# Trust Is Risk: Introducing a decentralized platform for financial trust

Orfeas Stefanos Thyfronitis Litos

National Technical University of Athens
orfeas.litos@hotmail.com

Dionysis Zindros<sup>†</sup> *University of Athens*dionyziz@di.uoa.gr

## 1 Abstract

Reputation in centralized systems typically uses stars and review-based trust. These systems require extensive manual intervention and secrecy to avoid manipulation. In decentralized systems this luxury is not available as the reputation system should be autonomous and open source. Previous peer-to-peer reputation systems define trust abstractly and do not allow for financial arguments pertaining to reputation. We propose a concrete sybil-resilient decentralized reputation system in which direct trust is defined as lines-of-credit using bitcoin's 1-of-2 multisig. We introduce a new model for bitcoin wallets in which user coins are split among trusted friends. Indirect trust is subsequently defined using a transitive property. This enables formal game theoretic arguments pertaining to risk analysis. Using our reputation model, we define financial risk and prove that risk and max flows are equivalent. We then propose several algorithms for the redistribution of trust so that a decision can be made on whether an anonymous third party can be indirectly trusted. In such a setting, the risk incurred by making a purchase from an anonymous vendor remains invariant. Finally, we prove the correctness of our algorithms and provide optimality arguments for various norms.

## 2 Introduction

# 3 Keywords

decentralized, trust, web-of-trust, bitcoin, multisig, line-of-credit, trust-as-risk, flow

# 4 Key points

## 5 Definitions

#### Definition 5.1 (Graph).

TrustIsRisk is represented by a sequence of wheighted directed graphs  $(\mathcal{G}_j)$  where  $\mathcal{G}_j = (\mathcal{V}_j, \mathcal{E}_j), j \in \mathbb{N}$ . Members of  $\mathcal{E}_j$  are tuples of two nodes from  $\mathcal{V}_j$ . More formally,  $e \in \mathcal{E}_j \Rightarrow \exists A, B \in \mathcal{V}_j : e = (A, B)$ . Also, since the graphs are wheighted, there exists a sequence of functions  $(c_j)$  with  $c_j : \mathcal{E}_j \to \mathbb{R}^+$ .

## Definition 5.2 (Players).

The set  $V_j = V(\mathcal{G}_j)$  is the set of all players in the network, otherwise understood as the set of all pseudonymous identities.

## **Definition 5.3** (Capital of A, $Cap_A$ ).

Total amount of value that exists in P2PKH in the UTXO and can be spent by A. We also define  $Cap_{A,j}$  as the total amount of value that exists in P2PKH in the UTXO and can be spent by A during turn j.

# **Definition 5.4** (Direct Trust from A to B after turn j, $DTr_{A\to B,j}$ ).

Total amount of value that exists in  $1/\{A, B\}$  multisigs in the UTXO in the end of turn j, where the money is deposited by A.

$$DTr_{A\to B,j} = \begin{cases} c_j(A,B), & if(A,B) \in \mathcal{E}_j \\ 0, & if(A,B) \notin \mathcal{E}_j \end{cases}$$

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A function or algorithm that has access to the graph  $\mathcal{G}_j$  has implicitly access to all direct trusts of this graph. The exception are the oracles, which in this case have access only to their incoming and outgoing direct trusts.

**Definition 5.5** ((In/Out) Neighbourhood of A on turn j,  $N^+(A)_j$ ,  $N^-(A)_j$ ,  $N(A)_j$ ).

- 1. Let  $N^+(A)_j$  be the set of players B that A directly trusts with any positive value at the end of turn j. More formally,  $N^+(A)_j = \{B \in \mathcal{V}_j : DTr_{A \to B, j} > 0\}$ .  $N^+(A)_j$  is called out neighbourhood of A on turn j. Let also  $S \subset \mathcal{V}_j$ .  $N^+(S)_j = \bigcup_{A \in S} N^+(A)_j$ .
- 2. Let  $N^-(A)_j$  be the set of players B that directly trust A with any positive value at the end of turn j. More formally,  $N^-(A)_j = \{B \in \mathcal{V}_j : DTr_{B \to A,j} > 0\}$ .  $N^-(A)_j$  is called in neighbourhood of A on turn j. Let also  $S \subset \mathcal{V}_j$ .  $N^-(S)_j = \bigcup_{A \in S} N^-(A)_j$ .
- 3. Let  $N(A)_j$  be the set of players B that either directly trust or are directly trusted by A with any positive value at the end of turn j. More formally,  $N(A)_j = N^+(A)_j \cup N^-(A)_j$ .  $N(A)_j$  is called neighbourhood of A on turn j. Let also  $S \subset \mathcal{V}_j$ .  $N(S)_j = N^+(S)_j \cup N^-(S)_j$ .
- 4. Let  $N(A)_{j,i}$  (respectively  $N^+(A)_{j,i}, N^-(A)_{j,i}, N(S)_{j,i}, N^+(S)_{j,i}, N^-(S)_{j,i}, S \subset \mathcal{V}_j$ ) be the *i*-th element of set  $N(A)_j$  (respectively of  $N^+(A)_j, N^-(A)_j, N(S)_j, N^+(S)_j, N^-(S)_j$ ), according to an arbitrary but fixed enumeration of the set players.

**Definition 5.6** (Total incoming/outgoing trust of A in turn j,  $in_{A,j}$ ,  $out_{A,j}$ ).

$$in_{A,j} = \sum_{v \in N^{-}(A)_{j}} DTr_{v \to A,j}$$
$$out_{A,j} = \sum_{v \in N^{+}(A)_{j}} DTr_{A \to v,j}$$

#### Definition 5.7 (Turns).

The game we are describing is turn-based. Let  $DTr_{B\to A,j}$  be B's direct trust to A in turn j. In each turn j exactly one player  $A \in \mathcal{V}$ , A = Player(j), chooses an action (according to a certain strategy) that can be one of the following, or a finite combination thereof:

- 1. Steal value  $y_B, 0 \le y_B \le DTr_{B \to A, i-1}$  from  $B \in N^-(A)$ .  $DTr_{B \to A, i} = DTr_{B \to A, i-1} y_B$ .  $(Steal(y_B, B))$
- 2. Add value  $y_B$ ,  $-DTr_{A\to B,j-1} \leq y_B$  to  $B \in \mathcal{V}$ .  $DTr_{A\to B,j} = DTr_{A\to B,j-1} + y_B$ . When  $y_B < 0$ , we say that A reduces her trust to B by  $-y_B$ , when  $y_B > 0$ , we say that A increases her trust to B by  $y_B$ . If  $DTr_{A\to B,j-1} = 0$ , then we say that A starts directly trusting B.  $(Add(y_B, B))$

If player A chooses no action in her turn, we say that she passes her turn. Also, let  $Y_{st}, Y_{add}$  be the total value to be stolen and added respectively by A in her turn, j. For a turn to be feasible, it must hold that  $Y_{add} - Y_{st} \leq Cap_{A,j-1}$ . We set  $Cap_{A,j} = Cap_{A,j-1} + Y_{st} - Y_{add}$ . Moreover, player A is not allowed to choose two actions of the same kind against the same player in the same turn.

The set of actions a player makes in turn j is  $Turn_j$ . Examples:

- $Turn_{j_1} = \emptyset$
- $Turn_{j_2} = \{Steal(y, B), Add(w, B)\}\$  (given that  $DTr_{B \to A, j_2 1} \le y \land -DTr_{A \to B, j_2 1} \le w \land y w \le Cap_{A, j_2 1}$ , where  $A = Player(j_2)$ )
- $Turn_{j_3} = \{Steal(x, B), Add(y, C), Add(w, D)\}\$  (given that  $DTr_{B \to A, j_3 1} \le x \land -DTr_{A \to C, j_3 1} \le y \land -DTr_{A \to D, j_3 1} \le w \land x y w \le Cap_{A, j_3 1}$ , where  $A = Player(j_3)$ )
- $Turn_{j_4} = \{Steal(x, B), Steal(y, B)\}$  is not a valid turn because it contains two Steal() actions against the same player. If  $x + y \leq DTr_{B \to A}$ , the correct alternative would be  $Turn_{j_4} = \{Steal(x + y, B)\}$ , where  $A = Player(j_4)$ .

### **Definition 5.8** (Previous/Next turn of a player).

Let  $j \in \mathbb{N}$  a turn with Player(j) = A. We define prev(j), next(j) as the previous and next turn that A is chosen to play respectively. If j is the first turn that A plays, prev(j) = 0. More formally,

$$prev(j) = \begin{cases} \max{\{k \in \mathbb{N} : k < j \land Player(k) = A\}}, & \{k \in \mathbb{N} : k < j \land Player(k) = A\} \neq \emptyset \\ 0, & \{k \in \mathbb{N} : k < j \land Player(k) = A\} = \emptyset \end{cases}$$

$$next(j) = \min \{ k \in \mathbb{N} : k > j \land Player(k) = A \}$$

next(j) is always well defined with the assumption that eventually everybody plays.

## **Definition 5.9** (A is stolen x).

Let j, j' be two consecutive turns of A (next(j) = j'). We say that A has been stolen a value x between j and j' if  $out_{A,j} - out_{A,j'} = x > 0$ . If turns are not specified, we implicitly refer to the current and the previous turns.

### **Definition 5.10** (History).

We define History,  $\mathcal{H} = (\mathcal{H}_j)$ , as the sequence of all the tuples containing the sets of actions and the corresponding player.  $\mathcal{H}_j = (Player(j), Turn_j)$ .

### **Definition 5.11** (Conservative strategy).

A player A is said to follow the conservative strategy in turn j if for any value x that has been stolen from her since the previous turn she played, she substitutes it in her turn by stealing from others that trust her value equal to  $\min(x, in_{A,j})$  and she takes no other action. More formally, let  $j' = prev(j), Damage_j = out_{A,j'} - out_{A,j-1}$ . If Strategy(A) = Conservative, then  $\forall j \in \mathbb{N} : Player(j) = A$  it is

$$Turn_j = \begin{cases} \emptyset, & Damage_j \leq 0 \\ \bigcup\limits_{i=1}^k \{Steal(y_i, v_i)\}, & Damage_j > 0, N^-(A)_j = \{v_1, ..., v_k\} \end{cases}$$

In the second case, it is  $\sum_{i=1}^{k} y_i = \min(in_{A,j-1}, Damage_j)$ .

As we can see, the definition covers a multitude of options for the conservative player, since in case  $0 < Damage_j < in_{A,j-1}$  she can choose to distribute the Steal(s)() in any way she chooses, as long as  $\forall i, y_i \leq DTr_{N^-(A)_{j,i} \to A,j-1} \land \sum_{i=1}^{|N^-(A)_j|} y_i = Damage_j$ . The oracle remembers  $PrevOutTrust = out_{A,j'}$  for j' = prev(j) and can observe all incoming and outgoing direct trusts of player  $A, \forall v \in N^-(A)_{j-1}, DTr_{v \to A,j-1}, \forall v \in N^+(A)_{j-1}, DTr_{A \to v,j-1}$ . We note that  $N(A)_{j-1} = N(A)_j$ .

#### **Algorithm 1:** Conservative Oracle

```
Input: previous graph \mathcal{G}_{i-1}
    Output: Turn_i
 1 \mathcal{O}_{cons}(\mathcal{G}_{j-1}):
 2 NewOutTrust \leftarrow \sum_{v \in N^+(A)_{j-1}} DTr_{A \to v, j-1}
 3 NewInTrust \leftarrow
                            v \in N^{-}(A)_{j-1}
 4 Damage \leftarrow PrevOutTrust - NewOutTrust
 5 if Damage > 0 then
         if Damage \ge NewInTrust then
              Turn_i \leftarrow \emptyset
 7
              for v \in N^-(A)_{j-1} do
 8
                  Turn_j \leftarrow Turn_j \cup \{Steal(DTr_{v \rightarrow A, j-1}, v)\}
 9
         else
10
              (y_1,...,y_{|N^-(A)_{i-1}|}) \leftarrow \text{SelectSteal}(DTr_{N^-(A)_{j-1,1} \to A,j-1},...,
11
               DTr_{N^-(A)_{j-1,|N^-(A)_{j-1}|}\rightarrow A,j-1}, Damage)
              Turn_i \leftarrow \emptyset
12
              for i \leftarrow 1 to |N^-(A)_{i-1}| do
13
                 Turn_j \leftarrow Turn_j \cup \{Steal(y_i, N^-(A)_{j-1,i})\}
14
15 else
        Turn_j \leftarrow \emptyset
16
17 return Turn_i
```

```
SelectSteal() returns y_i, i \in [|N^-(A)_j|] : \forall i, y_i \leq DTr_{N^-(A)_{j,i} \to A}, \sum_{i=1}^{|N^-(A)_j|} y_i = Damage.
```

## **Definition 5.12** (Idle strategy).

A player A is said to follow the idle strategy if she passes in her turn. More formally, if Strategy(A) = Idle, then  $\forall j \in \mathbb{N} : Player(j) = A$  it is  $Turn_j = \emptyset$ .

## Algorithm 2: Idle Oracle

```
Input: previous graph \mathcal{G}_{j-1}
Output: Turn_j
1 \mathcal{O}_{idle}(\mathcal{G}_{j-1}):
2 return \emptyset
```

## **Definition 5.13** (Evil strategy).

A player A is said to follow the evil strategy if she steals value  $y_B = DTr_{B \to A, j-1} \ \forall \ B \in N^-(A)_j$  (steals all incoming direct trust) and reduces her trust to C by  $DTr_{A \to C, j-1} \ \forall \ C \in N^+(A)_j$  (nullifies her outgoing direct trust) in her turn. More formally, if Strategy(A) = Evil, then  $\forall j \in \mathbb{N} : Player(j) = A$  it is  $Turn_j = \{Steal(y_1, N^-(A)_{j,1}), ..., Steal(y_m, N^-(A)_{j,m}), Add(w_1, N^+(A)_{j,1}), ..., Add(w_l, N^+(A)_{j,l})\}$  where  $m = |N^-(A)_j|, l = |N^+(A)_j|, \forall i \in [m], y_i = DTr_{N^-(A)_{j,i} \to A, j-1}, \forall i \in [l], w_i = -DTr_{A \to N^+(A)_{j,i}, j-1}.$  We note again that  $N(A)_{j-1} = N(A)_j$ .

## Algorithm 3: Evil Oracle

```
Input: previous graph \mathcal{G}_{j-1}
Output: Turn_j

1 \mathcal{O}_{evil}(\mathcal{G}_{j-1}):
2 Turn_j \leftarrow \emptyset
3 for v \in N^-(A)_{j-1} do
4 \mid Turn_j \leftarrow Turn_j \cup \{Steal(DTr_{v \rightarrow A, j-1}, v)\}
5 for w \in N^+(A)_{j-1} do
6 \mid Turn_j \leftarrow Turn_j \cup \{Add(-DTr_{A \rightarrow v, j-1}, w)\}
7 return Turn_j
```

**Definition 5.14** (Indirect trust from  $A \in \mathcal{V}_j$  to  $B \in \mathcal{V}_j$ ,  $Tr_{A \to B,j}$ ).

Maximum possible value that can be stolen from A if B follows the evil strategy, A follows the idle strategy and everyone else  $(\mathcal{V} \setminus \{A, B\})$  follows the conservative strategy. More formally,

$$Tr_{A \to B,j} = \max_{j':j'>j,configurations} [out_{A,j} - out_{A,j'}]$$

where  $Strategy(A) = Idle, Strategy(B) = Evil, \forall C \in \mathcal{V} \setminus \{A, B\}, Strategy(C) = Conservative.$ 

**Definition 5.15** (Indirect trust from  $A \in \mathcal{V}_j$  to  $S \subset \mathcal{V}_j$ ,  $Tr_{A \to S,j}$ ).

Maximum possible value that can be stolen from A if all players in S follow the evil strategy, A follows the idle strategy and everyone else  $(\mathcal{V} \setminus (S \cup \{A\}))$  follows the conservative strategy. More formally,

$$Tr_{A \to S,j} = \max_{j': j' > j, configurations} [out_{A,j} - out_{A,j'}]$$

where  $Strategy(A) = Idle, \forall E \in S, Strategy(E) = Evil, \forall C \in V \setminus \{A, E\}, Strategy(C) = Conservative.$ 

**Definition 5.16** (Trust Reduction).

Let  $A, B \in \mathcal{V}$ ,  $x_i$  flow to  $N^+(A)_i$  resulting from maxFlow(A, B),  $u_i = DTr_{A \to N^+(A)_i, j-1}$ ,  $u_i' = DTr_{A \to N^+(A)_i, j}$ ,  $i \in [|N^+(A)|], j \in \mathbb{N}$ .

- 1. The Trust Reduction on neighbour  $i, \delta_i$  is defined as  $\delta_i = u_i u_i'$ .
- 2. The Flow Reduction on neigbour  $i, \Delta_i$  is defined as  $\Delta_i = x_i u_i'$ .

We will also use the standard notation for 1-norm and  $\infty$ -norm, that is:

1. 
$$||\delta_i||_1 = \sum_{i \in N^+(A)} \delta_i$$

2. 
$$||\delta_i||_{\infty} = \max_{i \in N^+(A)} \delta_i$$
.

**Definition 5.17** (Restricted Flow).

Let  $A, B \in \mathcal{V}, i \in [|N^+(A)|].$ 

- 1. Let  $F_{A_i \to B}$  be the flow from A to  $N^+(A)_i$  as calculated by the maxFlow(A, B)  $(x_i')$  when  $u_i' = u_i$ ,  $u_k' = 0 \ \forall k \in [|N^+(A)|] \land k \neq i$ .
- 2. Let  $S \subset N^+(A)$ . Let  $F_{A_S \to B}$  be the sum of flows from A to S as calculated by the  $\max Flow(A,B)$   $(\sum\limits_{i=1}^{|S|} x_i')$  when  $u_C' = u_C \ \forall C \in S, u_D' = 0 \ \forall D \in N^+(A) \setminus S.$

## **Definition 5.18** (Collusion).

A collusion of players  $S \subset \mathcal{V}$  is a set of players that is entirely controlled by a single entity in the physical world. From a game theoretic point of view, other players  $(v \in \mathcal{V} \setminus S)$  perceive the collusion as independent players with a distinct strategy each, whereas in reality they are all subject to a single strategy dictated by the controlling entity.

# 6 Theorems-Algorithms

The following algorithm has read access to direct trusts in  $\mathcal{G}_{j-1}$  and write access to direct trusts in  $\mathcal{G}_{j}$ .

## Algorithm 4: Execute Turn

```
Input: player A, old graph \mathcal{G}_{j-1}, old capital Cap_{A,j-1}, ProvisionalTurn
Output: new graph \mathcal{G}_{j}, new capital Cap_{A,j}, new history \mathcal{H}_{j}

1 executeTurn (A, \mathcal{G}_{j-1}, Cap_{A,j-1}, ProvisionalTurn):
2 (Turn_{j}, NewCap) \leftarrow \text{validateTurn}(A, \mathcal{G}_{j-1}, Cap_{A,j-1}, ProvisionalTurn)
3 return commitTurn (A, mathcalG_{j-1}, NewCap, Turn_{j})
```

#### **Algorithm 5:** Validate Turn

```
Input: player A, old graph \mathcal{G}_{i-1}, old capital Cap_{A,i-1}, ProvisionalTurn
    Output: Turn_i, new capital Cap_{A,i}
 1 validateTurn(A, \mathcal{G}_{j-1}, Cap_{A,j-1}, ProvisionalTurn):
 2 Y_{st} \leftarrow 0
 3 Y_{add} \leftarrow 0
 4 for action \in ProvisionalTurn do
        action match do
 5
        case Steal(y, w) do
 6
        if y > DTr_{w \to A, j-1} \lor y < 0 then
 7
            return \emptyset, Cap_{A,j-1}
        else
 9
           Y_{st} \leftarrow Y_{st} + y
10
        case Add(y, w) do
11
        if y < -DTr_{A \to w, j-1} then
12
13
            return \emptyset, Cap_{A,j-1}
        else
14
           Y_{add} \leftarrow Y_{add} + y
15
16 if Y_{add} - Y_{st} > Cap_{A,i-1} then
        return \emptyset, Cap_{A,j-1}
18 else
        return ProvisionalTurn, Cap_{A,j-1} + Y_{st} - Y_{add}
19
```

#### **Algorithm 6:** Commit Turn

```
Input: player A, old graph \mathcal{G}_{j-1}, old capital Cap_{A,j-1}, ProvisionalTurn
Output: new graph \mathcal{G}_j, new capital Cap_{A,j}, new history \mathcal{H}_j

1 commitTurn (A, \mathcal{G}_{j-1}, Cap_{A,j-1}, Turn_j):

2 for (v, w) \in \mathcal{E}_j do

3 | DTr_{v \to w,j} \leftarrow DTr_{v \to w,j-1}

4 for action \in Turn_j do

5 | action match do

6 | case Steal(y, w)| do

7 | DTr_{w \to A,j} \leftarrow DTr_{w \to A,j-1} - y|

8 | case Add(y, w)| do

9 | DTr_{A \to w,j} \leftarrow DTr_{A \to w,j} + y|

10 Cap_{A,j} \leftarrow NewCap

11 \mathcal{H}_j \leftarrow (Player(j), Turn_j)

12 | return \mathcal{G}_j, Cap_{A,j}, \mathcal{H}_j|
```

## Algorithm 7: TrustIsRisk Game

```
1 j \leftarrow 0

2 while True do

3 j \leftarrow j+1

4 v \stackrel{\$}{\leftarrow} \mathcal{V}_j

5 ProvisionalTurn \leftarrow \mathcal{O}_v(\mathcal{G}_{j-1})

6 (G_j, Cap_{v,j}, H_j) \leftarrow \texttt{executeTurn}(v, \mathcal{G}_{j-1}, Cap_{v,j-1}, ProvisionalTurn) Page 7 of 19
```

On turn 0, there is already a network in place.

else

if  $Loss_v = 0$  then

 $Angry \leftarrow Angry \setminus \{v\}$ 

 $Sad \leftarrow Sad \cup \{v\}$ 

if  $in_{v,j} = 0 \wedge Loss_v > 0$  then

 $Happy \leftarrow Happy \cup \{v\}$ 

 $Angry \leftarrow Angry \cup \{w\}$ 

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**27** 

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#### **Algorithm 8:** Transitive Steal **Input** : A idle player, E evil player Output: $\mathcal{H}$ history 1 $Angry \leftarrow \emptyset$ **2** $Happy \leftarrow \emptyset$ **3** $Sad \leftarrow \emptyset$ 4 for $v \in \mathcal{V}_0 \setminus \{E\}$ do $Loss_v \leftarrow 0$ if $v \neq A$ then $Happy \leftarrow Happy \cup \{v\}$ $\mathbf{8} \ i \leftarrow 0$ 9 while True do $j \leftarrow j + 1$ 10 $v \stackrel{\$}{\leftarrow} \mathcal{V}_i \setminus \{A\}$ 11 $Turn_j \leftarrow \mathcal{O}_v(\mathcal{G}_{j-1})$ 12 executeTurn ( $\mathcal{G}_{i-1}$ , $Cap_{v,j-1}$ , $Turn_j$ ) 13 for $action \in Turn_j$ do 14 action match do 15 case Steal(y, w) do 16 $exchange \leftarrow y$ **17** $Loss_w \leftarrow Loss_w + exchange$ 18 if $v \neq E$ then 19 $Loss_v \leftarrow Loss_v - exchange$ 20 if $w \neq A$ then 21 $Happy \leftarrow Happy \setminus \{w\}$ 22 if $in_{w,j} = 0$ then 23 $Sad \leftarrow Sad \cup \{w\}$

Let  $j_0$  be the first turn on which E is chosen to play. Until then, according to theorem 6.4, all players will pass their turn. Given that  $Damage_{v,j} = out_{v,j'} - out_{v,j}$  where j' = prev(j), the algorithm generates turns:

$$Turn_j = \begin{cases} \emptyset, & Damage_{v,j-1} = 0 \\ \bigcup\limits_{i=1}^k \{Steal(y_i,v_i)\}, & Damage_j > 0, N^-(A)_j = \{v_1,...,v_k\} \end{cases}$$

In the second case, it is  $\sum_{i=1}^{k} y_i = \min(in_{v,j-1}, Damage_{v,j-1})$ . From the definition of  $Damage_{v,j}$  and knowing that no strategy in this case can increase any direct trust, it is obvious that  $Damage_{v,j} \geq 0$ . Also, we can see that  $Loss_{v,j} \geq 0$  because if  $Loss_{v,j} < 0$ , then v has stolen more value than she has been stolen, thus she would not be following the conservative strategy.

```
Lemma 6.1 (Loss equivalent to Damage).

Let j \in \mathbb{N}, v \in \mathcal{V}_j \setminus \{A, E\}, v = Player(j). Then \min(in_{v,j}, Loss_{v,j}) = \min(in_{v,j}, Damage_{v,j}).

Proof. j \in \mathbb{N} : v = Player(j).

• v \in Happy_{j-1}. Then
```

- 1.  $v \in Happy_i$  because  $Turn_i = \emptyset$ ,
- 2.  $Loss_{v,j} = 0$  because otherwise  $v \notin Happy_j$ ,
- 3.  $Damage_{v,j} = 0$ , or else any reduction in direct trust to v would increase equally  $Loss_{v,j}$  (line 18), which cannot be decreased again but during an Angry player's turn (line 20).
- 4.  $in_{v,j} \geq 0$

Thus  $\min(in_{v,j}, Damage_{v,j}) = \min(in_{v,j}, Loss_{v,j}) = 0.$ 

- $v \in Sad_{j-1}$ . Then
  - 1.  $v \in Sad_i$  because  $Turn_i = \emptyset$ ,
  - 2.  $in_{v,i} = 0$  (lines 28-29),
  - 3.  $Damage_{v,j} \geq 0 \land Loss_{v,j} \geq 0$ .

Thus  $\min(in_{v,j}, Damage_{v,j}) = \min(in_{v,j}, Loss_{v,j}) = 0.$ 

- $v \in Angry_{j-1} \land v \in Happy_j$ . Then the same argument as in the first case holds, if we ignore the argument (1).
- $v \in Angry_i \land v \in Sad_i$ . Then the same argument as in the second case holds, if we ignore the argument

**Theorem 6.1** (Trust convergence theorem).

Let  $A, E \in \mathcal{V}$ : Strategy(A) = Idle, Strategy(E) = Evil,  $\forall C \in \mathcal{V} \setminus \{A, E\}$ , Strategy(C) = Conservativeand  $j_0 \in \mathbb{N}$ : Player $(j_0) = E$ . Given that all players eventually play, there exists a turn  $j' > j_0 : \forall j \geq j_0 : \forall j$  $j', Turn_i = \emptyset.$ 

*Proof.* First of all,  $\forall j > j_0 : Player(j) = E \Rightarrow Turn_j = \emptyset$  because E has already nullified his incoming and outgoing direct trusts in  $Turn_{i_0}$ , the evil strategy does not contain any case where direct trust is increased or where the evil player starts directly trusting another player and the other players do not follow a strategy in which they can choose to Add() trust to E, thus player E can do nothing  $\forall j > j_0$ . Also  $\forall j > j_0 : Player(j) = A \Rightarrow Turn_j = \emptyset$  because of the idle strategy that A follows. As far as the rest of the

players are concerned, consider the algorithm 8, which is a variation of the TrustIsRisk Game. As we can see from lines 5 and 18-20,  $\forall j, \sum_{v \in \mathcal{V}_j} Loss_v = in_{E,j_0-1}$ , that is the total loss is constant and equal

to the total value stolen by E. Also, as we can see in lines 3 and 29, which are the only lines where the Sadset is modified, once a player enters the Sad set, it is impossible to exit from this set. Also, we can see that players in  $Sad \cup Happy$  always pass their turn. We will now show that eventually the Anqry set will be empty, or equivalently that eventually every player will pass their turn. Suppose that it is possible to have an infinite amount of turns that players do not choose to pass. We know that the number of nodes is finite, thus this is possible only if  $\exists j_1 : \forall j \geq j_1, |Angry_i \cup Happy_i| = c > 0 \land Angry_i \neq \emptyset$  (the total number of angry and happy players cannot increase because no player leaves the Sad set and if it were to be decreased, it would eventually reach 0). Since  $Angry_j \neq \emptyset$ , a player v that will not pass her turn will eventually be chosen to play. According to algorithm 8, v will either deplete her incoming trust and enter the Sad set (line 29), which is contradicting  $|Angry_i \cup Happy_i| = c$ , or will steal enough value to enter the Happy set, that is v will achieve  $Loss_{v,j} = 0$ . Suppose that she has stolen m players. They, in their turn, will steal total value at least equal to the value stolen by v (since they cannot go sad, as explained above). However, this means that, since the total value being stolen will never be reduced and the turns this will happen are infinite, the players must steal an infinite amount of value, which is impossible because the direct trusts are finite in number and in value. More precisely, let  $\forall j \in \mathbb{N}, DTr_j = \sum_{w,w' \in \mathcal{V}} DTr_{w \to w',j}$ . Also, without loss of

generality, suppose that  $\forall j \geq j_1, out_{A,j} = out_{A,j_1}$ . In  $Turn_{j_1}$ , v steals  $St_{j_1} = \sum_{i=1}^{m} y_i$ . Thus  $DTr_{j_1} = DTr_{j_1-1} - St_{j_1}$ . Eventually there is a turn  $j_2$  when every

player in  $N^-(v)$  will have played. Then  $S_{j_2} \leq DTr_{j_1} - St_{j_1} = DTr_{j_1-1} - 2St_{j_1}$ , since all players in  $N^-(v)$  follow the conservative strategy, except maybe for A, who will not have been stolen anything due to the supposition.

Suppose that  $\exists k > 1: j_k > j_{k-1} > j_1 \Rightarrow DTr_{j_k} \leq DTr_{j_{k-1}} - St_{j_1}$ . Then there exists a subset of the Angry players, S, that have been stolen at least value  $St_{j_1}$  in total between the turns  $j_{k-1}$  and  $j_k$ , thus there exists a turn  $j_{k+1}$  such that all players in S will have played and thus  $DTr_{j_{k+1}} \leq DTr_{j_k} - St_{j_1}$ . We have proven by induction that  $\forall n \in \mathbb{N}, \exists j_n \in \mathbb{N}: DTr_{j_n} \leq DTr_{j_1-1} - nSt_{j_1}$ . However  $DTr_{j_1-1}, St_{j_1} \in \mathbb{N}$ , thus  $\exists n' \in \mathbb{N}: n'St_{j_1} > DTr_{j_1-1} \Rightarrow DTr_{j'_n} < 0$ . We have a contradiction because  $\forall w, w' \in \mathcal{V}, \forall j \in \mathbb{N}, DTr_{w \to w', j} \geq 0$ , thus eventually  $Angry = \emptyset$  and everybody passes.

### Theorem 6.2 (Saturation theorem).

Let s source,  $n = |N^+(s)|, x_i, i \in [n]$ , flows to s's neighbours as calculated by the maxFlow algorithm,  $u_i'$  new direct trusts to the n neighbours and  $x_i'$  new flows to the neighbours as calculated by the maxFlow algorithm with the new direct trusts,  $u_i'$ . It holds that  $\forall i \in [n], u_i' \leq x_i \Rightarrow x_i' = u_i'$ .

*Proof.*  $\forall i \in [n], x'_i > u'_i$  is impossible because a flow cannot be higher than its corresponding capacity. Thus  $\forall i \in [n], x'_i \leq u'_i$ . (1)

In the initial configuration of  $u_i$  and according to the flow problem setting, a combination of flows  $y_i$  such that  $\forall i \in [n], y_i = u_i'$  is a valid, albeit not necessarily maximum, configuration with a flow  $\sum_{i=1}^n y_i$ . Suppose that  $\exists k \in [n] : x_k' < u_k'$  as calculated by the maxFlow algorithm with the new direct trusts,  $u_i'$ . Then for the new maxFlow F' it holds that  $F' = \sum_{i=1}^n x_i' < \sum_{i=1}^n y_i$  since  $x_k' < y_k$  and (1) which is impossible because the configuration  $\forall i \in [n], x_i' = y_i$  is valid since  $\forall i \in [n], y_i = u_i'$  and also has a higher flow, thus the maxFlow algorithm will prefer the configuration with the higher flow. Thus we deduce that  $\forall i \in [n], x_i' = u_i'$ .

Let G be a weighted directed graph. According to (p.709 Introduction to algorithms (CLRS), third edition), if we consider each edge's capacity as its weight ( $\forall e \in E(G), c_e = c(e)$ ), we say that a flow assignment  $X = [x_{vw}]_{V(FG) \times V(FG)}$  with a source A and a sink B is valid when:

- 1.  $\forall (v, w) \in E(FG), x_{vw} \leq c_{vw}$
- 2.  $\forall v \in V(FG) \setminus \{A, B\}, \sum_{w \in N^+(v)} x_{wv} = \sum_{w \in N^-(v)} x_{vw}$
- 3.  $\sum_{v \in N^+(A)} x_{Av} = \sum_{v \in N^-(B)} x_{vB}$

#### Theorem 6.3 (Trust flow theorem - TOCHECK).

Let  $\mathcal{G}$  be a game graph at a specific turn and  $A, B \in V(\mathcal{G})$ . It holds that  $Tr_{A \to B} = MaxFlow(A, B)$ 

#### Proof.

Without loss of generality, we can suppose that the turn in which we are interested is 0 ( $\mathcal{G} = \mathcal{G}_0$ ). First we will show that the MaxFlow can be a result of a valid execution of algorithm 8 and afterwards we will show that each valid execution of algorithm 8 corresponds to a valid flow from A to B. Thus we will have proven that  $Tr_{A\to B} = MaxFlow(A, B)$ .

• We will first show that there exists an execution of algorithm 8 such that  $Loss_A = maxFlow(A, B)$ . Let X be the flows as returned by an execution of the maxFlow(A, B) algorithm on  $\mathcal{G}$ . It is known that all flows are DAGs [citation needed] and that all DAGs are a partial order of their nodes based on the partial ordering  $x_{vw} > 0 \Rightarrow v < w$  [citation needed]. From this partial order, we can create a total order with an algorithm such as topoSort [citation needed]. The maximum element of the total order is a node that does not have any outgoing flow. Removing any node from a DAG cannot create a cycle, thus the graph that remains after removing a node from a DAG is also a DAG, thus it has a total order as well, which can be chosen to be the same total order as before removing the node, except for the removed node. If the removed node was maximum or minimum, the new total order is obvious. We will prove our claim using induction.

- Player B is the maximum node in turn 0 because she is the sink of the MaxFlow algorithm, thus she is the first to be chosen to play and steals all her incoming and outgoing trust.  $\forall v \in$  $N^-(B)_0, x_{vB} \leq DTr_{v \to B,0}$  and  $\sum_{v \in N^-(B)_0} x_{vB} = maxFlow(A, B)$ . The graph  $\mathcal{G}_1 = \mathcal{G}_0 \setminus \{B\}$  is also
  - a DAG and corresponds to the previous total order if we remove the maximum element, B.
- Suppose that  $\forall j \in [k], k > 0$ , the player v corresponding to the maximum element is chosen to play for the first time, that  $\forall w \in N^-(v)_{j-1} (= N^-(v)_0), x_{wv} \leq y$  where  $Steal(y, w) \in Turn_k \land Turn$  $\sum_{w \in N^{-}(v)_{0}} x_{wv} = \sum_{w \in N^{+}(v)_{0}} x_{vw}.$
- For j = k + 1, Player(k + 1) = v' corresponds to the maximum element of the previous total order with the element v removed and it is the first time player v' plays, since v > v' in all previous steps thus v' was not maximum. It also holds that  $\forall w \in N^-(v)_0, x_{wv'} \leq DTr_{w \to v',0}$ since the  $x_{wv'}$  are chosen by the maxFlow algorithm with corresponding capacities the direct trusts and, since  $\sum_{w \in N^-(v')_0} x_{wv'} = \sum_{w \in N^+(v')_0} x_{v'w}$  and player v' has already been stolen value equal to  $\sum_{w \in N^+(v')_0} x_{v'w}$  (since she has no outgoing flow in turn j), player v' can choose to steal from  $v \in N^+(v')_0$

each player  $w \in N^-(v')_0$  value at least equal to  $x_{wv'}$  without violating the conservative strategy.

We have proven using induction that if the algorithm chooses only maximum nodes, after exactly  $|V(\mathcal{G}_0)|-1$  turns (we do not count idle player A) every player except for A will have stolen at least value equal to the flow passing through them and player A will have been stolen value exactly equal to  $maxFlow(A, B) \Rightarrow Loss_A = maxFlow(A, B)$ .

• We will now show that for any valid execution of algorithm 8 there exists at least one valid flow from A to B, such that  $Loss_A = \sum_{v \in N^+(A)_0} x_{Av}$ . Let j be a turn where 8 has converged (j exists, according

to theorem 6.1). Then  $Loss_{A,j} = out_{A,0} - out_{A,j}$ . We create a new graph  $\mathcal{G}'$  such that  $V(\mathcal{G}') = V(\mathcal{G}) \cup \mathcal{G}'$  $T, E(\mathcal{G}') = E(\mathcal{G}) \cup \{(T, v) : v \in Sad_j\} \cup (T, \tilde{A}), \forall (v, w) \in E(\mathcal{G}), c'_{vw} = DTr_{v \to w, 0} - DTr_{v \to w, j}, \forall v \in T, C_{vw} \in T, C_{vw}$  $Sad_j, c'_{Tv} = c'_{TA} = \infty$  (T is an auxiliary source that trusts infinitely A and all the Sad nodes). We execute the MaxFlow(T,B) algorithm on  $\mathcal{G}'$  and we get a flow  $X': \forall v, w \in V(\mathcal{G}), x'_{vw} = c'_{vw}$  (all the edges, except for the auxiliary ones, saturated). Thus  $\sum_{v \in N^+(A)_0} x_{Av} = Loss_{A,j}$ . If we create a new graph

 $\mathcal{G}''$  with  $V(\mathcal{G}'') = V(\mathcal{G}')$ ,  $E(\mathcal{G}'') = E(\mathcal{G}')$ ,  $\forall v \in Sad_j, c_{Tv}'' = 0, c_{TA}'' = \infty, \forall v, w \in V(\mathcal{G}), c_{vw}'' = c_{vw}$  (the auxiliary node trusts only A) and execute the MaxFlow(T,B) = X'' algorithm on  $\mathcal{G}''$ ,  $\sum_{v \in N^+(A)_0} x_{Av}'' = x_{Av}'' = x_{Av}''$ 

 $\sum_{v \in N^+(A)_0} x'_{Av} \text{ (the outgoing flow from $A$ will remain the same as in $\mathcal{G}'$) since no capacity accessible from $A$}$ 

has been modified (the only changed capacities are those that begin from T and there is no incoming flow to T) thus  $\sum_{v \in N^+(A)_0} x''_{Av} \ge \sum_{v \in N^+(A)_0} x'_{Av}$  and  $\sum_{v \in N^+(A)_0} x'_{Av} = \sum_{v \in N^+(A)_0} c'_{Av} = \sum_{v \in N^+(A)_0} c'_{Av}$  (the outgoing edges from A were already saturated) thus  $\sum_{v \in N^+(A)_0} x''_{Av} \le \sum_{v \in N^+(A)_0} x'_{Av}$ . Thus the resulting flow is equal to  $Loss_{A,j}$ , or  $\sum_{v \in N^+(A)_0} x''_{Av} = \sum_{v \in N^+(A)_0} c_{Av} = Loss_{A,j}$ .

We finally conclude that  $Tr_{A\to B} = MaxFlow(A, B)$ .

### **Theorem 6.4** (Conservative world theorem).

If everybody follows the conservative strategy, nobody steals any amount from anybody.

Suppose that there exists a subseries of History,  $(Turn_{j_k})$ , where  $Turn_{j_k} = \{Steal(y_1, B_1), ..., Steal(y_m, B_m)\}.$ This subseries must have an initial element,  $Turn_{j_1}$ . However,  $Player(j_1)$  follows the conservative strategy, thus somebody must have stolen from her as well, so  $Player(j_1)$  cannot be the initial element. We have a contradiction, thus there cannot exist a series of stealing actions when everybody is conservative.

**Theorem 6.5** (Trust transfer theorem (flow terminology)). Let s source, t sink,  $n = N^+(s)$ 

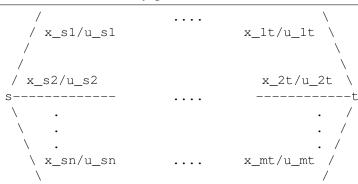
 $X = \{x_1, ..., x_n\}$  outgoing flows from s,

 $U = \{u_1, ..., u_n\}$  outgoing capacities from s,

V the value to be transferred.

Nodes apart from s, t follow the conservative strategy.

Obviously maxFlow =  $F = \sum_{i=1}^{n} x_i$ .



We create a new graph where

1. 
$$\sum_{i=1}^{n} u_i' = F - V$$

2. 
$$\forall i \in [n] \ u_i' \leq x_i$$

It holds that maxFlow' = F' = F - V.

*Proof.* From theorem 6.2 we can see that  $x_i' = u_i'$ . It holds that  $F' = \sum_{i=1}^n x_i' = \sum_{i=1}^n u_i' = F - V$ .

## Lemma 6.2 (Flow limit lemma).

It is impossible for the outgoing flow  $x_i$  from A to an out neighbour of A to be greater than  $F_{A_i \to B}$ . More formally,  $x_i \leq F_{A_i \to B}$ .

Proof. Suppose a configuration where  $\exists i: x_i > F_{A_i \to B}$ . If we reduce the capacities  $u_k, k \neq i$  the flow that passes from i in no case has to be reduced. Thus we can set  $\forall k \neq i, u'_k = 0$  and  $u'_i = u_i$ . Then  $\forall k \neq i, x'_k = 0, x'_i = x_i$  is a valid configuration and thus by definition  $F_{A_i \to B} = x'_i = x_i > F_{A_i \to B}$ , which is a contradiction. Thus  $\forall i \in [|N^+(A)|], x_i \leq F_{A_i \to B}$ .

#### **Theorem 6.6** (Trust-saving Theorem).

A configuration  $U': u_i' = F_{A_i \to B}$  for some  $i \in [|N^+(A)|]$  can yield the same maxFlow with a configuration  $U'': u_i'' = u_i, \forall k \in [|N^+(A)|], k \neq i, u_k'' = u_k'.$ 

*Proof.* We know that  $x_i \leq F_{A_i \to B}$  (lemma 6.2), thus we can see that any increase in  $u'_i$  beyond  $F_{A_i \to B}$  will not influence  $x_i$  and subsequently will not incur any change on the rest of the flows.

#### **Theorem 6.7** (Invariable trust reduction with naive algorithms).

Let A source,  $n = |N^+(A)|$  and  $u_i'$  new direct trusts. If  $\forall i \in [n], u_i' \leq x_i$ , Trust Reduction  $||\delta_i||_1$  is independent of  $x_i, u_i' \forall$  valid configurations of  $x_i$ 

*Proof.* Since  $\forall i \in [n], u'_i \leq x_i$  it is (according to 6.2)  $x'_i = u'_i$ , thus  $\delta_i = u_i - x'_i$ . We know that  $\sum_{i=1}^n x'_i = F - V$ ,

so we have 
$$||\delta_i||_1 = \sum_{i=1}^n \delta_i = \sum_{i=1}^n (u_i - x_i') = \sum_{i=1}^n u_i - F + V$$
 independent from  $x_i', u_i'$ 

# **Theorem 6.8** (Dependence impossibility theorem).

 $\frac{\partial x_k}{\partial x_i} = 0$  with  $x_i$  the flow from  $MaxFlow \Rightarrow \forall x_i' \leq x_i, \frac{\partial x_k}{\partial x_i} = 0$  ceteris paribus

Proof. TODO

Note: The maxFlow is the same in the following two cases: When a player chooses the evil strategy and when the same player chooses a variation of the evil strategy where she does not nullify her outgoing direct trust.

### Theorem 6.9 (Trust to multiple players).

Let  $S \subset \mathcal{V}, T$  auxiliary player such that  $\forall B \in S, DTr_{B \to T} = \infty$ . It holds that  $\forall A \in \mathcal{V} \setminus S, Tr_{A \to S} = maxFlow(A,T)$ .

*Proof.* If T chooses the evil strategy and all players in S play according to the conservative strategy, they will have to steal all their incoming direct trust, thus they will act in a way identical to following the evil strategy as far as maxFlow is concerned, thus, by 6.3,  $Tr_{A\to T} = maxFlow(A,T) = Tr_{A\to S}$ .

One of the primary aims of this system is to mitigate the danger for sybil attacks whilst maintaining fully decentralized autonomy. Let Eve be a possible attacker. Since participation in the network does not require any kind of registration, Eve can create any number of players. We will call the set of these players  $\mathcal{C}$ , or Sybil set. Moreover, Eve can invest any amount she chooses, thus she can arbitrarily set the direct trusts of any player  $C \in \mathcal{C}$  to any player  $P \in \mathcal{V}$  ( $DTr_{C \to P}$ ) and can also steal all incoming direct trust to these players. Additionally, we give Eve a set of players  $B \in \mathcal{B}$  that she has corrupted (the corrupted set), so she fully controls their direct trusts to any player  $P \in \mathcal{V}$  ( $DTr_{B \to P}$ ) and can also steal all incoming direct trust to these players. The players  $B \in \mathcal{B}$  are considered to be legitimate before the corruption, thus they can be directly trusted by any player  $P \in \mathcal{V}$  ( $DTr_{P \to B} \ge 0$ ). However, players  $C \in \mathcal{C}$  can be trusted only by players  $D \in \mathcal{B} \cup \mathcal{C}$  ( $DTr_{D \to C} \ge 0$ ) and not by players  $A \in \mathcal{V} \setminus (\mathcal{B} \cup \mathcal{C})$  ( $DTr_{A \to C} = 0$ ).

## **Lemma 6.3** $(\forall S \subset \mathcal{V}, v \in S \Rightarrow \forall w \in \mathcal{V}, (v, w) \notin MinCut)$ .

Let  $S \subset \mathcal{V}$ . When calculating maxFlow(A, S), it is impossible to have an edge  $(v, w) \in MinCut : v \in S$ .

Proof. Let T be the auxiliary node  $(\forall v \in S, c_{vT} = \infty)$ . Since  $out_A < \infty$ ,  $maxFlow(A, S) < \infty$ . All edges in the MinCut are saturated, thus  $\nexists v \in S : (v, T) \in MinCut$ , or else  $maxFlow(A, S) = \infty$ . Suppose that  $\exists v \in S, w \in \mathcal{V} : (v, w) \in MinCut$ . Then this edge must be saturated, that is  $x_{vw} = c_{vw} > 0$ . However, there exists an alternative flow configuration X' where  $\forall (u, u') \in \mathcal{E} \setminus \{(v, w), (v, T)\}, x'_{u,u'} = x_{u,u'}, x'_{vw} = 0, x'_{vT} = x_{vT} + x_{vw}$ , which is valid because  $\sum_{w \in N^+(v)} x_{vw} = \sum_{w \in N^+(v)} x'_{vw} \wedge c_{vT} = \infty \Rightarrow x'_{vT} \leq c_{vT}$  and X' is maximum as well because it carries exactly the same flow as X. Thus  $(v, w) \notin MinCut$ .

#### Theorem 6.10 (Sybil resilience).

Let  $\mathcal{B} \cup \mathcal{C} \subset \mathcal{V}$  ( $\mathcal{B} \cap \mathcal{C} = \emptyset$ ) be a collusion of players who are controlled by an adversary, Eve. Eve also controls the number of players in the Sybil set  $\mathcal{C}, |\mathcal{C}|$ , but players  $C \in \mathcal{C}$  are not directly trusted by players outside the collusion, contrary to players  $B \in \mathcal{B}$ , the corrupted set, who may be directly trusted by any player in  $\mathcal{V}$ . It holds that  $Tr_{A \to \mathcal{B}} = Tr_{A \to \mathcal{B} \cup \mathcal{C}}$ .

Proof. Suppose two separate games  $\mathcal{G}_1 = (\mathcal{V}_1, \mathcal{E}_1), \mathcal{G}_2 = (\mathcal{V}_2, \mathcal{E}_2)$  with  $(\mathcal{B} \subset \mathcal{V}(\mathcal{G})_1 \land \mathcal{B} \subset \mathcal{V}(\mathcal{G})_2) \land (\mathcal{C} \subset \mathcal{V}_1 \land \mathcal{C} \cap \mathcal{V}_2 = \emptyset)$ . Suppose also that there exist  $|\mathcal{B} \cup \mathcal{C}|$  consecutive turns for the first game and  $|\mathcal{B}|$  consecutive turns for the second game during which all the colluding players choose actions according to the evil strategy. More formally, suppose that  $\exists j \in \mathbb{N} : \forall d_1 \in [|\mathcal{B} \cup \mathcal{C}|], Player(j+d) \in \mathcal{B} \cup \mathcal{C} \land \forall d_1, d_2 \in [|\mathcal{B} \cup \mathcal{C}|], d_1 \neq d_2, Player(j+d_1) \neq Player(j+d_2) \land \forall d \in [|\mathcal{B} \cup \mathcal{C}|], Strategy(Player(j+d)) = Evil \land \forall j' \in [j]Player(j') \notin \mathcal{B} \cup \mathcal{C}$  for the first and likewise for the second game. Let  $T_1$  be an auxiliary player such that  $\forall D \in \mathcal{B} \cup \mathcal{C}, DTr_{D \to T_1} = \infty$  and  $T_2$  be another auxiliary player such that  $\forall B \in \mathcal{B}, DTr_{B \to T_2} = \infty$ . According to 6.9,  $Tr_{A \to \mathcal{B} \cup \mathcal{C}} = maxFlow(A, T_1), Tr_{A \to \mathcal{B}} = maxFlow(A, T_2)$ . From lemma 6.3, we know that  $\forall (v,w) \in MinCut, v \notin \mathcal{B} \cup \mathcal{C}$  and thus  $e \in MinCut_1 \Rightarrow e \in \mathcal{E}_2 \land e \in MinCut_2 \Rightarrow e \in \mathcal{E}_1 \land \forall e \in MinCut_1 \cup MinCut_2, c_1(e) = c_2(e)$ . Thus the flow  $X_1$  resulting from  $maxFlow(A, T_1)$  is a valid flow for the second case if we set  $\forall v \in \mathcal{V}_2 \setminus \mathcal{B}, \forall w \in \mathcal{V}_2, x_{vw,2} = x_{vw,1} \land \forall v \in \mathcal{B}, x_{vT_2,2} = \sum_{w \in N^+(v)} x_{vw,1} \land \forall v, w \in \mathcal{B}, x_{vw,2} \land \forall v, w \in \mathcal{B}, x_{vw,2} \land \forall v, w \in \mathcal{B}, x_{vw,2}$ 

 $\mathcal{B} \cup \mathcal{C}, x_{vw,2} = 0$  and the flow  $X_2$  resulting from  $maxFlow(A, T_2)$  is a valid flow for the first case if we set  $\forall v \in \mathcal{V}_1 \setminus (\mathcal{B} \cup \mathcal{C}), \forall w \in \mathcal{V}_1, x_{vw,1} = x_{vw,2} \land \forall v \in \mathcal{B}, x_{vT_1,1} = \sum_{w \in N^+(v)} x_{vw,2} \land \forall v \in \mathcal{C}, \forall w \in \mathcal{V}_1, x_{vw,1} = 0$ . From

these two observations, we deduce that the two maxFlows are equal, because otherwise the lower maxFlow of the two could be exchanged with the flow from the higher, thus it would not have been maximum in the first place. We conclude that  $maxFlow(A, T_1) = maxFlow(A, T_2) \Rightarrow Tr_{A \to \mathcal{B}} = Tr_{A \to \mathcal{B} \cup \mathcal{C}}$ .

We have proven that controlling  $|\mathcal{C}|$  is irrelevant for Eve, thus Sybil attacks are meaningless.

Here we show three naive algorithms for calculating new direct trusts so as to maintain invariable risk when paying a trusted party. To prove the correctness of the algorithms, it suffices to prove that  $\forall i \in [n] \ u'_i \leq x_i \text{ and that } \sum_{i=1}^n u'_i = F - V \text{ where } F = \sum_{i=1}^n x_i.$ 

## **Algorithm 9:** First-come, first-served trust transfer

```
Input: x_i flows, n = |N^+(s)|, V value
    Output: u'_i capacities
 \mathbf{1} \ F \leftarrow \sum_{i=1}^{n} x_i
 2 if F < V then

m return \perp
 4 F_{cur} \leftarrow F
 5 for i \leftarrow 1 to n do
    u_i' \leftarrow x_i
 7 i \leftarrow 1
 8 while F_{cur} > F - V do
         reduce \leftarrow \min(x_i, F_{cur} - F + V)
         F_{cur} \leftarrow F_{cur} - reduce
         u_i' \leftarrow x_i - reduce
11
        i \leftarrow i+1
13 return U' = \bigcup_{k=1}^{n} \{u'_k\}
```

Proof of correctness for algorithm 9.

- We will show that  $\forall i \in [n] \ u_i' \leq x_i$ . Let  $i \in [n]$ . In line 6 we can see that  $u'_i = x_i$  and the only other occurrence of  $u'_i$  is in line 11 where it is never increased ( $reduce \ge 0$ ), thus we see that, when returned,  $u_i' \le x_i$ .
- We will show that  $\sum_{i=1}^{n} u_i' = F V$ .

 $F_{cur,0} = F$ 

If  $F_{cur,i} \geq F - V$ , then  $F_{cur,i+1}$  does not exist because the while loop breaks after calculating  $F_{cur,i}$ .

Else  $F_{cur,i+1} = F_{cur,i} - \min(x_{i+1}, F_{cur,i} - F + V)$ . If for some  $i, \min(x_{i+1}, F_{cur,i} - F + V) = F_{cur,i} - F + V$ , then  $F_{cur,i+1} = F - V$ , so if  $F_{cur,i+1}$  exists,

then 
$$\forall k < i, F_{cur,k} = F_{cur,k-1} - x_k \Rightarrow F_{cur,i} = F - \sum_{k=1}^{i} x_k$$

Furthermore, if  $F_{cur,i+1} = F - V$  then  $u'_{i+1} = x_{i+1} - F_{cur,i} + F - V = x_i - F + \sum_{k=1}^{i-1} x_k + F - V = \sum_{k=1}^{i} x_k - V$ ,

 $\forall k \leq i, u'_k = 0 \text{ and } \forall k > i+1, u'_k = x_k.$ 

In total, we have  $\sum_{k=1}^{n} u'_k = \sum_{k=1}^{i} x_k - V + \sum_{k=i+1}^{n} x_k = \sum_{k=1}^{n} x_k - V \Rightarrow \sum_{k=1}^{n} u'_k = F - V$ .

Complexity of algorithm 9.

First we will prove that on line 13  $i \le n+1$ . Suppose that i > n+1 on line 13. This means that  $F_{cur,n}$ exists and  $F_{cur,n} = F - \sum_{i=1}^{n} x_i = 0 \le F - V$  since, according to the condition on line 2,  $F - V \ge 0$ . This means however that the while loop on line 8 will break, thus  $F_{cur,n+1}$  cannot exist and i = n+1 on line 13, which is a contradiction, thus  $i \leq n+1$  on line 13. Since i is incremented by 1 on every iteration of the while loop (line 12), the complexity of the while loop is O(n) in the worst case. The complexity of lines 2-4

and 7 is O(1) and the complexity of lines 1, 5-6 and 13 is O(n), thus the total complexity of algorithm 9 is O(n).

```
Algorithm 10: Absolute equality trust transfer (||\Delta_i||_{\infty} \text{ minimizer})
```

```
Input: x_i flows, n = |N^+(s)|, V value
    Output: u'_i capacities
 1 F \leftarrow \sum_{i=1}^{n} x_i
2 if F < V then
 _{3} return \perp
 4 for i \leftarrow 1 to n do
 u_i' \leftarrow x_i
 6 reduce \leftarrow \frac{V}{n}
 7 reduction \leftarrow 0
 \mathbf{8} \ empty \leftarrow 0
 \mathbf{9} \ i \leftarrow 0
10 while reduction < V do
        if u_i' > 0 then
11
            if x_i < reduce then
12
                 empty \leftarrow empty + 1
13
                 if empty < n then
          15
16
17
            else if x_i \ge reduce then
18
                reduction \leftarrow reduction + u'_i - (x_i - reduce)
19
               u_i' \leftarrow x_i - reduce
20
        i \leftarrow (i+1) mod \, n
22 return U' = \bigcup_{k=1}^n \{u'_k\}
```

We will start by showing some results useful for the following proofs. Let j be the number of iterations of the **while** loop for the rest of the proofs for algorithm 10 (think of i from line 20 without the mod n). First we will show that  $empty \leq n$ . empty is only modified on line 12 where it is incremented by 1. This

happens only when  $u_i' > 0$  (line 11), which is assigned the value 0 on line 16. We can see that the incrementation of *empty* can happen at most n times because |U'| = n. Since  $empty_0 = 0$ ,  $empty \le n$  at all times of the execution.

Next we will derive the recursive formulas for the various variables.

 $empty_{j+1} = \begin{cases} empty_{j}, & u'_{(j+1) \bmod n} = 0 \\ empty_{j} + 1, & u'_{(j+1) \bmod n} > 0 \land x_{(j+1) \bmod n} < reduce_{j} \\ empty_{j}, & u'_{(j+1) \bmod n} > 0 \land x_{(j+1) \bmod n} \ge reduce_{j} \end{cases}$   $reduce_{0} = \frac{V}{n}$   $reduce_{j+1} = \begin{cases} reduce_{j}, & u'_{(j+1) \bmod n} = 0 \\ reduce_{j} + \frac{reduce_{j} - x_{(j+1) \bmod n}}{n - empty_{j+1}}, & u'_{(j+1) \bmod n} > 0 \land x_{(j+1) \bmod n} < reduce_{j} \\ reduce_{j}, & u'_{(j+1) \bmod n} > 0 \land x_{(j+1) \bmod n} \ge reduce_{j} \end{cases}$   $reduction_{0} = 0$   $reduction_{j+1} = \begin{cases} reduction_{j}, & u'_{(j+1) \bmod n} \\ reduction_{j} + u'_{(j+1) \bmod n}, & u'_{(j+1) \bmod n} > 0 \land x_{(j+1) \bmod n} < reduce_{j} \end{cases}$   $reduction_{j+1} = \begin{cases} reduction_{j}, & u'_{(j+1) \bmod n} \\ reduction_{j} + u'_{(j+1) \bmod n}, & u'_{(j+1) \bmod n} > 0 \land x_{(j+1) \bmod n} < reduce_{j} \end{cases}$   $reduction_{j} + u'_{(j+1) \bmod n} + reduce_{j+1}, & u'_{(j+1) \bmod n} > 0 \land x_{(j+1) \bmod n} \ge reduce_{j} \end{cases}$ 

In the end, r = reduce is such that  $r = \frac{V - \sum\limits_{x \in S} x}{n - |S|}$  where  $S = \{\text{flows } y \text{ from } s \text{ to } N^+(s) \text{ according to } maxFlow : <math>y < r\}$ . Also,  $\sum\limits_{i=1}^n u_i' = \sum\limits_{i=1}^n \max{(0, x_i - r)}$ . TOPROVE

Proof of correctness for algorithm 10.

- We will show that  $\forall i \in [n] \ u_i' \leq x_i$ . On line  $9, \forall i \in [n] \ u_i' = x_i$ . Subsequently  $u_i'$  is modified on line 16, where it becomes equal to 0 and on line 19, where it is assigned  $x_i - reduce$ . It holds that  $x_i - reduce \leq x_i$  because initially  $reduce = \frac{V}{n} \geq 0$  and subsequently reduce is modified only on line 14 where it is increased (n > empty because of line 13 and  $reduce > x_i$  because of line 11, thus  $\frac{reduce - x_i}{n - empty} > 0$ ). We see that  $\forall i \in [n], u_i' \leq x_i$ .
- We will show that  $\sum_{i=1}^{n} u'_i = F V$ . The variable reduction keeps track of the total reduction that has happened and breaks the **while** loop when reduction  $\geq V$ . We will first show that reduction  $=\sum_{i=1}^{n} (x_i - u'_i)$  at all times and then we will prove that reduction =V at the end of the execution. Thus we will have proven that  $\sum_{i=1}^{n} u'_i = \sum_{i=1}^{n} x_i - V = F - V$ .
  - On line 9,  $u'_i = x_i \Rightarrow \sum_{i=1}^n (x_i u'_i) = 0$  and reduction = 0.

    On line 16,  $u'_i$  is reduced to 0 thus  $\sum_{i=1}^n (x_i u'_i)$  is increased by  $u'_i$ . Similarly, on line 15 reduction is increased by  $u'_i$ , the same as the increase in  $\sum_{i=1}^n (x_i u'_i)$ .

On line 19,  $u_i'$  is reduced by  $u_i' - x_i + reduce$  thus  $\sum_{i=1}^n (x_i - u_i')$  is increased by  $u_i' - x_i + reduce$ . On line 18, reduction is increased by  $u_i' - x_i + reduce$ , which is equal to the increase in  $\sum_{i=1}^n (x_i - u_i')$ . We also have to note that neither  $u_i'$  nor reduction is modified in any other way from line 10 and on, thus we conclude that  $reduction = \sum_{i=1}^n (x_i - u_i')$  at all times.

– Suppose that  $reduction_j > V$  on the line 21. Since  $reduction_j$  exists,  $reduction_{j-1} < V$ . If  $x_{j \mod n} < reduce_{j-1}$  then  $reduction_j = reduction_{j-1} + u'_{j \mod n}$ . Since  $reduction_j > V$ ,  $u'_{j \mod n} > V - reduction_{j-1}$ . TOCOMPLETE

Complexity of algorithm 10.

In the worst case scenario, each time we iterate over all capacities only the last non-zero capacity will become zero and every non-zero capacity must be recalculated. This means that every n steps exactly 1 capacity becomes zero and eventually all capacities (maybe except for one) become zero. Thus we need  $O(n^2)$  steps in the worst case.

A variation of this algorithm using a Fibonacci heap with complexity O(n) can be created, but that is part of further research.

Proof that algorithm 10 minimizes the  $||\Delta_i||_{\infty}$  norm.

Suppose that U' is the result of an execution of algorithm 10 that does not minimize the  $||\Delta_i||_{\infty}$  norm. Suppose that W is a valid solution that minimizes the  $||\Delta_i||_{\infty}$  norm. Let  $\delta$  be the minimum value of this norm. There exists  $i \in [n]$  such that  $x_i - w_i = \delta$  and  $u'_i < w_i$ . Because both U' and W are valid solutions  $(\sum_{i=1}^n u'_i = \sum_{i=1}^n w_i = F - V)$ , there must exist a set  $S \subset U'$  such that  $\forall u'_j \in S, u'_j > w_j$  TOCOMPLETE.  $\square$ 

## Algorithm 11: Proportional equality trust transfer

Input :  $x_i$  flows,  $n = |N^+(s)|$ , V value Output:  $u'_i$  capacities

 $\mathbf{1} \ F \leftarrow \sum_{i=1}^{n} x_i$ 

2 if F < V then

 $_3$  return  $_\perp$ 

4 for  $i \leftarrow 1$  to n do

 $\mathbf{5} \quad | \quad u_i' \leftarrow x_i - \frac{V}{F} x_i$ 

6 return  $U' = \bigcup_{k=1}^n \{u'_k\}$ 

Proof of correctness for algorithm 11.

- We will show that  $\forall i \in [n] \ u'_i \leq x_i$ . According to line 5, which is the only line where  $u'_i$  is changed,  $u'_i = x_i - \frac{V}{F}x_i \leq x_i$  since  $x_i, V, F > 0$  and  $V \leq F$ .
- We will show that  $\sum_{i=1}^{n} u'_{i} = F V$ .

With  $F = \sum_{i=1}^{n} x_i$ , on line 6 it holds that  $\sum_{i=1}^{n} u'_i = \sum_{i=1}^{n} (x_i - \frac{V}{F}x_i) = \sum_{i=1}^{n} x_i - \frac{V}{F}\sum_{i=1}^{n} x_i = F - V$ .

Complexity of algorithm 11.

The complexity of lines 1, 4-5 and 6 is O(n) and the complexity of lines 2-3 is O(1), thus the total complexity of algorithm 11 is O(n).

Naive algorithms result in  $u_i' \leq x_i$ , thus according to 6.7,  $||\delta_i||_1$  is invariable for any of the possible solutions U', which is not necessarily the minimum (usually it will be the maximum). The following algorithms concentrate on minimizing two  $\delta_i$  norms,  $||\delta_i||_{\infty}$  and  $||\delta_i||_1$ .

## **Algorithm 12:** $||\delta_i||_{\infty}$ minimizer

Input :  $X = \{x_i\}$  flows,  $n = |N^+(s)|$ , V value,  $\epsilon_1$ ,  $\epsilon_2$ 

Output:  $u'_i$  capacities

1 if  $\epsilon_1 < 0 \lor \epsilon_2 < 0$  then

 $_{\mathbf{2}}$  return  $\perp$ 

3  $F \leftarrow \sum_{i=1}^{n} x_i$ 

4 if F < V then

 $_{5}$  return  $\perp$ 

6  $\delta_{max} \leftarrow \max_{i \in [n]} \{u_i\}$ 

7  $\delta^* \leftarrow \text{BinSearch}(\theta, \delta_{max}, F\text{-}V, n, X, \epsilon_1, \epsilon_2)$ 

s for  $i \leftarrow 1$  to n do

 $\mathbf{9} \quad | \quad u_i' \leftarrow \max\left(u_i - \delta^*, 0\right)$ 

10 return  $U' = \bigcup_{k=1}^n \{u'_k\}$ 

Since trust should be considered as a continuous unit and binary search dissects the possible interval for the solution on each recursive call, inclusion of the  $\epsilon$ -parameters in BinSearch is necessary for the

algorithm to complete in a finite number of steps.

## Algorithm 12: function BinSearch

```
Input : bot, top, F', n, X, \epsilon_1, \epsilon_2
     Output: \delta^*
 1 if bot = top then
          return bot
 3 else
          for i \leftarrow 1 to n do
 4
          u_i' \leftarrow \max(0, u_i - \frac{top + bot}{2})
if maxFlow < F' - \epsilon_1 then
 5
 6
               return BinSearch (bot, \frac{top+bot}{2},F',n,X,\epsilon_1,\epsilon_2)
          else if maxFlow > F' + \epsilon_2 then
 8
               return BinSearch (\frac{top+bot}{2}, top, F', n, X.\epsilon_1, \epsilon_2)
 9
10
               return \frac{top+bot}{2}
11
```

Proof that  $maxFlow(\delta)$  is strictly decreasing for  $\delta : maxflow(\delta) < F$ .

Let  $maxFlow(\delta)$  be the maxFlow with  $\forall i \in [n], u'_i = max(0, u_i - \delta)$ . We will prove that the function  $\max Flow(\delta)$  is strictly decreasing for all  $\delta \leq \max_{i \in [n]} \{u_i\}$  such that  $\max Flow(\delta) < F$ .

Suppose that  $\exists \delta_1, \delta_2 : \delta_1 < \delta_2 \land maxFlow(\delta_1) \leq maxFlow(\delta_2) < F$ . We will work with configurations of

Suppose that  $\exists o_1, o_2 : o_1 \setminus o_2 \land nown = 0$ ,  $z_{i,j} = x_{i,j} = x_{i$ 

However, since  $x'_{i,j} \leq x_i, j \in \{1,2\}$ , the configuration  $[x''_{i,1} = x'_{i,2}, i \in N^+(s) \setminus S_1]$ ,  $[x''_{i,1} = x'_{i,1}, i \in S_1]$  is valid for  $\delta = \delta_1$  and then  $\sum_{i \in S_1} x''_{i,1} + \sum_{i \in N^+(s) \setminus S_1} x''_{i,1} = \sum_{i \in S_1} x'_{i,1} + \sum_{i \in N^+(s) \setminus S_1} x'_{i,2} > maxFlow(\delta_1)$ , contradiction. Thus  $maxFlow(\delta)$  is strictly decreasing.

We can see that if V > 0, F' = F - V < F thus if  $\delta \in (0, \max_{i \in [n]} \{u_i\}] : \max Flow(\delta) = F' \Rightarrow \delta = 0$  $\min ||\delta_i||_{\infty} : \max Flow(||\delta_i||_{\infty}) = F'.$ 

Proof of correctness for function 13.

Supposing that  $[F' - \epsilon_1, F' + \epsilon_2] \subset [maxFlow(top), maxFlow(bot)]$ , or equivalently  $maxFlow(top) \leq F' - \epsilon_1$  $\epsilon_1 \wedge maxFlow(bot) \geq F' + \epsilon_2$ , we will prove that  $maxFlow(\delta^*) \in [F' - \epsilon_1, F' + \epsilon_2]$ .

First of all, we should note that if an invocation of BinSearch returns without calling BinSearch again (line 2 or 11), its return value will be equal to the return value of the initial invocation of BinSearch, as we can see on lines 7 and 9, where the return value of the invoked BinSearch is returned without any modification. The case where BinSearch is called again is analyzed next:

- If  $\max Flow(\frac{top+bot}{2}) < F' \epsilon_1 < F'$  (line 6) then, since  $\max Flow(\delta)$  is strictly decreasing,  $\delta^* \in [bot, \frac{top+bot}{2})$ . As we see on line 7, the interval  $(\frac{top+bot}{2}, top]$  is discarded when the next BinSearch is called. Since  $F' + \epsilon_2 \leq \max Flow(bot)$ , we have  $[F' \epsilon_1, F' + \epsilon_2] \subset [\max Flow(\frac{top+bot}{2}), \max Flow(bot)]$ and the length of the available interval is divided by 2.
- Similarly, if  $\max Flow(\frac{top+bot}{2}) > F' + \epsilon_2 > F'$  (line 8) then  $\delta^* \in (\frac{top+bot}{2}, top]$ . According to line 9, the interval  $[bot, \frac{top+bot}{2})$  is discarded when the next BinSearch is called. Since  $F' - \epsilon_1 \ge maxFlow(top)$ , we have  $[F' - \epsilon_1, F' + \epsilon_2] \subset (maxFlow(top), maxFlow(\frac{top+bot}{2})]$  and the length of the available interval is divided by 2.

As we saw,  $[F' - \epsilon_1, F' + \epsilon_2] \subset [maxFlow(top), maxFlow(bot)]$  in every recursive call and top - bot is divided by 2 in every call. From topology we know that  $A \subset B \Rightarrow |A| < |B|$ , so the recursive calls

cannot continue infinitely.  $|[F'-\epsilon_1,F'+\epsilon_2]|=\epsilon_1+\epsilon_2$ . Let  $bot_0,top_0$  the input values given to the initial invocation of BinSearch,  $bot_j,top_j$  the input values given to the j-th recursive call of BinSearch and  $len_j=|[bot_j,top_j]|=top_j-bot_j$ . We have  $\forall j>0, len_j=top_j-bot_j=\frac{top_j-bot_j$ 

Complexity of function 13.

Lines 1-2 have complexity O(1), lines 4-5 have complexity O(n), lines 6-11 have complexity O(maxFlow) + O(BinSearch). As we saw in the proof of correctness for function 13, we need at most  $\log_2(\frac{top-bot}{\epsilon_1+\epsilon_2})$  recursive calls of BinSearch. Thus the function 13 has worst-case complexity  $O((maxFlow+n)\log_2(\frac{top-bot}{\epsilon_1+\epsilon_2}))$ .  $\square$ 

Proof of correctness for algorithm 12.

We will show that  $maxFlow \in [F - V - \epsilon_1, F - V + \epsilon_2]$ , with  $u_i'$  decided by algorithm 12.

Obviously  $\max Flow(0) = F, \max Flow(\max_{i \in [n]} \{u_i\}) = 0$ , thus  $\delta^* \in \max_{i \in [n]} \{u_i\}$ . According to the proof of correctness for function 13, we can directly see that  $\max Flow(\delta^*) \in [F - V - \epsilon_1, F - V + \epsilon_2]$ , given that  $\epsilon_1, \epsilon_2$  are chosen so that  $F - V - \epsilon_1 \geq 0, F - V + \epsilon_2 \leq F$ , so as to satisfy the condition  $[F' - \epsilon_1, F' + \epsilon_2] \subset [\max Flow(top), \max Flow(bot)]$ .

Complexity of algorithm 12.

The complexity of lines 1,2 and 4-6 is O(n) and the complexity of line 3 is  $O(BinSearch) = O((maxFlow + n)\log_2(\frac{\delta_{max}}{\epsilon_1+\epsilon_2}))$ , thus the total complexity of algorithm 12 is  $O((maxFlow + n)\log_2(\frac{\delta_{max}}{\epsilon_1+\epsilon_2}))$ .

However, we need to minimize  $\sum_{i=1}^{n} (u_i - u_i') = ||\delta_i||_1$ .

## 7 Related Work

# 8 Further Research

While our trust network can form a basis for risk-invariant transactions in the anonymous and decentralized setting, more research is required to achieve other desirable properties. Some directions for future research are outlined below.

#### 8.1 Zero knowledge

Our network evaluates indirect trust by computing the max flow in the graph of lines-of-credit. In order to do that, complete information about the network is required. However, disclosing the network topology may be undesirable, as it subverts the identity of the participants even when participants are treated pseudonymously, as deanonymization techniques can be used. To avoid such issues, exploring the ability to calculate flows in a zero knowledge fashion may be desirable. However, performing network queries in zero knowledge may allow an adversary to extract topological information. More research is required to establish how flows can be calculated effectively in zero knowledge and what bounds exist in regards to information revealed in such fashion.

# 9 References