimal strategy. Surprisingly, this is still true when orphan blocks are rewarded with an amount smaller to the official block reward. This gives an incentive to signal orphan blocks. The results are independent of the connectivity of the attacker.

1. INTRODUCTION

Satoshi Nakamoto’s foundational article describes Bitcoin protocol [12]. Bitcoin is an electronic currency and bitcoin transactions operate through a computer network. This network is *permissionless*: anyone can freely enter or leave the network [3, 15]. Moreover, there is no central authority acting as a referee. The minting algorithm is implemented in the protocol. Transactions are packed in chronologically ordered blocks that form an unforgeable public ledger: *the blockchain*. Certain nodes of the network, called miners, play a special role. They secure the blockchain through intensive computation by a “proof of work”, a technique originally invented to fight email spam and denial of service attacks. A miner creates a new block of transactions to add to the blockchain by solving a cryptographic puzzle by brute force iterating a simple algorithm. For this computational work he is rewarded by a *coinbase reward* of newly minted bitcoins. This mechanism generates the Bitcoin monetary mass.

This article investigates mining strategies for Bitcoin. A mining strategy determines each time where the miner should mine according to the history of the discovered blocks. Most of the time he has the choice between mining on the last block of the official blockchain or on top of a fork that he keeps secret. The strategy also specifies whether the miner should make public any previously discovered blocks that he has kept secret. Satoshi Nakamoto proposes mining always on top of the last block of the

2010 *Mathematics Subject Classification.* 68M01, 60G40, 91A60.

Key words and phrases. Bitcoin, blockchain, proof-of-work, selfish mining, martingale.

official blockchain, and always making public his discovered blocks. He thought that this strategy called "honest strategy" was the most profitable strategy. But, indeed, other more profitable strategies are possible.

Mining is at the heart of Nakamoto's consensus. Nakamoto's consensus has the remarkable feature that it is a probabilistic valid consensus in an open network, whereas former known consensus only existed in closed systems [15]. In general, when the miner sticks to a mining strategy, the evolution of the network from different states follows the random discovery of blocks. The number of such states is countable. A mining strategy gives a dynamical system in its associated Markov chain. The strategy is repetitive: Regularly, and in finite time, the miner comes back the initial state, i.e. to mine on the last block of the official blockchain which corresponds to the state 0. The Markov chain is therefore recurrent [4]. This "state machine" model is popular in the literature. Each transition on the Markov chain comes with rewards earned by the miners, but these rewards are not immediately earned by the miners but later (when the network returns to the initial state). Then it is possible to calculate the profitability of a mining strategy. On the long run, when the difficulty adjustment has stabilized, official blocks arrive on average every ten minutes, then the profitability is proportional to the percentage of blocks mined by the miner in the official blockchain (see Section 3.2 below). One can compute this proportion by computing the stationary probability of the Markov chain, which only requires to invert the transition matrix [5]. If one wishes to prove general optimality results that hold for any mining strategy, such as the two results presented in this article, we need to proceed differently. The main technique is the use of Martingale Theory. For this, we extend the point of view of Satoshi Nakamoto when he tried to model the evolution of the network when computing the probability of success of a double spend attack using Poisson processes [12, 7, 6]. In this setup we are able to use Doob's martingale theorem. It is difficult to conceive a proof of these results without using Martingale Theory and the authors do not know of an alternative proof.

The two general results presented are culminate part of the literature on deviant mining strategies. These strategies have in common to be block withholding mining where the miner does not always mine on the last block of the official blockchain and times properly when to make his block findings public. After showing the existence of such strategies and calculating their profitability, we look for the optimal strategy highlighting a counter-intuitive phenomena: in some cases, the miner may have an interest in mining against the whole network on a secret fork whose height is lower than the height of the official blockchain (trailing mining) [1, 5, 11, 14]. Several solutions were then put forward to limit the effectiveness of deviant strategies. Then, it was understood that this was an attack on a weakness of the Difficulty Adjustment Algorithm (DAA) [8]. Some arguments were presented on how to change the DAA taking into account the production of orphan blocks. Ethereum implemented this

partially rewarding uncle blocks, before adopting a completely different consensus mechanism in 2022 (Proof of Stake). The literature on the study of deviant mining strategies has been abundant and the reader can consult [10] for a recent survey on the subject. Several recent papers with numerical simulations have confirmed the relevance of including the orphan block count in the DAA [18, 17]. The main result of this article is to show that a modification of Bitcoin’s DAA including the count of orphan blocks neutralizes block withholding attacks because they become non-profitable. It is proved that we can even reward all orphan blocks and this ensures that they are recorded in the blockchain data.

This article is self-contained. We introduce a very simple mining strategy (the “1+2 strategy” in Section 4) which shows in the simplest way that the honest strategy is not optimal under the usual DAA. We start in the next section reviewing the basics of mining on Bitcoin, that can be skipped by the knowledgeable reader.

2. HOW BITCOIN WORKS

2.1. Nodes. The Bitcoin network is a peer-to-peer network made up of thousands of ”nodes” connected around the world, forming an irreducible and highly connected graph. All nodes play or can play the same role and perform the same operations. The nodes exchange information that consists of more or less complicated transactions and blocks of validated transactions. The blockchain is a database that defines the ledger of all confirmed transactions. The mempool is the set of all transactions in waiting for a confirmation in a block. Each time a node receives a transaction, it examines whether the transaction is legal, in the proper format, and checks that it does not conflict with other transactions already in its mempool. When this is the case, the transaction is added to its mempool and broadcasted to neighboring nodes.

2.2. Mining. Some of the nodes of the network perform a mining activity. A miner is a particular node that seeks to build up a new block. By definition, a \mathcal{B} block is a set of data whose maximum size is about 2 Mega Bytes. It is formed by a reference to an old block, a set of transactions drawn from the miner’s mempool, a creation date, the mining difficulty Δ and a parameter called ”nonce”. The goal is to obtain a block \mathcal{B} such the hash of its header is below some threshold:

$$(1) \quad h(\mathcal{B}) < \frac{1}{\Delta}$$

where h is the SHA-256◦SHA-256 function where SHA-256 is the cryptographical hash function, and Δ is called the *difficulty*. If successful, the miner receives a reward as a coinbase transaction. The reward decreases by half every four years (the “halving”). The difficulty parameter Δ is adjusted regularly. The current difficulty adjustment algorithm allows blockwithholding attacks, i.e. the miner can obtain an advantage

by withholding blocks and releasing them at the appropriate timing. This type of attack exploits the difficulty adjustment algorithm that evaluates the total hashrate in an erroneous way, only considering validated blocks and forgetting about orphan blocks (that fulfill the proof of work but are displaced from the blockchain by other competing blocks). The purpose of this article is to show that this problem can be corrected using an improved difficulty adjustment mechanism that evaluates properly the total hashrate by taking into account orphan blocks.

2.3. Mining strategies. Why should miners immediately release a newly discovered block? This is implicitly assumed in the Bitcoin founding article, but in fact it is not properly incentivized. Could a miner validating a block try to widen the gap even further by secretly mining on top of that block? Could he devise a block withholding strategy giving him an advantage compared to the honest strategy?

Definition 2.1. *The official blockchain is the chain of blocks with the most of proof-of-work.*

In other words, the official blockchain is the chain of blocks which maximizes the quantity $\sum \Delta_i$ where Δ_i is the difficulty parameter included in the i -th block. Most of the time it is the longest blockchain because the difficulty parameter is locally constant (updated every 2016 block period).

Definition 2.2. *The honest strategy consists in always mining on top of the last block of the official blockchain.*

2.4. Performance of a mining strategy. A mining strategy is repetitive in the sense that the miner will return, to its starting point after a finite time. The miner has performed a strategy cycle during this period. We call such a strategy with finite expected return time, a *finite strategy* (also *integrable strategy* as been used). We note τ the random duration of this cycle and G the miner's gain accumulated during this cycle. We use as a unit of wealth the average value contained in a block (i.e., average value of transaction fees contained in a block plus value of a coinbase). Mathematically speaking τ is a stopping time. We consider only cycles with expected finite duration: $\mathbb{E}[\tau] < \infty$. If a miner repeats his strategy n times, he will gain per unit time

$$\frac{G_1 + \dots + G_n}{\tau_1 + \dots + \tau_n} = \frac{\frac{G_1 + \dots + G_n}{n}}{\frac{\tau_1 + \dots + \tau_n}{n}}$$

which converges to $\frac{\mathbb{E}[G]}{\mathbb{E}[\tau]}$ according to the strong law of numbers (the assumption $\mathbb{E}[\tau] < \infty$ implies that $\mathbb{E}[G] < \infty$). Similarly, the cost per unit time of the miner over the long term is $\frac{\mathbb{E}[C]}{\mathbb{E}[\tau]}$ where C is the cost per cycle of his mining activity and

the miner's net income per unit time is therefore $\frac{\mathbb{E}[G]}{\mathbb{E}[\tau]} - \frac{\mathbb{E}[C]}{\mathbb{E}[\tau]}$. However, the cost of his mining activity per unit of time does not depend on whether or not the miner keeps blocks secret (it depends on the cost of electricity, the price of his equipment, the salaries paid to employees for a mining company, etc). Whether he makes blocks public or not has no impact on his cost per unit of time. Therefore, comparing two mining strategies with the same average operating cost per unit of time, a rational miner will choose the strategy that maximizes his income per unit of time in the long run $\Gamma = \frac{\mathbb{E}[G]}{\mathbb{E}[\tau]}$.

Definition 2.3. *The profitability ratio of an integrable mining activity is $\Gamma = \frac{\mathbb{E}[G]}{\mathbb{E}[\tau]}$ where G is the gain per cycle and τ the duration of a cycle.*

Note 2.4. According to the profitability analysis from [8] (see also [2, 14]), what counts is the yield per unit time in the long run, that is, the limit of $\frac{G_1 + \dots + G_n}{\tau_1 + \dots + \tau_n}$ which converges to $\frac{\mathbb{E}[G]}{\mathbb{E}[\tau]}$, and not the average yield per unit time per cycle $\mathbb{E}\left[\frac{G}{\tau}\right]$. The two quantities are not equal. See also Note 4.1 below.

3. MINING MODEL AND NOTATIONS

We use the widely adopted model and notations that Satoshi Nakamoto proposed in his Bitcoin founding article (see [12] and [7]). We consider a miner who is a possible attacker (or a group of miners) against the rest of the network consisting of honest miners all following the rules of the Bitcoin protocol. Since the hash function used in Bitcoin mining operations is pseudorandom, the time \mathbf{T} (resp. \mathbf{T}') taken by the honest miners (resp. attacker) to discover a block is a random variable following an exponential law (see [7]). We denote by α (resp. α') the parameter of the exponential law. We have $\mathbb{E}[\mathbf{T}] = \frac{1}{\alpha}$ (resp. $\mathbb{E}[\mathbf{T}'] = \frac{1}{\alpha'}$). In other words, α (resp. α') is the average speed taken by honest miners (resp. attacker) to discover a block.

Definition 3.1. *For $t \in \mathbb{R}_+$, we denote $N(t)$ (resp. $N'(t)$) the number of blocks mined by honest miners (resp. attacker) between 0 and t .*

The counting processes $N(t)$ and $N'(t)$ are Poisson processes of parameters α and α' (see [7]). Let h (resp. h') be the number of hashes per second computed by the honest miners (resp. attacker). This is the absolute hash power of the honest miners (resp. attacker). The mining difficulty Δ represents the number of hashes that one has to compute on average before finding a proof of work. It is related to the average

time taken to discover a block. We have $h \cdot \mathbb{E}[\mathbf{T}] = h' \cdot \mathbb{E}[\mathbf{T}'] = \Delta$. It follows that

$$(2) \quad \alpha = \frac{h}{\Delta}$$

$$(3) \quad \alpha' = \frac{h'}{\Delta}$$

Since the two variables \mathbf{T} and \mathbf{T}' are independent, we also have $\mathbb{P}[\mathbf{T}' < \mathbf{T}] = \frac{\alpha'}{\alpha + \alpha'} = \frac{h'}{h + h'}$. Therefore, the probability that the attacker discovers a block before the other miners is equal to its relative hash power. We make the assumption that this remains constant over time. We keep Nakamoto's notation for relative hashing powers of miners [12].

Definition 3.2. *We denote by p (resp. q) be the relative hashing power of the honest miners (resp. attacker).*

In other words, $q = \frac{\alpha'}{\alpha + \alpha'}$ and $p = 1 - q$. Note that the network (the honest miners and the attacker) finds a block in $\inf(\mathbf{T}, \mathbf{T}')$. This is again an exponential law of parameter $\alpha + \alpha'$ because \mathbf{T} and \mathbf{T}' are independent [13]. Therefore, $\mathbb{E}[\inf(\mathbf{T}, \mathbf{T}')] = \frac{1}{\alpha + \alpha'}$ and $\alpha = \frac{p}{\mathbb{E}[\inf(\mathbf{T}, \mathbf{T}')]}$ and $\alpha' = \frac{q}{\mathbb{E}[\inf(\mathbf{T}, \mathbf{T}')]}.$

3.1. First stability theorem. In this section only, we consider a simplified Bitcoin network without difficulty adjustment (that is, the difficulty parameter is assumed to be constant). Let $\tau_0 = \mathbb{E}[\inf(\mathbf{T}, \mathbf{T}')] = \frac{1}{\alpha + \alpha'}$ be the average time taken by the network to discover a block. Note that a priori here, $\tau_0 \neq 10$ minutes because there is no particular difficulty adjustment. It follows easily from the previous section that N (resp. N') is a Poisson process with parameter $\alpha = \frac{p}{\tau_0}$ (resp. $\alpha' = \frac{q}{\tau_0}$) [13].

Theorem 3.3. *If Γ is the profitability ratio for a finite mining strategy, we have $\Gamma \leq \frac{q}{\tau_0}$.*

Proof. Since the mining strategy is finite we have by definition $\mathbb{E}[\tau] < \infty$ where τ the stopping time of the duration a cycle. Let G be the number of official blocks mined by the attacker between 0 and τ . We have $G \leq N'(\tau)$. Let $n \geq 1$ and the truncated stopping time $\tau_n = \inf(\tau, n)$. The random variable $N'(\tau) - \alpha't$ is a martingale. Therefore, by Doob's Stopping Time Theorem, we have $\mathbb{E}[N'(\tau_n) - \alpha'\tau_n] = 0$, and $\mathbb{E}[N'(\tau_n)] = \alpha'\mathbb{E}[\tau_n]$. By making $n \rightarrow +\infty$ and using the Monotone Convergence Theorem, we obtain $\mathbb{E}[N'(\tau)] = \alpha'\mathbb{E}[\tau]$, which finally gives $\Gamma = \frac{\mathbb{E}[G]}{\mathbb{E}[\tau]} \leq \alpha' = \frac{q}{\tau_0}$. \square

Corollary 3.4. *Without difficulty adjustment, the optimal strategy is the honest one.*

Proof. If the attacker mines honestly, he earns on average q during a lapse τ_0 . Thus, the return on the honest strategy is $\frac{q}{\tau_0}$ which is also the maximum return in the previous Theorem. \square

This result was already proved in [8].

3.2. Effect of the difficulty adjustment on the profit per unit time. The difficulty adjustment ensures a lower bound for expected interblock time that allows the network to synchronize, and also an upper bound for transaction confirmation waiting time (i.e.inclusion in the blockchain). The goal of a regular difficulty adjustment is to have, on average, a lapse of 10 minutes to validate a block. More precisely, the difficulty parameter Δ is adjusted every n_0 blocks with $n_0 = 2016$. At each difficulty adjustment, the network calculates the time T taken to validate the last series of n_0 blocks. This work is done thanks to the timestamps of the blocks in the blockchain. If this time T is greater than 14 days $= n_0 \times 10$ minutes, the difficulty decreases. Otherwise, it increases. The new difficulty parameter Δ' is given by:

$$(4) \quad \Delta' = \Delta \times \frac{n_0 \times 10}{T}$$

where T is calculated here in minutes. When the mining difficulty Δ is changed, so are the parameters α and α' of the Poisson processes N and N' . The counting processes N and N' are piecewise Poisson processes whose parameters α and α' change each time the official blockchain progresses by n_0 blocks. If Δ varies and becomes equal to $\frac{\Delta}{\lambda}$, then α and α' are each multiplied by λ according to the previous formulas (2) and (3).

We consider the previous situation where a miner repeats some block withholding strategy (deviant or not) and the rest of the network is composed by honest miners. We assume that the total hash power remains constant. The first observation is that this miner can have a significant impact on the first difficulty adjustment if he conceals his blocks. For example, after a period of mining n_0 official blocks, if a miner adopts a block withholding strategy, this slows down the natural progression of the official blockchain. The network will generally take longer than the expected two weeks to mine 2016 blocks. This triggers a downward difficulty adjustment, making the mining activity more profitable afterwards. If in the long run the miner continues with the same strategy, the difficulty parameter will stabilize assuming that the total hashrate remains constant. Then, in such a period of constant difficulty, since the interblock time is 10 minutes, the duration τ of an attack cycle is proportional on average to the height progression H of the official blockchain during that cycle, i.e. $\mathbb{E}[\tau] = \mathbb{E}[H] \times 10$ where H . Although it is intuitively clear, this is proved by direct application of Wald's Theorem.

Thus we have the following Proposition:

Proposition 3.5. *Consider a finite mining strategy, i.e. $\mathbb{E}[\tau] < \infty$. Let G be the number of blocks per cycle mined by the miner added to the official blockchain and H denote the height progression of the official blockchain over a cycle. Then the profitability ratio of the strategy is $\Gamma = \frac{\mathbb{E}[G]}{\mathbb{E}[H]}$.*

Note that the honest strategy corresponds to a simple cycle that ends each time that a block is discovered. In this case, we have $\mathbb{E}[G] = q$ and $\mathbb{E}[H] = 1$ where q is the relative hash power of the miner. Thus, $\Gamma = q$ for the honest strategy and a rational miner has an incentive to adopt a deviant strategy if and only if $\Gamma > q$.

In the next section, we show that there are mining strategies with Γ greater than q (Section 4) and that a modification of the difficulty adjustment formula in the Bitcoin protocol results in Γ always less than q (Section 5).

4. BLOCK WITHHOLDING ATTACKS

It has been known since late 2013 that the rules of the Bitcoin protocol are not aligned with the interests of miners. The reader can consult [9] or [16] for an overview. In particular, when the miner has enough computing power, he can have an interest in adopting a deviant strategy. For the sake of self-containing of this article, we present next a simple example of deviant strategy, the “1+2 strategy”, showing that the honest strategy is not the most profitable one. This strategy is a simplified version of the selfish-mining strategy [5]. See Note 4.5 below. It is the simplest profitable block withholding mining strategy one can imagine.

Note 4.1. The profitability ratio Γ that we have introduced equals to the objective function defined in some literature as $\frac{r_1+r_2+\dots}{h_1+h_2+\dots}$ where each r_i (resp. h_i) denotes the reward in terms of number of blocks won by the attacker (resp. progression of the height of the official blockchain) coming from a new step in the random walk [2, 14]. To prove that the two notions are the same, we can group terms in the numerator which belong to a same excursion around state $\{0\}$:

$$r_1 + r_2 + \dots = (r_1 + \dots + r_{\nu_1}) + (r_{\nu_1+1} + \dots + r_{\nu_2}) + \dots$$

where ν_i is the $i - th$ returning time at the initial state $\{0\}$. The same thing occurs for the denominator. So,

$$\frac{r_1 + r_2 + \dots}{h_1 + h_2 + \dots} = \frac{R_1 + R_2 + \dots}{H_1 + H_2 + \dots} = \Gamma$$

The “1+2 strategy”.

Suppose that the network is composed of an attacker and a set of honest miners. The attack is defined as follows. The attacker starts mining. If the honest miners

are first to find a block then the attack ends and the attacker returns to mine on top of the last discovered block. If, on the other hand, the attacker manages to mine a block before the honest miners, then he keeps it secret and continues to mine on top of that block, seeking to widen the gap with the official blockchain. Then, regardless of the identity of the miners who validated the following blocks, as soon as two blocks have been discovered, the attack ends. If he is successful, i.e. if it has mined more blocks than the honest miners, the attacker reveals his secret blocks and imposes its "fork" (his block sequence) on the official blockchain, which then goes through a small reorganization. If this is not the case, it is useless for the attacker to broadcast anything since none of his blocks will be included in the official blockchain.

If we denote by A a block discovered by the attacker and by B a block discovered by the honest miners, the outcome of the attack can be encoded as a word formed with the letters A and B. The universe Ω of all possible cycles is :

$$\Omega = \{B, AAA, AAB, ABA, ABB\}$$

The name "1+2 strategy" reflects the fact that the attacker is waiting to discover a block (hence the "1"). Then, when he does, he waits for two blocks to be discovered, hence the "+2".

Example 4.2. We describe the cycle ABA. The attacker discovers a block, then the honest miners mine one too and finally the attacker mines the next one. In this case, the attack has succeeded and the attacker propagates his two secret blocks (the two A's). The official blockchain goes through a small reorganization: its now penultimate block (block "B") is replaced (it becomes an orphan block) and the height of the blockchain has increased by one block. The attacker earns the reward contained from his two blocks.

We can now compute the expected profitability of the "1+2" strategy. As before, we denote by q the relative hash power of the attacker and $p = 1 - q$ the one of the honest miners. Let G the number of blocks mined by the attacker and added to the official blockchain. Let also H be the progression of the height of the official blockchain during an attack cycle. We have the probability distribution

$$\mathbb{P}[B] = p, \mathbb{P}[AAA] = q^3, \mathbb{P}[AAB] = \mathbb{P}[ABA] = pq^2, \mathbb{P}[ABB] = p^2q$$

From this we can compute:

$$G(B) = G(ABB) = 0, G(AAA) = 3, G(AAB) = G(ABA) = 2$$

and

$$H(B) = 1, H(ABB) = H(AAB) = H(ABA) = 2, H(AAA) = 3$$

Therefore we can compute the expected values

$$\mathbb{E}[G] = p \cdot 0 + q^3 \cdot 3 + pq^2 \cdot 2 + pq^2 \cdot 2 + p^2q \cdot 0 = q^2(4 - q)$$

and

$$\mathbb{E}[H] = p \cdot 1 + q^3 \cdot 3 + pq^2 \cdot 2 + pq^2 \cdot 2 + p^2q \cdot 2 = 1 + q + q^3$$

From these computations it follows:

Proposition 4.3. *The profitability ratio of the "1+2" strategy is*

$$\Gamma = \frac{\mathbb{E}[G]}{\mathbb{E}[H]} = \frac{q^2 \cdot (4 - q)}{1 + q + q^3}$$

This proves that the "1+2 strategy" is more profitable than the honest strategy if and only if $\frac{q^2 \cdot (4 - q)}{1 + q + q^3} > q$. This happens only when

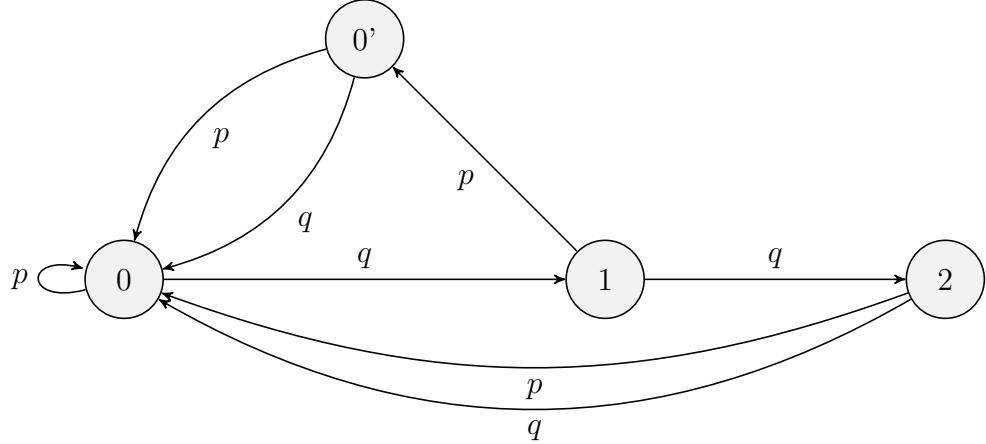
$$(5) \quad q > \sqrt{2} - 1$$

Thus, if a miner has a more than $\sqrt{2} - 1 \approx 41,4\%$ of hashpower, then he has no incentive to follow the protocol. From this simple example we reach the conclusion:

Proposition 4.4. *The rules of the Bitcoin protocol are not aligned with the self-interests of miners.*

One can show that the "1+2" strategy is the best possible when the miner's attack cycle ends after the discovery of three blocks.

Note 4.5. The strategy can also be described with the help of the following finite Markov chain with only four states. This is a truncated version of the "selfish mining"



random walk where states $\{n\}$ with $n > 2$ have disappeared [5]. State $\{0\}$ is the state when all miners mine on top of the same last block of the official blockchain. State $\{k\}$ for $k = 1, 2$ is the state when the attacker has just validated k secret block(s) and is mining on top of his secret fork whereas the honest miners haven't found any block yet. State $\{0'\}$ is the state when both the attacker and the honest miners

have mined a block and are trying to mine one another on top of their last block. Each state transition gives a reward r to the attacker and a contribution h to the increase of the height of the official blockchain. A possible modelization for (r, h) is the following. We have $(r, h) = (0, 1)$ from $\{0\}$ to $\{0\}$, $(r, h) = (0, 0)$ from $\{0\}$ to $\{1\}$, $(r, h) = (0, 1)$ from $\{1\}$ to $\{0'\}$, $(r, h) = (0, 1)$ from $\{0'\}$ to $\{0\}$ if the honest miners find the new block (probability p) and $(r, h) = (2, 1)$ otherwise (probability q). To simplify, the connectivity γ is set $\gamma = 0$. So, there are only two edges from $\{0'\}$ to $\{0\}$ depending on who mine the next block between the honest miners (probability p) and the attacker (probability q). We also have $(r, h) = (0, 0)$ from $\{1\}$ to $\{2\}$ and $(r, h) = (2, 2)$ from $\{2\}$ to $\{0\}$ if the honest miners find the new block (probability p) and $(r, h) = (3, 3)$ otherwise (probability q). This is just one possible modelization. We could set for instance $(r, h) = (2, 2)$ from $\{1\}$ to $\{2\}$ and $(r, h) = (0, 0)$ from $\{2\}$ to $\{0\}$ if the honest miners find the new block (probability p) and $(r, h) = (1, 1)$ otherwise (probability q). The contribution r represents a number of blocks that will end soon or later in the official blockchain. The only quantities of interest are $\sum_{i=1}^{\nu} r_i$ and $\sum_{i=1}^{\nu} h_i$ where ν is the first returning time at 0 and r_i is the reward won by the attacker coming from the transition from state $\{i-1\}$ to state $\{i\}$. Similarly, h_i is the contribution to the increase of the height of the official blockchain following a change of state from state $\{i-1\}$ to state $\{i\}$. The finite Markov chain has a stationary probability distribution π which is given by $\pi(\{0\}) = \frac{1}{1+2q}$, $\pi(\{k\}) = q \cdot \pi(\{k-1\})$ for $k > 0$ and $\pi(\{0'\}) = \frac{pq}{1+2q}$. From here, we find easily that $\mathbb{E}[r] = \frac{q^2}{1+2q}(4-q)$ and $\mathbb{E}[h] = \frac{1+q+q^2}{1+2q}$. Hence we get again $\Gamma = \frac{\mathbb{E}[r]}{\mathbb{E}[h]} = \frac{q^2(4-q)}{1+q+q^2}$ as in Proposition 4.3.

5. MODIFIED BITCOIN PROTOCOL

From Corollary 3.4 and Proposition 4.4 it appears that the origin of the problem comes from the difficulty adjustment formula that can be exploited by blockwithholding strategies. We can prevent these attacks using a different formula for the difficulty adjustment taking into account orphan blocks.

5.1. A more general difficulty adjustment formula. We consider a more general difficulty adjustment formula on the Bitcoin network of the form :

$$(6) \quad \Delta' = \Delta \cdot \frac{D \times 10}{T}$$

where D denotes the progression of a certain quantity, called *difficulty function*, over a validation period of n_0 official blocks. The introduction of a difficulty function and the notation D comes from [2]. In the case of current Bitcoin protocol we simply have that D grows linearly and at the end of the period $D = n_0 = 2016$. That is, the

difficulty function for Bitcoin increases one by one with each new block on the official blockchain.

We can consider more general difficulty functions D . With the new formula, the mining time of a cycle is now proportional to the progression of the difficulty function. The same argument as before shows the following result (see also [2]).

Proposition 5.1. *In the context of a modified Bitcoin protocol with a difficulty adjustment mechanism following relation (6), the rate of return of a mining strategy is $\Gamma = \frac{\mathbb{E}[G]}{\mathbb{E}[D]}$ where G is the number of blocks per cycle mined by the miner and added to the official blockchain and D denotes the progression of the difficulty function over that cycle.*

Then we can consider a modification of the Bitcoin protocol, where miners, in addition to their mining activity, will report the presence of orphan blocks by recording their proof of existence. It is possible to encourage miners to record the existence of orphan blocks by modifying the rule that defines the official blockchain and, as we will see later, even by rewarding the reporting of orphan blocks. The blockchain that maximizes the difficulty is the one reporting the most number of orphan blocks weighted by their difficulty (during a difficulty adjustment period it will be the longest). At the end of a validation period of n_0 official blocks, the adjustment of difficulty will be given by a similar formula as the standard one but of the form:

$$\Delta' = \Delta \cdot \frac{(n_0 + n_1) \times 10}{T}$$

where n_1 is the number of orphaned blocks reported during the last mining period of 2016 blocks. That means that we consider a difficulty function D that is not given by the height function of the blockchain but that increases by 1 at each time that a new block is registered in the official blockchain (whether this is an official block or just an orphan block detected by the network). The honest mining strategy corresponds to a cycle that ends as soon as a block is discovered, which still gives a profitability ratio equal to q . Hence, we have the following Proposition:

Corollary 5.2. *Consider a finite mining strategy with a length cycle τ and $\mathbb{E}[\tau] < \infty$. The number of blocks added to the official blockchain by the miner (resp. the progression of the difficulty function) between 0 and τ is $G(\tau)$ (resp. $D(\tau)$). This strategy is more profitable than the honest strategy if and only if*

$$\mathbb{E}[G(\tau)] > q\mathbb{E}[D(\tau)]$$

5.2. Stability of the Nakamoto consensus with general difficulty adjustment formula. Now assume that we are running the modified Bitcoin protocol with a difficulty adjustment formula as in (5.1) that takes into account orphan blocks.

Theorem 5.3. *For any finite mining strategy with $\mathbb{E}[\tau] < \infty$, we have*

$$\mathbb{E}[G(\tau)] \leq q\mathbb{E}[D(\tau)]$$

Proof. During an attack cycle, among the $N'(\tau)$ blocks that are mined by the attacker we consider Orph_A , resp. Off_A , the number of official, resp. orphan, blocks. Also, we denote $N(\tau)$ blocks mined by honest miners and among them Off_H , resp. Orph_H , the numbers of official resp. orphan, blocks mined by honest miners. We have

$$\begin{aligned} N(\tau) &= \text{Off}_H + \text{Orph}_H \\ N'(\tau) &= \text{Off}_A + \text{Orph}_A \end{aligned}$$

and $G(\tau) = \text{Off}_A$.

Orphan blocks by honest miners are public and will be registered sooner or later in the official blockchain. Only the orphan blocks of the attacker can remain secret. Therefore we have,

$$\text{Off}_A + \text{Off}_H + \text{Orph}_H \leq D(\tau)$$

The two processes N and N' are Poisson processes of parameters $\lambda \cdot p$ and $\lambda \cdot q$ where λ depends on the difficulty adjustment. If all miners are honest, then $\lambda = \frac{1}{\tau_0}$ with $\tau_0 = 10$ minutes. The condition $\mathbb{E}[\tau] < \infty$ gives that $\mathbb{E}[N(\tau)] = \lambda p \mathbb{E}[\tau]$ and $\mathbb{E}[N'(\tau)] = \lambda q \mathbb{E}[\tau]$. This follows from the fact that if M is a Poisson process of parameter α then the compensated process $M(t) - \alpha t$ is a martingale. Therefore,

$$p\mathbb{E}[\text{Off}_A] \leq p\mathbb{E}[N'(\tau)] = p\lambda q \mathbb{E}[\tau] = q\lambda p \mathbb{E}[\tau] = q\mathbb{E}[N(\tau)] = q\mathbb{E}[\text{Off}_H] + q\mathbb{E}[\text{Orph}_H]$$

which gives,

$$\begin{aligned} \mathbb{E}[G(\tau)] &= \mathbb{E}[\text{Off}_A] \\ &= p\mathbb{E}[\text{Off}_A] + q\mathbb{E}[\text{Off}_A] \\ &\leq q\mathbb{E}[\text{Off}_H] + q\mathbb{E}[\text{Orph}_H] + q\mathbb{E}[\text{Off}_A] \\ &\leq q \cdot \mathbb{E}[D(\tau)] \end{aligned}$$

which proves the Proposition. \square

Corollary 5.4. *In the modified Bitcoin protocol, the most profitable strategy is always the honest one, and this does not depend on the connectivity of the miner.*

We can indeed be more precise. We have :

$$\begin{aligned} p\mathbb{E}[\text{Off}_A] + p\mathbb{E}[\text{Orph}_A] &= p\mathbb{E}[N'(\tau)] \\ &= p\lambda q \mathbb{E}[\tau] \\ &= q\lambda p \mathbb{E}[\tau] \\ &= q\mathbb{E}[N(\tau)] \\ &= q\mathbb{E}[\text{Off}_H] + q\mathbb{E}[\text{Orph}_H] \end{aligned} \tag{7}$$

Among the Orph_A orphan blocks of the attacker, we note Orph'_A the orphan blocks made public by the attacker and thus detected by the network at a given moment (the others remain secret).

We have, on the one hand

$$\mathbb{E}[D(\tau)] = \mathbb{E}[\text{Off}_H] + \mathbb{E}[\text{Orph}_H] + \mathbb{E}[\text{Off}_A] + \mathbb{E}[\text{Orph}'_A]$$

and on the other hand according to (7),

$$\begin{aligned} \mathbb{E}[\text{Off}_A] + \mathbb{E}[\text{Orph}'_A] &= p\mathbb{E}[\text{Off}_A] + p\mathbb{E}[\text{Orph}'_A] + q\mathbb{E}[\text{Off}_A] + q\mathbb{E}[\text{Orph}'_A] \\ &\leq p\mathbb{E}[\text{Off}_A] + p\mathbb{E}[\text{Orph}_A] + q\mathbb{E}[\text{Off}_A] + q\mathbb{E}[\text{Orph}'_A] \\ &\leq q\mathbb{E}[\text{Off}_H] + q\mathbb{E}[\text{Orph}_H] + q\mathbb{E}[\text{Off}_A] + q\mathbb{E}[\text{Orph}'_A] \\ &\leq q \cdot \mathbb{E}[D(\tau)] \end{aligned}$$

Now assume that the protocol grants a reward x to any orphan block creator with $x \leq 1$. Then,

$$\begin{aligned} G(\tau) &= \text{Off}_A + x \cdot \text{Orph}'_A \\ &\leq \text{Off}_A + \text{Orph}'_A \end{aligned}$$

So, from the above,

$$\begin{aligned} \mathbb{E}[G(\tau)] &\leq \mathbb{E}[\text{Off}_A] + \mathbb{E}[\text{Orph}'_A] \\ &\leq q \cdot \mathbb{E}[D(\tau)] \end{aligned}$$

And we have proved the more general result:

Theorem 5.5. *Consider a modified Bitcoin protocol that grants a coinbase fraction reward $0 \leq x \leq 1$ for each block to orphan block creators. We assume that the difficulty adjustment mechanism is given by (5.1). Then the honest mining strategy is optimal. If $x < 1$ it is the only optimal strategy.*

To illustrate this theorem, we can revisit the example of the “1+2” strategy.

Example 5.6. *In the case of the “1+2” strategy, we have*

$$D(B) = 1, D(ABB) = 2, D(AAA) = D(AAB) = D(ABA) = 3$$

and we check that $\mathbb{E}[G] - q\mathbb{E}[D] = -p^3q < 0$. Note that if the attacker modifies his strategy and decides to publish his orphan block (the “A” in the sequence ABB), then in this case we have:

$$G(B) = 0, G(ABB) = x, G(AAA) = 3, G(AAB) = G(ABA) = 2$$

and

$$D(B) = 1, D(ABB) = D(AAA) = D(AAB) = D(ABA) = 3$$

Similarly, we check that $\mathbb{E}[G] - q\mathbb{E}[D] = -p^2q(1-x) \leq 0$.

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