Byzantine Cycle Mode: Scalable Bitcoin Mixing on Unequal Inputs

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Abstract. We present a new distributed algorithm, *Byzantine Cycle Mode* (BCM), that mixes bitcoin inputs of different sizes. The known decentralized risk-less bitcoin mixing algorithms either assume equal inputs for operation or become vulnerable if the inputs are unqual. BCM relaxes this constraint by transforming instances with unequal bitcoin amounts into smaller subinstances of equal amounts.

1 Introduction

The lack of anonymity in Bitcoin poses a privacy risk problem for users, and for commercial entities it represents risks to client confidentiality (critical for fiduciary custodians) and commercial confidentiality. Bitcoin's problem is exacerbated by its use by Bitcoin exchanges and merchant services, which are typically required by anti-money laundering regulations to record the mapping between user identities and Bitcoin addresses.

The community has taken to remediate Bitcoin's anonymity design flaw through creating decentralized mixing algorithms or creating alt coins with anonymity built in. This work aims to build on the Bitcoin-based approach by introducing a new mixing algorithm that uses the existing Bitcoin functionality. Most known decentralized bitcoin mixing algorithms, however, either require the numbers of bitcoin being mixed to be equal or their anonymity strongly depends on that being the case. For example, CoinSwap [[4]] and CoinShuffle [[5]] assume equal bitcoin amounts. CoinJoin [[1]] is subject to subset-sum attacks if the amounts are different. Finally, because mix-related transactions are distinguishable from non-mix-related transactions, the size of the anonymity set of a mix is directly dependent on the number of inputs and outputs. Thus

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we need a mix algorithm that fascilitates large-scale mixing on disparate inputs and outputs.

Suppose N players $i \in \mathcal{N} = \{1, 2, ..., N\}$ want to mix an (integer) number of satoshis, $\{n_i | i \in \mathcal{N}\}$, respectively. The players must jointly construct and agree on a mix specification and execute the mix transactions under the following conditions:

- 1. The algorithm is distributed and decentralized.
- 2. There is zero risk on any player's part of losing coins.
- 3. There are no trusted third parties invloved.
- 4. There are no additional mixing fees.
- 5. Only well-known cryptographic techniques are used.
- 6. The algorithm must scale to a large number of players
- 7. No one player may disproportionately influence the mix agreement
- 8. All honest players detect Byzantine faults and identify their source

The key contributions of this work are a new mixing algorithm satisfying the above conditions, and a new method for detecting Byzantine faults in the mix agreement and identifying their source. We present a new algorithm called *Byzantine Cycle Mode* (BCM), the name of which derives from its characteristics:

- Byzantine. BCM uses a Byzantine agreement process to construct a mix, where the output is based on randomized contributions from independent players. It tolerates Byzantine failures from up to 1/2 of the players, and allows the players to identify the source of the failures.
- Cycle. BCM decomposes the mix agreement output into sets of edgedisjoint network graph cycles, each of which define the set of players that will participate in the corresponding mix execution on the blockchain.
- Mode. The algorithm is called a mode because its relationship to the underlying mixing primitives (CoinJoin, CoinShuffle, etc) resembles that of encryption modes (such as counter mode and CBC) to underlying block ciphers. In the same way that encryption modes (e.g., GCM, EAX) extend the application of block ciphers (e.g., AES, 3DES) to large inputs which do not necessarily fit along the block size boundaries, BCM extends the application of mixing primitives to large numbers of users who are mixing unequal sizes.

Our threat model and computational model include the following assumptions:

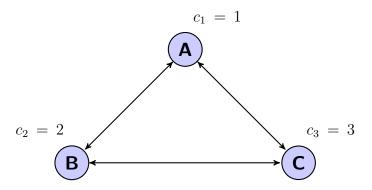
- 1. **Player ordering.** There exists a mutually understood ordering on the players, presumably provided during peer discovery (which is outside the scope of this work), such that the players are numbered 1, 2, ..., N. The choice of ordering is insignificant.
- 2. Connected. All the players have pairwise network connectivity to each other over which reliable messaging with authenticated encryption may be done.
- 3. **Secure messaging.** Players reveal their public keys during peer discovery, and all messaging is encrypted using secure ciphers and public-key encryption.
- 4. **Synchronized.** The protocol is executed in a sequence of rounds. Each round includes three steps from each player: receive a message from each player, perform a calculation, broadcast a response to all players.
- 5. **Broadcast.** Messages are broadcast to all peers and in a broadcast, an honest player sends the same message to all peers.
- 6. Active/adaptive adversary. An adversary may control a number of players, receive the messages they receive, and adapt its behavior based on the messages received. Because all honest players send the same messages to all players, the adversary is assumed to know all of the messages sent to any players.
- 7. **Reliable links.** The adversary may not control, reorder, drop, or change messages between players. This strong assumption is admissible because the mix agreement protocol is designed to be implemented in conjunction with a transport layer that supports reliable, ordered delivery with fast disconnect detection through heartbeats, and application-level replay capability.
- 8. **IP address privacy.** The IP addresses used in the network connections are obscured through onion routing.
- 9. Cryptography semantic security. The security assumptions of one-way functions, collision-resistant hash functions, and public-key cryptography are valid.

Unless otherwise noted, we use the term *broadcast* to mean that a player sends a message to each of his peers — as opposed to its common Bitcoin usage for denoting propagation of Bitcoin transactions. While the

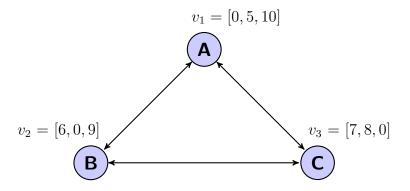
algorithms in this paper use integer representations of bitcoin amounts (as numbers of satoshis), the examples however give amounts in numbers of bitcoin, for the sake of presentation. For example, instead of 100,000,000, the number 1 is written.

2 Overview by Example

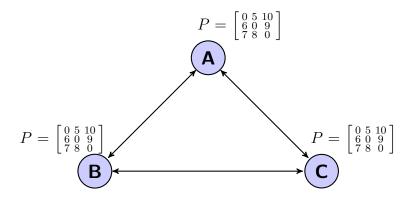
Let's suppose that Alice, Bob, and Charlie want to mix $c_1 = 1$, $c_2 = 2$, and $c_3 = 3$ bitcoins, respectively. The network graph is shown below.



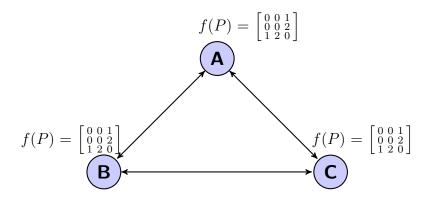
Step 1. Each player generates random inputs and broadcasts the inputs to each peer.



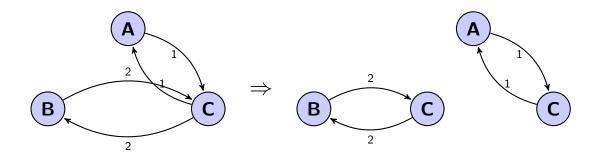
Step 2. Each player receives all of the inputs.



Step 3. Using Byzantine agreement, the players agree on the output of a function f, giving the bitcoin flow adjacency matrix.



Step 4. Finally, the players execute mixes (as determined by f) on the Bitcoin blockchain using known decentralized mixing techniques such as CoinJoin, CoinSwap or CoinShuffle.



Let's suppose that CoinShuffle is used. Then, players B and C perform a CoinShuffle on 2 BTC, while players A and C independently perform a CoinShuffle on 1 BTC.

3 The Mix Agreement Protocol

In this section we give the Byzantine Agreement protocol that allows the honest players to agree on how many coins each player will send to other players. A mix allocation (informally, a mix) is an $N \times N$ integer matrix $[x_{ij}]_{i,j\in\mathcal{N}}$ such that x_{ij} gives the number of satoshis that player i should transfer to player j as part of the mixing process. The total number of satoshis each player sends to his peers must equal that which he receives. Thus for all $i \in \mathcal{N}$, the ith row and ith column sum to the same value. Formally:

Definition 1 (Mix allocation) A mix allocation for $[n_1, n_2, ..., n_N]$ is an $N \times N$ integer matrix $[x_{ij}]$ such that

$$\forall i, \sum_{j=1}^{N} x_{ij} = n_i \tag{1}$$

$$\forall j, \sum_{i=1}^{N} x_{ij} = n_j \tag{2}$$

For example, three mix allocation matrices are given below. Note that mix allocation matrices need not be symmetric, and they also are not unique; when N > 1, there are multiple possible mix allocation matrices.

$$\begin{bmatrix} 0 & 0 & 1 \\ 0 & 0 & 2 \\ 1 & 2 & 0 \end{bmatrix} \qquad \begin{bmatrix} 0 & 0 & 1 \\ 1 & 0 & 2 \\ 0 & 3 & 0 \end{bmatrix} \qquad \begin{bmatrix} 0 & 0 & 0 & 1 \\ 1 & 0 & 0 & 1 \\ 0 & 1 & 0 & 2 \\ 0 & 1 & 3 & 0 \end{bmatrix}$$
(a) a mix for $[1, 2, 3]$ (b) a mix for $[1, 3, 3]$ (c) a mix for $[1, 2, 3, 4]$

Fig. 1: Three example mix allocation matrices

A mix allocation matrix defines a directed transaction graph of bitcoins between players, where the graph nodes are the players and the edges are the bitcoin amounts being transferred, either through a join or swap. The properties of these graphs are used in this work (see section 3.5) to decompose the task of mixing according to the allocation matrix into smaller, independent mixing tasks to be executed by the players.

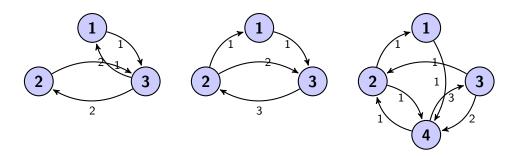


Fig. 2: Corresponding mix graphs for the three matrices in figure 1, respectively

3.1 Protocol Description

The result of the Mix Agreement protocol is that all honest players either agree on a mix allocation or they all abort the process. The below simplified protocol is run simultaneously by all players after player discovery is completed and secure network connections are established. At the termination of this protocol, if agreement is achieved, then each player uses

this mix allocation to execute the mix using a decentralized mix algorithm such as CoinJoin or CoinShuffle.

Algorithm 1: Mix Allocation Agreement Protocol

```
input : i, player's index
   input : N, number of players
 1 begin
        ExchangeInputs (i, N)
 2
        M_i(1) \leftarrow \texttt{ComputeMixAllocation}([v_1, v_2, \dots, v_N]);
 3
        for rounds s = 1, 2, 3 do
 4
            broadcast M_i(s);
 \mathbf{5}
 6
            for \forall j \neq i do
                receive M_i(s) from player j;
 7
                if \exists M = unique, most frequent value amongst
 8
                 \{M_j(s)\}_{j\neq i} then
                    M_i(s+1) \leftarrow M
 9
                 end
10
                 else abort:
11
                c(s) \leftarrow \text{count of } M;
12
                if c(s) \le \frac{1}{2}N then abort;
if c(s) > \frac{2}{3}N then assume agreement on M;
14
            end
15
        end
16
        if no agreement then abort;
17
        else ComputeCycles (M);
19 end
```

Note that agreement is not guaranteed from this protocol; any number of players may abort before agreement is achieved. As such, it is not a solution to the Byzantine Generals Problem, proper. This relaxation is admissible in the context of bitcoin mixing, because it is more desirable to allow a player to abort than it is to necessarily achieve agreement. Once a player aborts, he can subsequently retry another mix agreement with presumably different players.

3.2 Mix Allocation Computation

One technique for achieving Byzantine Agreement is to define a function that, when executed by honest players on inputs from all players, deterministically returns the same value for each honest player.[2] The key contribution of this work is the definition of such a function, ComputeMixAllocation(), for bitcoin mixes.

ComputeMixAllocation() is a deterministic, well-defined procedure that takes an $N \times N$ matrix and returns a canonical mix allocation based on its inputs. It is designed to return the same result for all honest players and to be robust to factors such as different implementation language or difference in computing environment/architecture.

Algorithm 2: ComputeMixAllocation

```
input: P = [p_{ij}], N \times N allocation priority matrix
    output: M = [x_{ij}], N \times N allocation matrix
 1 begin
         pairs \leftarrow \{(i,j) \mid i,j \in \mathcal{N}\}; // list of cell positions of P
 \mathbf{2}
         inventory \leftarrow [n_1, n_2, \dots, n_N];
                                                          // num coins available
 3
         capacity \leftarrow [n_1, n_2, \dots, n_N];
                                                                // num coins needed
 4
         sort pairs according to non-decreasing i;
 \mathbf{5}
        stable sort pairs according to non-increasing p_{ii};
 6
         for (i, j) \in \text{pairs } in \ order \ \mathbf{do}
 7
             x_{ij} \leftarrow min(\mathsf{capacity}_i, \mathsf{inventory}_i);
 8
             inventory_i \leftarrow inventory_i - x_{ij};
 9
             \mathsf{capacity}_j \leftarrow \mathsf{capacity}_j - x_{ij};
10
11
         return M = [x_{ij}]
12
13 end
```

ComputeMixAllocation() has the following properties:

1. The function runs in time $\mathcal{O}(N^2 \log N^2)$, due to the sorting of N^2 matrix cell positions.

- 2. The output matrix M has at most 2N non-zero entries. This is because for each iteration in the **for** loop, at least one of capacity_j or inventory_i gets annihilated, and this can happen at most 2N times.
- 3. The output is well-defined and robust in terms of consistency.

Below is an execution trace of ComputeMixAllocation() on [1,2,3] and $P = \begin{bmatrix} 0 & 5 & 10 \\ 6 & 0 & 9 \\ 7 & 8 & 0 \end{bmatrix}$. Since the result is reached by the end of iteration four, iterations five through eight are omitted.

iteration	(i,j)	M	$inventory\ capacity$	
0		$\begin{bmatrix} 0 & 0 & 0 \\ 0 & 0 & 0 \\ 0 & 0 & 0 \end{bmatrix}$	[1, 2, 3]	[1, 2, 3]
1	(1,3)	$\begin{bmatrix} 0 & 0 & 1 \\ 0 & 0 & 0 \\ 0 & 0 & 0 \end{bmatrix}$	[0, 2, 3]	[1, 2, 2]
2	(2,3)	$\begin{bmatrix} 0 & 0 & 1 \\ 0 & 0 & 2 \\ 0 & 0 & 0 \end{bmatrix}$	[0, 0, 3]	[1, 2, 0]
3	(3,2)	$\begin{bmatrix} 0 & 0 & 1 \\ 0 & 0 & 2 \\ 0 & 2 & 0 \end{bmatrix}$	[0, 0, 1]	[1, 0, 0]
4	(3,1)	$\begin{bmatrix} 0 & 0 & 1 \\ 0 & 0 & 2 \\ 1 & 2 & 0 \end{bmatrix}$	[0, 0, 0]	[0, 0, 0]

Fig. 3: Execution trace of ComputeMixAllocation().

3.3 Input Exchange

The algorithm ExchangeInputs exchanges inputs between the players and allows each honest player to detect Byzantine faults during the inputs

exchange. Authenticated Byzantine Agreement is used on the initial hash value exchange to protect against Sybil-like denial of service attacks, and each player first broadcasts a hash of his inputs to ensure that all players commit their inputs before learning the inputs of other players.

Let pk_i be the public key of player i, sk_i be the secret key of player i, H be a collision resistant hash function, and (S, V) be a secure public-key digital signature scheme.

Algorithm 3: ExchangeInputs

```
input : i, player's index
    input : c_i, num of satoshis player i wants to mix
    input : N, number of players
 1 begin
        v_i \leftarrow \texttt{GenerateInputs}(i, N);
        m_i \leftarrow H(c_i, v_i);
 3
        broadcast m_i || S(sk_i, m_i);
 4
        for \forall j \neq i do
 5
             receive m_j || S(sk_j, m_j) from player j;
 6
            if V(pk_j, m_j) = 1 then
 7
                 m'_i \leftarrow m_j || S(sk_j, m_j);
broadcast m'_i || S(sk_i, m'_i);
 8
 9
10
             end
        end
11
        for \forall j, k \neq i do
12
             Q = ;
13
             receive m_j || S(sk_j, m_j) || S(sk_k, m'_j);
14
            if V(pk_k, m'_i) = 1 then
15
              add m_i to Q;
16
             \mathbf{end}
17
        end
18
        for \forall j \neq i do
19
            if \exists unique, most frequent value m in Q_j then
20
                 \mathsf{commit}_i \leftarrow m;
21
22
             end
        end
23
        broadcast c_i, v_i;
\mathbf{24}
        for \forall j \neq i do
25
             receive v_j from player j;
26
             if H(c_i, v_i) \neq \text{commit}_i then
27
                 abort;
28
             end
29
        end
30
31 end
```

3.4 Input Generation

GenerateInputs() is a procedure that produces the player i's input contribution. It returns an integer vector $v_i = [v_{i1}, v_{i2}, \dots, v_{iN}]$ such that

$$\sum_{j=1}^{N} v_{ij} = C \tag{3}$$

$$v_{ij} \neq 0$$
, if $i \neq j$ (4)

$$v_{ii} = 0 (5)$$

where C is an apriori known constant. Once the inputs vectors are exchanged, the players form an $N \times N$ matrix $P = \begin{bmatrix} v_1 \\ v_2 \\ \vdots \\ v_N \end{bmatrix}$ that is the input to ComputeMixAllocation(). P represents a prioritization of which pairs ComputeMixAllocation() tries to match.

The significance of (3) is that it forces a trade-off for an active adversary attempting to control the outcome. Further, the fact that the inputs are generated in the blind means that an adaptive adversary does not have the opportunity to tailor his inputs based on input of his peers. The significance of (5) is that ComputeMixAllocation() prioritizes mixing distinct players' bitcoins rather than a player with himself.

The input vector, ideally, is generated uniformly over the space satisfying the above using a pseudo-random number generator. The quality of randomness in a player's contribution is at the discretion of the player. That said, the honest player is incentivized to use a good pseudo-random number generator, since doing so reduces the advantage a dishonest player has in knowing how their inputs will interact.

The constant C should be an integer sufficiently large such that the expected number of collisions in inputs is low. This ensures that the prioritization is determined primarily by the inputs, chosen by the players, rather than the player ordering, chosen somehow during peer discovery. By the Birthday Paradox analysis, C = 65,536 is sufficient for mixes for N up to a several hundred players. There is no cost in choosing a higher value for C.

3.5 Decomposition Into Cycles

The mix allocation matrices returned by ComputeMixAllocation() have equivalent representations as directed transaction graphs. Due to con-

straints (1) and (2), these graphs have a property known as flow conservation.

Definition 2 (Flow Conservation) Flow conservation is the property that for all vertices, the sum of the weights flowing into the vertex is equal to the sum of the weights flowing out of the vertex.

Any graph that has the flow conservation property can be decomposed into simple cycles that also have the flow conservation property.[[6]] ComputeCycles() does this using Johnson's well known graph algorithm. Because mix allocation matrices have at most 2N non-zero entries, the running time is $\mathcal{O}(N^2)$. For example, the following graphs are decomposed into simple cycles.

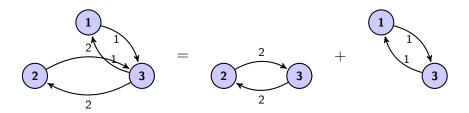


Fig. 4: Decomposition of 1(a) transaction graph.

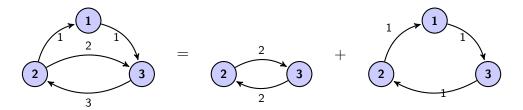


Fig. 5: Decomposition of 1(b) transaction graph.

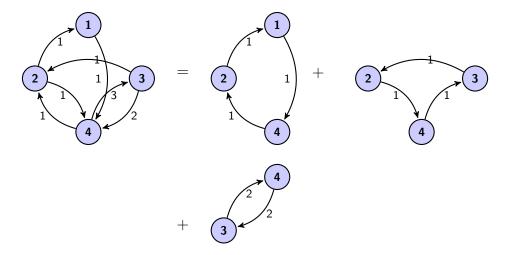


Fig. 6: Decomposition of 1(c) transaction graph.

Each of the simple cycles on the right hand side represent separate mixes to be executed by the nodes of that cycle. The mix amount is the weight that is in common between the edges of the cycle. These mixes can be executed independently of each other, and because of the flow conservation property of each cycle, the failure of any given cycle's mix does not pose an exposure risk to any players with respect to the other mixes.

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