## **Modeling Bitcoin Lightning Network by Logic Programming**

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Bitcoin is one of the first decentralized, peer to peer, payment systems based on the Proof-of-Work consensus algorithm. The network suffers from a scalability issue due to several limitations such as the restriction imposed on the blocks' size. For this reason, several approaches have been proposed, among which the so-called "Layer 2 solutions", where a layer of channels is built on top of a blockchain. This allows users to send transactions through these channels, without broadcasting them on the blockchain, increasing the number of transactions per second that can be managed. One of the main examples of this last approach is the Lightning Network: in this paper we propose to represent this network and to query its properties by means of Logic Programming, in order to study its evolution over time.

## 1 Motivations and Model

Bitcoin [3] is one of the most famous decentralized payment system based on a *blockchain*. The algorithm used to append block to the blockchain, Proof of Work (POW) for Bitcoin, ensures that blocks, once discovered, cannot be easily tampered with. However, it also represents one of the main bottlenecks since only few transactions per second can be supported in the network. Currently, one of the main approaches to increase Bitcoin capacity is represented by the so-called "Layer 2 solutions". This type of systems creates a layer of channels on top of a blockchain. With these channels, users can overcome some blockchain limitations by issuing off-chain transactions. One of the most famous systems is the *Lightning Network* (LN) [4]. Here, we encode the Lightning Network by means of Logic Programming, since it has been proved effective in several Bitcoin scenarios [1, 2]. The use of Prolog both as the representation language of the Lightning Network and as the query language allows us to easily analyse its characteristics requiring a minimal effort in the code implementation.

The Lightning Network can be represented as a graph G = (V, E) where V is the set of vertices (nodes) and E is the set of edges (payment channels). The degree of a node is defined as the number of edges incident to the node. A path of length n between two nodes  $v_a, v_b \in V$  is a sequence of payment channels  $e_1, \ldots, e_n \in E$  such that  $e_1 = (x_1, x_2), e_2 = (x_2, x_3), \ldots, e_n = (x_{n-1}, x_n)$  where  $x_1 = v_a$  and  $x_n = v_b$ . The distance between two nodes is defined as the shortest path that connects those nodes. The capacity of an edge is defined as the maximum payment that can be routed through it. One of the problem of routing

© D. Azzolini, E. Bellodi, A. Brancaleoni, F. Riguzzi & E. Lamma This work is licensed under the Creative Commons Attribution License. in LN is that the capacity of a channel between two nodes is known but the distribution of the capacity in each direction is unknown, since it is a feature introduced to increase the security of the system: this makes routing a complicated task, since several attempts may be required to send a payment.

We represent a channel of capacity Amount between two nodes Source and Dest with a Prolog fact of the form edge (Source, Dest, Amount). The channels in the network are also characterized by other values (i.e., fee base and fee rate), but we ignore them since they are not needed in our experiments. Theoretically, the amount locked in a channel is split between the two connected nodes, so a payment channel should be represented by two directed edges. However, the amount distribution is unknown, so we suppose that nodes are connected by only one undirected edge. The Prolog representation of this situation, between a source node a and a destination node b, is given by a single fact edge (a, b, 8). The whole network is a set of ground facts edge/3.

Starting from the dataset related to [6], we trace the LN evolution along the months of February, March and April 2020 and how its properties and connections vary over time, through a series of experiments. We analyze the structure of the network in terms of node degree distribution: the majority of the nodes of the network (more than 65% for all three datasets) has degree between 1 and 5. Then, we compute how the total network capacity varies by removing the edges with the top capacity values and the nodes with the highest associated degree. The goal of this experiment is to show how much the capacity of the network is centralized in the hands of few. By removing the edges, the network capacity substantially reduces after 50 removals. Instead, removing the top 100 nodes decreases the total network capacity approximately by 90%. We analyse the *rebalancing* operation (i.e., a node sends a payment to itself) and, as expected, as the node degree increases, the maximum rebalancing amount increases as well. Finally, we compute the number of paths of length 2 and 3 among equal degree nodes, with the degree varying between 1 and 10. We focus on short paths since, in practice, the average length of the shortest path is 2.8 [7]. Moreover, longer paths also imply higher fees to pay. We discover that the number of paths drops after the 3rd or 4th degree for all networks in both cases. As a future work, we plan to extend our analysis using Probabilistic Logic Programming [5].

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