

### École Polytechnique Fédérale de Lausanne

# A Control Plane in Time and Space for Locality-Preserving Blockchains

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### **Master Thesis**

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## Chapter 1

## Introduction

Distributed ledgers were the trend of the last ten years. You might realize that when your hair-dresser starts to tell you that he plans to put his money into blockchains or when your little cousin asks to have some Bitcoin [21] for Christmas. The research in this field is growing every year.

However, distributed ledgers still have weaknesses. The purpose of this work is to propose a solution concerning two well-known weaknesses. The first one is the time required to confirm a transaction. Indeed, in Bitcoin [21], validating a transaction can take around one hour, because it takes around ten minutes to validate a block, and it needs around six blocks to be convinced with a high probability that the ledger won't be forked, and the transaction invalidated. This might be acceptable for some transactions of great value. For example, if somebody is buying a car using Bitcoin [21], this person might agree to wait one hour so that its transaction is validated. However, if somebody wants to use it to buy its daily coffee, he might be a bit annoyed to wait that long. The other weakness appears in World War III scenarios. If a third World War occurs, splitting the World in two, one can expect that the circumstances would cut the communication between the two sides. This is a problem for standard distributed ledgers as it is leading to forks that the system cannot resolve at the end of World War III.

This work is part of a larger project called Nyle [Figure 1.1], which uses the notion of locality to solve these problems. The idea is to replicate the system along regions of different sizes, from local (e.g., Switzerland, London) to global. With this idea, a transaction can be validated in a local region first, but it is still possible to wait for global validation if needed. Most of the time, a transaction that was validated locally is validated globally as well. Still, in some cases, when propagating the information to the global regions, some transactions might be invalidated as they are in conflict with others. Therefore one or both won't be accepted to avoid double-spending. For significant transactions, people might prefer to wait for global confirmation. Nevertheless, if one wants to buy its daily coffee, local validation might be enough for the merchant, especially if he already knew the person. For World War IIIs Scenarios, Nyle offers a solution as well, indeed if

a global partition occurs, the system replicated in smaller regions that are not split by a partition can continue working flawlessly.

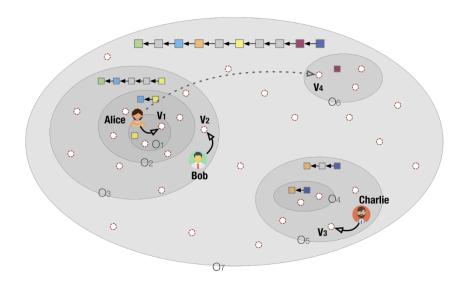


Figure 1.1 – Sketch of Nyle: The Blockchain is replicated across all regions.

Nodes that are spread over the World are maintaining Nyle's distributed ledger. Clients can ask the nodes to proceed with their transactions or other requests. Nodes are participating in a different number of regions. A first challenge is to draw these regions adequately. A second challenge is *churn*: in an internet-like network with *open-membership* the control plane should be dynamic, as nodes can join, leaves or move in the system at any moment. This challenge might not be a problem for classic distributed ledger as Bitcoin [21], as its protocol only takes into account the computational power that is in the system at a given time. But as Nyle is locality-based, this might lead to additional challenges, each corresponding to the different actions possible: joining, leaving and moving.

For joining nodes, consider the case where there were only a few nodes spread along a vast region, for example, Western Europe, and after a while, a large number of new nodes want to join there. If region creation is not allowed, this big region stays the smaller unit of locality, and this might lead to some problems. Furthermore, for a region of this size, the probability of a partition is relatively substantial. One might want that the joining of new nodes creates additional regions with the size of countries, for example. Therefore, regions should be able to adapt, depending on node membership. If nodes leave the system, this might lead to problems as well. Indeed if too many nodes leave, some regions might not contain any nodes that are maintaining the system. To avoid this situation, it could be possible to modify the regions when nodes leave to guarantee that a sufficient number of nodes are in a region at any time. Moving nodes are creating problems as well with fixed region assignment. As nodes are mobile, a node can drift apart after a while far away from his assigned regions. This drifting might take a while, but one

can imagine the situation where many nodes have moved far away from their original position. In case of a global partition, this can lead to the failure of even small regions, that is one problem to avoid in Nyle. Therefore the regions should be adapted with the movement of the nodes.

CRUX [2] is the basis of most of this work, which introduces an algorithm that allows creating regions based on compact graph theory. Chapter 3 describes this algorithm in more detail. This work uses the existing code base for CRUX in Go. A first work on Nyle [26] proposes a first implementation of Nyle building on the top CRUX [2] but focusing directly on how to improve the storage of the transactions and the tree structure of the regions. This work builds directly upon the existing work, but is slightly orthogonal, as the Control Plane has not a direct relation to the replicated blockchain. Sabrina Kall [9] has done a second work on Nyle, called *proof-of-location*. Her work is proposing first, a way of checking the location of a node efficiently. And second, a method to assert if nodes were lying about the location where they claimed to be. There is a current work by Guillaume Michel on the Interplanetary-File System (IPFS) [18] that is based on CRUX as well but with the purpose of creating a locality-aware overlay to speed the system up. However, it is not directly related to blockchains. Chapter 2 describes the rest of the related work. These works are mostly orthogonal to the current approach: some other solutions to speed the validation of transaction are Bitcoin [21], Byzcoin [12], Omniledger [13], DFINITY [8], Monoxide [29] and Stellar [15]. However, they don't use the concept of the locality for this purpose.

Here is the structure of this work: first, a simple version of the control plane was designed in Chapter 4, which splits the time into epochs and takes as an assumption that the system remains fixed during one epoch. This work proposes and discusses a protocol, and gives his threat analysis. Based on its implementation and performance analysis, some drawbacks are put into light. Then a series of strawman models try to correct some of these drawbacks and are analyzed as well in Chapter 5. The first one is called "Locarno Treaties" and try to keep the system coherent from one epoch to the next. The next one is called "Fog of the war", and try to reduce the need for communication between nodes. The last and the most complex Strawman considers the interactions of the nodes as a space-time graph and try to build upon the existing patterns that appear in these graphs to propose a different notion of distance.

This work proposes **A Control Plane in Time and Space for Locality-Preserving Blockchains**. This control plane for Nyle is needed to ensure to have a *open-membership* and to solve the problems of World War III scenarios and to allow regional validations. The series of strawman models improving the simple control plane leads to the use of Space-Time graphs that allowed to improve the existing design.

## Chapter 2

## **Related Work**

This work builds upon several other works in the domains of blockchain and locality. Nyle proposes a decentralized cryptocurrency using different strategies than Bitcoin [21], Byzcoin [12], Omniledger [13], DFINITY [8], Monoxide [29] and Stellar [15]. But it uses them as a source of inspiration and shares some aspects with these general cryptocurrencies. It is somehow orthogonal to them because it can use any of these cryptocurrencies as an underlying system and enhance them using the idea of the locality to provide them with some partition-resistance and regional validation.

These works are the direct source of inspiration for some key concepts of this work. DFINITY [8] directly inspires the Sybil-resistant scheme used in the registration system, using *endorsement* in the general way, which can be in practice replaced by any Sybil-resistance scheme like Proof-of-Work [21], Proof-of-Stake [30], or even Proof-of-Personhood [4]. In particular, this work tries to solve some drawbacks of traditional cryptocurrencies like Bitcoin [21], solving the problem of the waiting time for transaction validation by using regional validation and making it resistant to WWIII scenarios. Byzcoin [12] and Omniledger [13] give another interesting solution to accelerate the validation, but their results are orthogonal to this research. Stellar's solution for *open-membership* [15] is based on a quorum, allowing each node to trust a subset of other nodes of its choice. It is an elegant solution and permits to validate transactions fast and securely. A certain complexity seems to be added both in the theoretical and practice part. This justifies why a similar approach was not followed. However, the idea to allow nodes to have a different view of the system is at the core of one of the improvements of this work, described in section 5.2.

Omniledger [13] and Monoxide [29] use sharding to increase performance. Sharding, which splits the system in a random committee that allows the fastest processing of the transaction. Sharding is orthogonal to the replication process used in this work. As even if the system is split into different parts, first, it is not done randomly but based on the locality. Furthermore, the system is replicated in all regions. However, cryptocurrencies using shards can still be used as an underlying system of Nyle, enhancing the performance of the partition-resistant blockchain

system created by this means.

This work is directly related to the locality-preserving algorithms developed in CRUX [2] and compact-graph algorithms [28], which are described in detail in Chapter 3. There is a class of algorithms that uses the idea of locality differently. For example, Geo-DNS [11] or IP Anycast [1] use the locality to shorten the path for the packets, connecting the servers via the closest path. Replication is often used to guarantee the integrity of the stored information [20]. In CRUX [2] and Nyle regional replication of the system is used to create partition-resistance, and in Nyle, it can be used to allow region validation.

Some classic consensus protocols as PAXOS [14], PBFT [5] were used as an inspiration to the protocol. In practice, and for efficiency, this work uses BlsCoSi [3] that is much more efficient, because it makes smart use of trees for communication. BlsCoSi [3] is still prone to some failures in case of successive view-changes, it could be improved using a different protocol such as HotStuff [31] which solves the problem of view change using a third round of communication.

This work uses a distributed public algorithm for the source of randomness like Randhound [27]. Each node uses this source to draw a random level. The way it is used is described in detail in the next section.

## **Chapter 3**

## **Background**

This Master Thesis is part of a larger project that concerns locality-preserving systems. In particular, it builds upon CRUX [2] and is part of Nyle. This section describes two different projects.

### 3.1 CRUX - Fast and Resilient Datastore with Automated Locality

#### 3.1.1 Description

CRUX [2] introduces a smart way of dealing with partitions in decentralized systems. Partitions occur in decentralized systems, but one can try to find a solution to reduce their effects on the global system. For example, if a partition occurs, there are no reasons that nodes that are functioning on the same side of the partition should stop working because of the partition.

The general idea is that a system can be replicated at different scales, from local (big cities, small countries) to global. The replication means that a separate instance of the system is created in all regions. This ensures the additional property that each replicated system continues to work correctly if no partition splits it. If a global partition occurs, then the global region might not work, but all the replicated systems in local regions continue working. This is a direct solution to the previously mentioned problem: nodes working on the same of the partition continue to work. The force of CRUX is that it provides a locality property [2]. For *any two nodes* in the system, it is guaranteed that they participate within a region with a radius that is equal to a small multiple of their *Round Trip Time* (RTT).

This solution comes with an overhead, as the system should be replicated in all the regions. However, there are ways to reduce these overhead costs so that they remain reasonable and that resistance to partition is maintained. CRUX algorithm for regions creation [2] presented below ensures that the proper number of regions is created in a manner that the number of

regions created induces a reasonable overhead and that the partition resistance stays efficient. If CRUX [2] is used for a specific system, overhead can be even more reduced: as the systems are replicated in every region, most of the data is replicated as well. So one might dig inside the specification of one system and manages not to store twice the same data. But this goes beyond the goal of CRUX [2], which wants to be the more general possible.

Indeed, the force of CRUX [2] is that it applies to any distributed system, as no particular hypothesis on the system is made. It only starts from a straightforward idea: one system can be replicated at a smaller scale to ensure some partition resistance.

A note should be made about the CAP-theorem, which states that no system can be consistent, available and partition-resistant at the same time. It seems that this solution is adding partition tolerance to an available and consistent system, thus leading to the violation of the theorem. But it is not precisely the case, as the enhanced system only ensures that nodes can still work in some regions that are not affected by the partition. The regions split by a partition are not working anymore. Even if the system can still work on the same side of a partition, it's not partition resistant as a whole.

#### 3.1.2 Common Tools

This section describes how to create regions that are used to replicate the system. These regions are used by Nyle as well. These regions are called *Available Responsive Areas* (ARA), in each region, a copy of the replicated system is deployed. Each node, starting at level 0, participates first at a lottery. Then each node goes to the next level with a given probability P. This procedure is repeated at every level and is stopped when no nodes are promoted to the next level. This first empty level is called K. Then each node can compute two quantities that are necessary to create ARAs: their bunch and their cluster.

System	Level #1	Level #2	Level #3	Level #4
100	90	9	1	0
200	180	18	2	0
500	450	45	5	0
1000	900	90	9	1
$\overline{N, k = 2}$	N(1-p)	Np(1-p)	$Np^2$	0
N, k = 3	N(1-p)	Np(1-p)	$Np^2(1-p)$	$Np^3$

Table 3.1 – Example of lottery with P=0.1 where k=3 for N=100,200,500 and 4 for N=1000. Columns represents the number of nodes and the row the levels.

**Bunch** A node can compute its bunch in the following manner. It looks at every other node by order of distances in ascending order and includes it in its bunch if its level is not smaller than

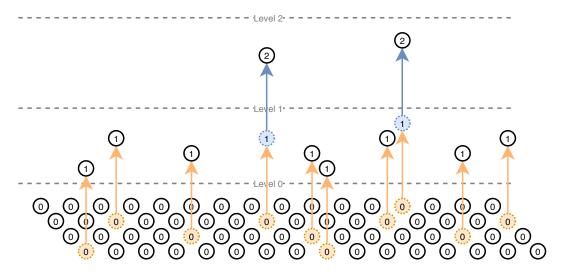


Figure 3.1 – Sketch of the Lottery process, nodes goes from one level to the next with probability P

any level it encountered so far, including its level [Figure 3.2].

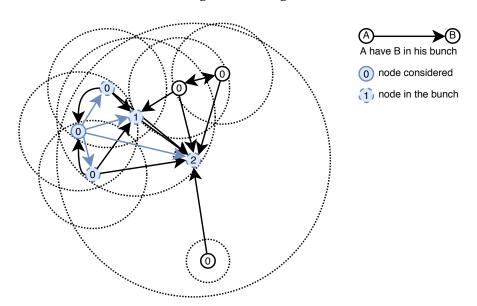


Figure 3.2 – The bunch of the level-0 blue node with solid border is depicted in blue. The cluster of the higher level node covers the whole system.

**Cluster** A cluster is a complementary concept. The cluster of node *A* is defined as the set of other nodes that have *A* in their bunch [Figure 3.3].

The smallest region radius  $R_{min}$  is defined for the whole system. Each node constructs ARAs around itself, starting at  $R_{min}$  and doubling the radius at each time. It stops at the first ARA that

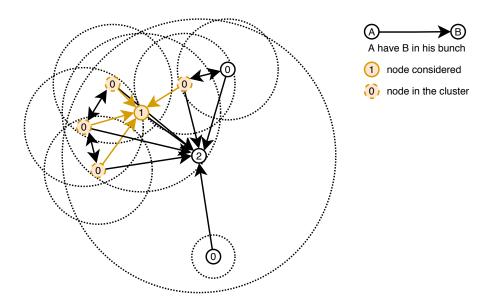


Figure 3.3 – The cluster of the level-1 orange node is depicted in orange. The cluster of the higher level node covers the whole system.

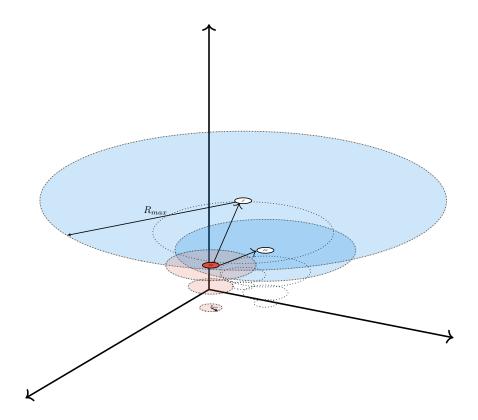


Figure 3.4 – A node (red) participates in two kinds of regions. The ones it creates with a radius from  $R_{min}$  to one that is covering its cluster (orange). And some regions created by the nodes in its cluster, which are covering him (blue).

is covering its entire cluster [Figure 3.4].

By the lottery, most nodes are level-zero nodes. Therefore, their clusters are supposed to be small, conducting to the creation of a small number of ARAs. The small number of nodes that are at level K-1 have every other node in their cluster by construction. This means that there is at least one ARA that covers the whole system.

#### 3.2 Nyle - A Locality-Preserving Blockchain

Nyle is a cryptocurrency that uses locality to answer some classical problems of blockchains. Two central problems are addressed: WWIII scenarios and approval time for a transaction.

**WWIII Scenarios** In case of a WWIII, we can expect to have at least a long-lasting partition that split the system in two. This is a problem for classical cryptocurrencies like Bitcoin [21] because for a block to be approved, the users are supposed to wait to have a global consensus. This consensus will not be reached with a long-lasting partition and therefore, it creates problems for classical cryptocurrencies. Nyle solves this issue by design using locality.

**Approval Time for a Transaction** Another issue with waiting global consensus is that it usually takes a long time. If a customer wants to use a cryptocurrency in daily life, the nodes should be able to validate (at least partially) transactions relatively fast. The solution provided by Nyle uses locality again: a transaction can be validated at different geographical levels, and it is up to the customer to wait for a local, or global validation for a transaction. For small transactions, e.g., for buying a coffee, the customer might agree only to have local validation. For more significant transactions, he might want to wait a bit longer to have global validation.

#### 3.2.1 Description

Nyle uses *ARAs* as the representation of one region. In each of these regions, there is a copy of the same system; in the case of Nyle, the system is a blockchain. So each region has its blockchain and validates all the transactions between the nodes that are included in it. Some nodes can be contained in different regions, and they send their transactions to all the regions they are part of. As all nodes participate in the global region by design, this ensures that a transaction is eventually seen by all nodes.

The big difference between CRUX [2] and Nyle is that the purpose of CRUX [2] is to work in environments where machines are relatively "stable" which means that they are not supposed to churn, where the machines are not supposed to move or to join, and more importantly, where nodes are not malicious. This is not the case for Nyle: if we have a cryptocurrency, we can expect

to have deficient, malicious and moving nodes. This adds some difficulties that are managed by the protocol.

Each region has its blockchain. In Nyle, the choice for the blockchain is chosen between ByzCoin [12] or Omniledger [13], but it can be generalized to any blockchain.

#### 3.2.2 What is already implemented for Nyle

**CRUX algorithm for region creation** We already have an algorithm for drawing regions [2].

**Block storage on node** As each node participates in different regions (from very local to worldwide), it needs to store the blockchain for all of these regions. We have a method that reduces the redundancy, by only storing the hash of a block instead of the full block at each level [26].

**Proof-of-Location** We already have a protocol for controlling the distance from a new node to the rest of the nodes, and that assures no one cheats by giving false distances [9].

#### 3.2.3 Purpose of This Project: Motivation for a Control Plane

CRUX [2] proposes a system that is working in a stable system (with low-churn) and where nodes do not move too much. This situation corresponds to some systems like a wide-area database. It is not the case of a cryptocurrency. For this kind of system, one can expect to have at least some churn, some moving nodes and some joining nodes. If the system has a precise protocol for dealing with nodes entering, leaving and moving in the system, then the problem of the evolution of the system is solved. Indeed the churn phenomenon can be described as some nodes leaving the system and optionally reentering later.

CRUX [2] can still envisage the use of a control plane, and it considers it as future work. As even if CRUX [2] does not have high churn, the *RTT* between nodes can still vary.

Therefore the purpose of the control plane is to manage the regions in order to follow the evolution of the nodes in the system. Once that problem is solved, the blockchain can be replicated in the evolving region and the strategy is the same as in CRUX [2]. This project introduces a control plane, that is in charge of the evolution of the nodes. In particular, it is in charge of dealing with nodes joining, leaving and moving. The blockchains are replicated in all the regions, but the control plane is global.

## **Chapter 4**

## Design

This part describes the design of the Control Plane, which has the mission to solve the problem of node insertion, deletion and movement inside the system. A first version of the control plane is designed, and then it is improved by a series of Strawman models.

#### 4.1 Problem definition

#### 4.1.1 Hypotheses

Three hypotheses are made on the network. First, it assumes an Internet-like network with one-to-one communication. Each node can contact any other nodes. This hypothesis is required as nodes need to communicate for the different consensus. Second nodes need to have synchronised clocks, and the protocol requires this as it assumes that they are two successive periods, one for the registration and one for executing the system, and nodes should know when they are supposed to start and to register. The third hypothesis is made on the geometry of the network. It states that for small pings (under 100ms), the round-trip-time is correlated with the distance between two nodes. This is the case for the Internet network [25]. This is required as the locality component use that hypotheses to estimate distances with pings. On this result, we build the locality properties of the system.

#### 4.1.2 Threat Model

Attacks on the system can be made internally from malicious nodes or externally by delaying the interaction between nodes or intercepting and forging messages. We give the precise portion of malicious nodes that this protocol can handle. In this threat model, malicious nodes are regular

nodes that decide to act against the system. In particular, malicious nodes have only access to limited computational power, and they cannot break the cryptographic primitives.

#### 4.2 General Presentation

The Control Plane is composed of five different components [Figure 4.1], each necessary to address different parts of the problem. It needs a membership component, to define which nodes are in the system at any time. It needs a distance oracle which gives the distance between two nodes in the system. Then it needs a region management component, which creates and alter the regions based on the membership and the locality. The time is split into epochs, and a component is in charge of dealing with that aspect. And finally, the control plane is in charge of answering some requests linked to the location and presence of the nodes in the system. Each component is described in detail below.

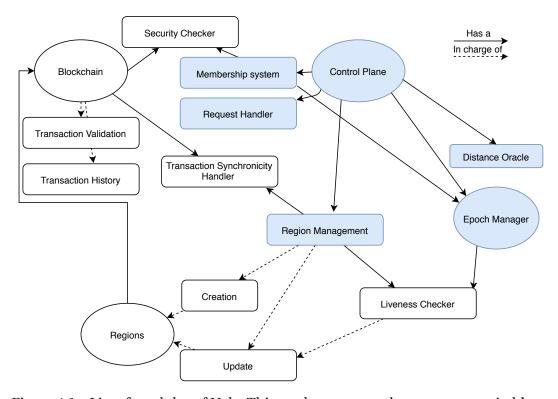


Figure 4.1 – List of modules of Nyle. This works concerns the components in blue.

#### 4.2.1 Membership Component

At each epoch, a list of all participants for the current epoch is created and it is signed by the participants of the previous epoch. It is based on registration, which is made during the previous epoch. Registration use *endorsement* (for example solution to a proof-of-work problem). This

system is global. Nodes can ask the participants of the system to know the identity of other nodes. For a new contract to be validated, it should be signed by the majority of the nodes of the previous epoch.

#### 4.2.2 Distance Oracle

The role of the locality component is to give all pairwise distances between nodes of the system. We assume it already exists (distance oracle), or that nodes can compute it. In this protocol, the metric that is used as a distance is the latency. Therefore all pairwise-latencies are computed between each node and every node agrees on them via consensus.

We also assume the existence of a control function that is able to assert the validity of the distances based on the latencies.

#### 4.2.3 Region Component

This component is used to create and update regions. This part is based on CRUX. At each epoch, CRUX is run based on the new registration, and regions are created.

#### 4.2.4 Epoch Component

The epoch manager is linked to the membership system (we allow to change membership at the beginning of one epoch). New nodes can register during one epoch and join for the next. If nodes have moved, the Region component change or maintain their assignment at the beginning of one epoch. If nodes have crashed, they won't be able to join for the next epoch and will, therefore, leave the system.

Epochs happen at a defined rhythm, e.g. one day. This frequency can be shortened to ensure that nodes, wanting to join, do not wait too long, or made longer if one wants regions not to be redrawn too frequently.

#### 4.2.5 Request Handler

The control plane is responsible for handling requests as it is aware of the nodes location and region assignment. It is in charge of answering the request for nodes assignment and nodes location.

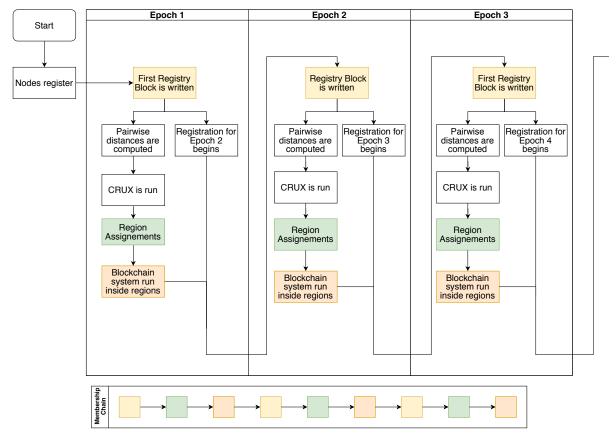


Figure 4.2 – General Control Flow of Nyle.

### 4.3 Simple Control plane

This version presents the first version of the Control Plane. In which most of the work is done on the membership component. At each epoch, nodes can join if they manage to get approval from the members of the previous epoch. The distance oracle requires many resources: every node measures pings to every other nodes and consensus is made on that information. The region component in this model is simple: based on the registration, and the pings, CRUX is run at each epoch, redrawing the map of the entire system.

#### 4.3.1 Membership Protocol

This section describes the membership protocol [Figure 4.3]. The system goes through some cycles (called an epoch) of two different phases: the registration period and the live period. The first period is there to manage the participants of the current epoch, and the underlying system (e.g., a cruxified-blockchain) is run during the live period. Assume that each node has a synchronised wall-clock which gives the time of the different periods.

The authority that decides which node participates in the next epochs is the participants of the current epoch, which are called the *admission committee*. Assume that a set of genesis participants, which are the first *admission committee*, exists.

**Registration Period.** If a node wants to register for the next epoch, it has to send the following information to the admission committee: a *name*, a *public key*, and an *endorsement* (e.g., solution to a proof-of-work problem) and ask for a *threshold-signature*.

If the new node manages to get back a threshold-signature from the admission committee, it has to broadcast it again to the admission committee during the same registration period. The current committee then acknowledges that it is a participant for the next epoch. This is necessary as nodes in the committee might not necessarily know if the admission they signed managed to reach the threshold. The admission committee aggregates the threshold-signatures for all the participants of the next epoch. At the end of the registration period, the admission committee reaches a consensus on the new participants, by threshold-signing the list of the members.

**Live Period.** At the beginning of the live period, one member of the admission committee sends the threshold-signed contract that lists the participants to the current members. If one of the participants did not receive the list, it could ask any member of the admission committee to have it. After that propagation, the admission committee can retire, and the members of the current epoch become the new admission committee. Then members of the new epoch compute the distances between each other. Participants will as well draw a level from unpredictable, biasresistant public randomness source. They reach then consensus on those ping-distances and levels by threshold-signing them and broadcast them. At this point, each member of the new epoch has the same view of the system as they know the participants, the latencies between each one of them and their levels. Therefore these participants are capable of running the system in a deterministic manner.

Following the election of the new admission committee at the beginning of the live-epoch, the registration period for the next epoch can begin, as the authority that accepts admission is running. Registration period and live period can, therefore, be superposed [Figure 4.3], which permits to have a system running at every time.

#### 4.3.2 Threshold-Signing Registration

To be admitted in the next phase, a node uses the BlsCoSi protocol [3]. It generates a tree with him as the root and the admission committee as nodes in the tree. Each node of the admission committee has the choice of signing or rejecting the admission request. The threshold is set at the majority. So if a node manages to get a majority of signatures, then it is accepted in the system. A node from the admission committee is supposed to accept the query if it has not

already seen the node, and if the *endorsement* is convincing and was made with the public-key associated. This ensures that a node cannot steal the endorsement of another for registration.

#### 4.3.3 Committee Consensus

Consensus is used at two different times. First, at the end of the registration period. Consensus should be reached by the admission committee to agree on the participants of the next epoch. A random member of the admission committee is selected to run the consensus protocol. It sends the list of members it has aggregated during the registration period, and try to get a threshold signature on it from the other member of the admission committee. Members of the admission committee are supposed to sign the list if they aggregated the same list of members for the next epoch.

If one member does not achieve consensus, another can be selected to run the consensus. A communication round can be added between two consensus phases so that every member of the admission committee broadcast its list of members with valid proofs.

The same idea is used at the beginning of the live epoch to reach consensus on the list of pings between every member of the system and on the levels on all nodes in the system.

#### 4.3.4 Public distributed source of randomness

A distributed public source of randomness is used to draw the levels for the region creation algorithm. This can be targeted by adversaries trying to get a specific level which can unbalance the system, as described in subsection 4.5.2. To be sure that this source is not targeted, it is based on the information created during the consensus on the participants just before drawing the regions.

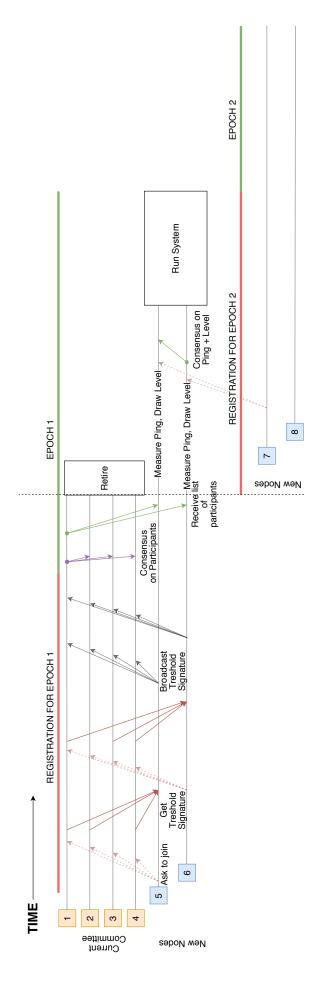


Figure 4.3 – Sketch of the Protocol.

#### 4.4 Details

#### 4.4.1 Advantages

This simple version of the control plane is solving the problem of node insertion, churn and nodes movement in the system. A comparison is made with a fixed version only using CRUX for region management but without a control plane. Then the system begins with a fixed number of nodes and creates regions based on CRUX, then it is replicated inside all regions, with no update possible.

#### **Nodes Insertion**

The version without a control plane cannot add nodes to the system. Indeed a fixed number of nodes is required to create the regions. With this control plane, node insertion is possible at the beginning of every epoch [Figure 4.4].

#### **Churn Resistance**

Nodes can churn. If the system is not supposed to change, crashing nodes can still be in the system. With this control plane, nodes that have crashed cannot register for the next epoch and therefore are removed from the system [Figure 4.5].

#### **Adaptation to Node Movements**

Nodes can move as well, and the latencies between different nodes can change. If the regions are only drawn at the beginning of the system, then it's possible that after a while, many nodes have migrated from where they were when the regions were drawn. This might be a problem. Indeed, the purpose of the replication was to ensure that in case of a partition, nodes participating in the same side of the partition should still be able to work. If most of the nodes have moved, but are still participating in the region of their first assignment, a partition could happen somewhere in the system leading to failing regions that should be on the same side of the partition. The control plane solves this problem as the regions are recreated at each epoch, taking into account the movement of the nodes, and increasing the partition resistance, with the movement of nodes.

#### 4.4.2 Drawbacks

This control plane is simple and reaches its objective, but it requires many resources. Some of the drawbacks of this approach are listed below. Some answers to these drawbacks are discussed

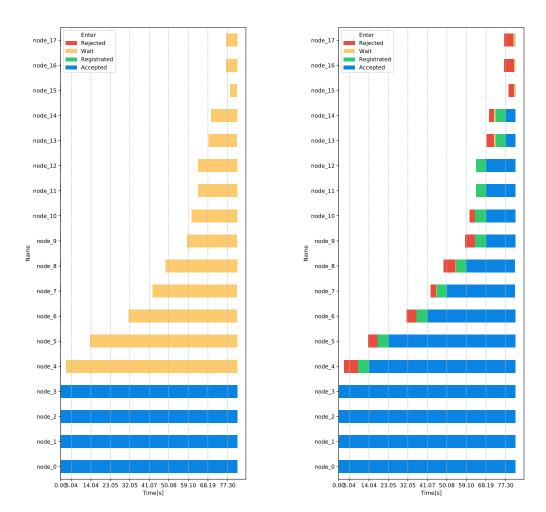


Figure 4.4 – The simple control plane (right) allows nodes to join the system. The left plot represents the case with a fixed control plane where nodes cannot join. The ticks are placed at the start of epochs. Some registrations are refused for the next epoch as they started too late. In these tests, nodes that are not passing the registration wait a bit to ask for a new registration. The waiting time is really short, as the registration are possible at any time due to the superposition of the live period and the registration period.

in Chapter 5.

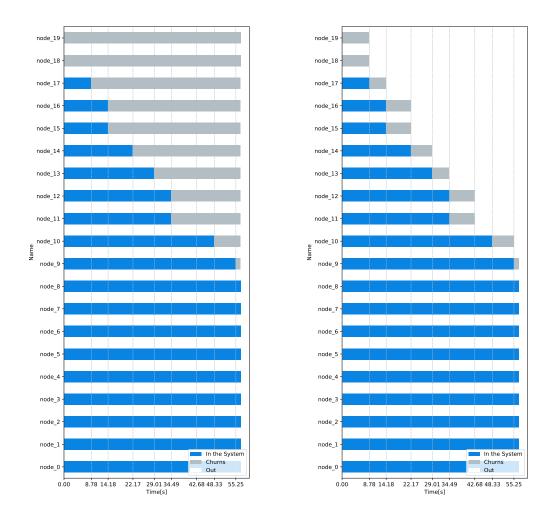


Figure 4.5 – The simple control plane remove nodes that have left the system. The left plot represents the case with a fixed control plane. In this case, the nodes that are still alive considers that nodes that have churned are still part of the system. On the contrary, with the control plane, nodes that churn will leave the system leading to the redrawing of the regions. The ticks are placed at the start of epochs.

#### Control Plane is global

If the system is replicated in all the regions, the control plane itself is global. Meaning it could be subject to a partition. In this case, the replicated system would continue to work, but the control plane could only continue to work on the side of the Byzantine majority. On the side

of the minority, no consensus could be reached anymore. Therefore the system will stay stuck at the same epoch. This is not a major drawback as the main purpose, which is the liveness of regions that are not split by a partition is guaranteed. However, the evolution of the system on the side of the minority is not treated by the control plane.

#### **Epoch Transition Requires Resources**

Epoch transition requires many resources. Indeed, it needs much communication for the registration as every node that was previously on the system should be contacted by every new node. If  $\bar{N}$  is the average number of participants in epochs, then registration requires  $O(\bar{N}^2)$  messages, as every new node has to send a message to every member of the previous committee. This can be inefficient.

Then when the registration is done, the protocol as it is redrawn most of the regions as the algorithm for region creation is reused. This can be inefficient as well because some transfer of information between old regions and the new one might be expected.

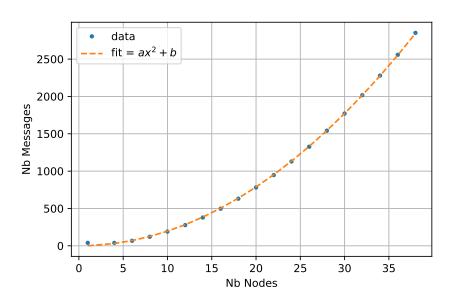


Figure 4.6 – Growth of the number of messages for one epoch with the number of nodes.

This could be solved by using a random subset of the participants as the *admission committee*. If x nodes join and a subset of y nodes out of N are in the *admission committee*, this could be reduced to O(xy) messages. This was not implemented due to time reasons, but it is a simple and straightforward amelioration of the system.

#### **Omniscience of the Nodes**

Nodes are aware of a lot of information. By design, they are aware of the list of every other node in the system, their levels, the pings between each pair of nodes in the system, all the region created and all the region assignment. The nodes need to be aware of this information so that every node runs the algorithm for region creation and lands in the same regions. However, this can be much information to store. Of course, after the region computation, the nodes could free this memory, but it gives an idea of how much resource is needed.

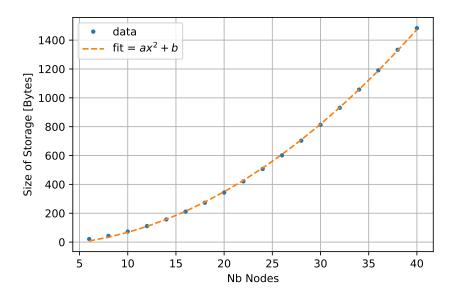


Figure 4.7 – Growth of the amount of storage required for ping distances for one epoch with respect to the number of nodes.

### 4.5 Security Analysis

#### 4.5.1 Network Attacks

#### Man-in-the-middle attacks

The messages exchanged during the protocol are listed in the following table [Table 4.1].

As all the messages are signed, if a message is changed, it is noticed by the receiver, which discards the altered message and asks again to the sender. Therefore the only effect of a Manin-the-middle attack is to delete some of the messages, which can be seen as a type of delay attacks.

	Message	Signature	Effects of a Sufficient Delay
1.	Join request	Requesting node	Request refused
2.	Threshold signature of the request	Threshold number of the current committee	Request refused
3.	O	Threshold number of the current committee	Request refused
4.	Messages for the consensus on the participants, list of the participants	Leader of the current committee	View Change
5.	List of pings and levels	Leader of the current committee	View Change

Table 4.1 – List of the messages exchanged during the protocol. The signature of the message and the effects of a delay are given.

#### **Delay Attacks**

This protocol is not resistant to delay attacks. It assumes wall-clock synchronicity between the nodes, which can cause some problems. The effects of delaying messages are listed in [Table 4.1]. During the registration, if the messages are delayed until the start of the next epoch, then it leads to the refusal of the request, and the node has to create a new request for the next epoch. If the messages of the leader of the consensus for the participants of the pings and levels are deleted or delayed, the other nodes ask for a view change: requesting the next node in the list to start the consensus again. If attackers manage always to delay the messages of the successive leaders, it can block the protocol forever.

#### 4.5.2 Malicious Nodes

#### **Attack on Consensus**

If a malicious node is already in the committee, the only misbehaviour that it can have is to refuse to sign some messages. Sending forged messages are already treated in subsection 4.5.1 as they are not possible to forge because of the signature. Refusing to sign joining requests can lead to a failing protocol if the number of malicious nodes is more significant than the threshold required to get the signature. As the signature procedure is done using BlsCoSi [3], the registration process is subject to the same threat. BlsCoSi [3] is an efficient way to implement the *Practical Byzantine Fault Tolerance* (PBFT) [5] algorithm which guarantees *safety* and *liveness* if the system as no more than f faults among N=3f+1 nodes. Therefore it is required to have no more than f malicious nodes. As the number of nodes in the system evolves with time, it required not to have more than this fraction of malicious nodes in the system at any epoch. If for one epoch, the

number of malicious nodes is bigger, then they can block all the consensus, leading to a failing system. If a malicious node is elected as a leader of the consensus on the list of participants or the pings, it can decide not to start the consensus. After a while, another node is elected to run the consensus (view change), which eventually succeeds if the number of malicious nodes is low enough.

#### Attack on Levels

At the beginning of one epoch, nodes compute their bunch and cluster based on the pings and the levels that are drawn from a shared public source of randomness, which is renewed at each epoch. Each node participates in regions along its bunch. It is important to realize that this procedure is not based on the action of a node, but just on the fact that they exist at a given place and a given level, which means that every node has the same view of the system. If node A has node B in its bunch, then node A is supposed to participate in a region which is based on the position of B and spans the cluster of B, but A already has all the information to know about this region using only the pings and levels. Therefore node B cannot use a high level to perform an action that blocks the system.

However, if a malicious attacker could take over the lottery process, it could manage to group the high level in a side of the system, leaving only the level-zero on the other side. This could lead to an overhead problem which is described in the next paragraph. Taking over the lottery process should not be possible by design. Indeed, the lottery is based on a public source of randomness which is renewed at each epoch and revealed after the registration of the levels. Nodes can know the level of other nodes because they base the computation of their levels on the threshold-signed list they received from the previous committee. The source must be revealed after registration of the levels. Otherwise, malicious nodes could try to influence the order of the list on which the lottery process is based.

**Problem with unbalanced levels.** The problem with unbalanced levels is mainly that a property stated in CRUX [2] is not necessary respected anymore. The property is the following: Let's call  $ARAs_{max}$  the maximum number of regions in which a node participates. This number is given by:

$$ARAs_{max} = \log_2(R_{max}/R_{min})(B\log_B(N) + 1)$$

$$\tag{4.1}$$

Where B is a constant, N is the number of nodes in the system,  $R_{min}$  is the diameter of the smallest region and  $R_{max}$  is a diameter that is large enough to cover the entire network. This ensures that the overhead that is created by the replication stays reasonable: by design, it is growing logarithmically with the number of nodes N and with  $R_{max}$ . We describe two situations where this property is not maintained, as an argument for keeping the distribution of levels

balanced.

**Problem With level-0 Nodes.** Assume that there is a system of N nodes that are all at level 0. If all the nodes stay at level 0, by construction, they have every other node in their bunch [Figure 3.2]. (Because it's adding every other node if their level is not smaller.) After adding N nodes with this process, the Nth node participates in N-1 region, which grows a lot faster than Equation 4.1. This could create an unmanageable overhead. Therefore one needs to have higher-level nodes in the middle of levels 0 nodes. This justifies the attack on levels that could be done by malicious nodes as described in subsection 4.5.2, and the solution proposed in Chapter 6.

#### 4.5.3 Problem With Too Many Different Levels

Similarly, consider the case where we have N nodes, and each is at a different level from 0 to N-1. By design, the node at level 0 has every other node in its bunch. So it participates in N regions, which grows a lot faster with N than Equation 4.1. This could lead to an unmanageable overhead as well. Of course, this example is a bit extreme, but it gives guidelines on what could happen if the distribution of levels is not controlled.

## Chapter 5

## **Improvements**

This section proposes some improvements to the simple control plane protocol. They are supposed to address the drawbacks of the simple protocol, and each improvement is illustrated in a Strawman model. Finally, an advanced version of the control plane that uses a region creation algorithm based on time/space graphs is proposed.

#### 5.1 Strawman 1: Locarno Treaties

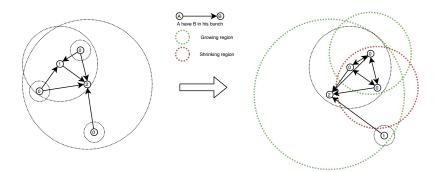


Figure 5.1 – Redrawing the levels at each epoch can lead to very different version of the system. This is what is improved by the Locarno Treaties.

Following the First World War, it was decided that the borders of Germany should remain fixed. The Locarno Treaties defined some of these borders. The idea of this Strawman model is to do the same by limiting modifications of regions from one epoch to the next. The idea is to use a deterministic set of rules, based on the ping, the registrations and the map of the previous epoch to create the map of the current epoch using the fewest modifications possible. Registration is still global, and each node has all the information about the memberships of every node. Then from one epoch to another, the purpose is to keep as many unchanged regions as possible. The obvious idea to reach this goal is to let the nodes keep their levels from one epoch to the next.

However, this introduces some overhead problems. These are described in the next section.

#### 5.1.1 Rebalancing the Levels

Conserving the levels is the way to go, but maintaining levels can lead to unbalanced systems. Consider a system with 200 Nodes at epoch 1, with the repartition given in Table 3.1. If from epoch 1 to epoch 2, 100 level-0 nodes leave the system. The remaining system would contain 80 level-0 nodes instead of 90.

Unbalanced systems can lead to various problems. Some examples are given in subsection 4.5.2. The lottery process presented in subsection 3.1.2 is slightly modified in this section to allow the adaptation of the levels. The total number of participants N in the system is known after the registration, and as the probability P is given, it is straightforward to compute the expected number of nodes that one should have at every level as it is mentioned in Table 3.1.

Instead of drawing the levels directly from a randomness source, nodes draw a random number from this source between 0 and 1 [Figure 5.2]. All nodes can deduce what number the others draw deterministically from the registration list and the public source of randomness. The highest level goes to the node, which has drawn the highest random number. Levels are given according to the drawing in descending order. Each node that stays in the system keeps its random number from when it joined the system, and new nodes get fresh random numbers. This does not guarantee that nodes keep exactly the same levels, but, most of the time, it will be the case.

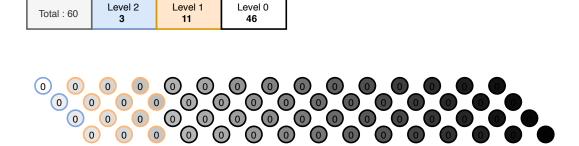


Figure 5.2 – Sketch of the new method for drawing the levels. The fill property of each node represents the number that was drawn from 0 (black) to 1 (white).

#### **5.1.2** Motivation for Keeping the Levels

This section describes the reasons for keeping the levels. It is useful to look in detail at what are the consequences of the movement of a given node on a given fixed node, to understand what are the effects on the global system. Then some precise examples of the evolution of the system are treated as well. The hypothesis in this analysis is that the nodes keep the same levels using

the new lottery; this is assumed to make things simple. But we have to keep in mind that the lottery process might allow nodes to change levels for keeping the system balanced.

#### Effects for a Fixed Node

The point of view of one node that stays fixed in the system is considered, the goal is that the node can keep most of its region assignments. Other nodes might join, leave or move, and this can result in changes either in its cluster or in its bunch. [Figure 5.3].

**Nodes Leaving the Cluster** This can shrink the cluster of the fixed node. As the regions created by a given node stops when the radius covers the whole cluster, this might lead to the deletion of some regions. This does not change the region assignment, and the nodes can still keep the replicated system of the previous epoch running.

**Nodes Joining the Cluster** On the contrary, if nodes join the cluster of the fixed node, this might lead to the creation of an additional region to cover these extra nodes. The node then replicates its system to the newly created regions. So the fixed node keeps the regions it created, which was the goal, and eventually add some to cover its cluster. By design, these joining nodes could be part of the bunch of the fixed node as well, but this case is treated in another paragraph.

**Nodes Leaving the Bunch** Nodes participate in all the regions in their bunch. Eventually, they participate in a region that covers the whole system. If a node left the system in the bunch, this leads to a region centered around a point that is not in the system anymore, and this assignment might be forgotten.

From a fixed node, if another node leaves its bunch, it can have an effect to add other nodes in its bunch, leading to more region assignment. And in some cases, to more nodes in its cluster, leading to region growth.

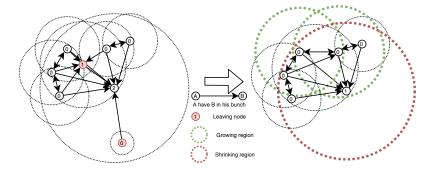


Figure 5.3 – A leaving node changes assignments of other nodes but keeps the same regions.

**Nodes joining the Bunch** If nodes are joining in a bunch, this leads to additional region assignment.

#### Rules for other nodes

The point of view of a fixed node in the system was treated. The other nodes have yet to be reviewed. The question is how to integrate moving or joining in the system while keeping the system balanced.

**High-Level Moving Node** Assume that going from epoch i to i + 1, one of a relatively high-level node has gone from one place to the other end of the system. As nodes can keep their level, it changes some of the assignments, but most of the regions are maintained.

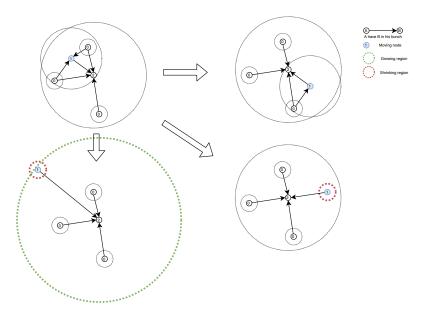


Figure 5.4 – A moving high-level node keeping its levels is changing assignments of other nodes but keep the same regions.

This seems to indicate that movement should not be a problem. There is a slight difference between that situation and changing the levels at each epoch. As each node can keep its copy of the underlying system working in its region. If the levels are changed, communication might be needed to transfer data from one region to another. This communication overhead is reduced in that situation.

**Low-Level Moving Node** The consequences of a low-level moving node are less important than a high-level moving node as most of the other nodes won't have it in their bunch.

**Levels of Joining Nodes** One can think that the levels of joining nodes might have a big influence on the system; this part tries to illustrate what might happen. The joining nodes can lead to the growth of one region or the creation of regions. The effects of the level of joining nodes are illustrated in [Figure 5.5] [Figure 5.6].

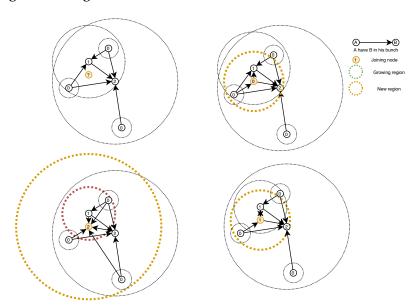


Figure 5.5 – Keeping the same level leads to smaller changes when a node enter the system close to other nodes.

#### 5.1.3 Protocol

The protocol is mostly the same as the simple control plane protocol [Figure 4.3]. The main difference is the level assignment which follows the new algorithm described in subsection 5.1.1.

#### 5.1.4 Threat Model

Attackers can target the new lottery process. If one malicious node decides to attack the system alone, it does not create too disastrous consequences, as it is presented in subsection 4.5.2. Another attack could be that malicious nodes exit and reenter the system at each epoch until they manage to get a good number from the lottery. Then when it achieves to get a right level, they collectively move to one side of the system leaving good nodes all at level-0 in the middle of the system. This creates a slight overhead for the good nodes as the region's assignment increase for the level-0 nodes. But this attack seems to cost a lot of resources and coordination for the attacker to generate a small overhead on the size of the participants. Some defence mechanisms can be set up to ensure that levels are geographically distributed over the whole system, they are described in more details in Chapter 6.

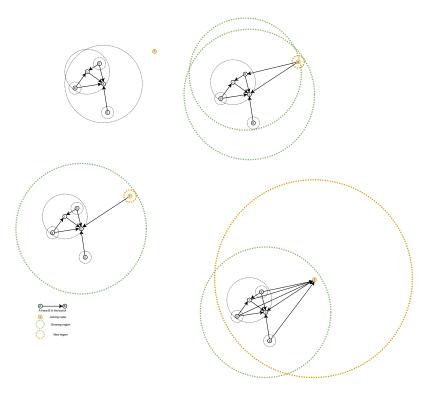


Figure 5.6 – Keeping the same level leads to smaller changes when a node enter the system from far away.

#### **Quantifying the Effect of Locarno Treaties**

The goal of the new protocol is to keep most regions and region assignments following the evolution of the system. A detailed comparison is made. The system starts with a fixed number of nodes and evolves with nodes moving, leaving and entering the system. A quantity is chosen to evaluate the difference between the system from one epoch to the next. The quantity is defined as follows: the list of participants in the system is taken sorted by name. The bunch and cluster are seen as a set of nodes. The number of difference between a set A and a set B is defined as follow:

$$#Diff(A,B) = \#(A \cup B - A \cap B)$$

$$(5.1)$$

where # means the number of elements in the set.

Then for each node, the number of difference between their bunch and cluster at epoch i and their bunch and cluster at epoch i+1 is computed. If a new node enters the system, the differences between their bunch and cluster and an empty set are computed. Same if a node leaves the system. The idea is that with this new protocol, the total number of differences should be reduced. The results of the experiment can be seen in [Figure 5.7]. They are averaged on 100 different experiments for each lottery. The number of nodes at a given epoch is kept constant to ensure that the experiments are comparable. The system starts with 4 nodes and then, 2 additional nodes are joining at each epoch. The following model for the nodes is taken: The size

of the system is (300,300). Each node starts at a uniformly random position in the system. Then, at each epoch, every node has a probability of 20% to make a local movement, and a probability of 10% to be teleported at another place in the system. A local movement changes the current position (X,Y) by adding to X and Y two different uniformly random numbers between (-10,10). Teleportation sets the position of a given node to another random position in the system. The pings between two nodes are defined as a linear function of the distance. The maps and details of one given experiment are given in Appendix A.

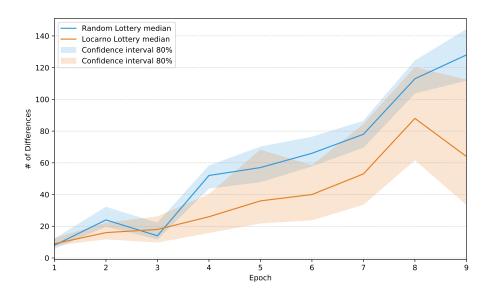


Figure 5.7 – Graph of the number of differences between maps from one epoch to the next using the random level assignments or the one defined in Locarno Treaties. Maps and details of the system are given in Appendix A.

The figure shows that globally the Locarno Lottery leads to less difference from one epoch to the next. However, the results of the random lottery seem to have less variance. This might be due to the teleportation factor as if nodes move too much, the system becomes equivalent to the random lottery. But overall, this small amelioration led to the reduction of the differences from one epoch to the next.

### 5.2 Strawman 2: Fog of the War

Each node of the system has a different view of the world at a given time, depending on its place in the system and its interactions. Again the idea is that one node should only be aware of the information it needs to perform its actions. Correspondence can be made with the fog of war of some traditional real-time strategy video game, where each player have its view of the system, based on where he is now (light), where he was in the past but cannot see now (fog) and what

he has not already seen (dark) [Figure 5.8]. Each player view evolves through space and time accordingly.

In the context of the game, the advantage of this view is that it hides the adversarial strategy. Indeed each player can move his troops, and the only information about that that another player can have is if he has himself a unit in the same region. In the context of our system, this view hides most of the information that is not relevant to one node but allows it to perform its operation without the storage and communication overhead.

The design of this Strawman is the following. Each node declares a position during the registration, and other nodes compute their bunch and cluster according to this declared position. This is different from the two first protocols were each node announced his pings to every other node in the system. Each node will, therefore, be able to compute their bunch and cluster based on these declared positions. A random committee of checkers is elected after the registration process to ensure the correctness of the system. These checkers perform some tests (pinging other nodes of one region) and publish the results.



Figure 5.8 – Fog of war representation in a classic real-time strategy video game [19].

#### 5.2.1 Purpose: Reducing the Need of the Consensus on Distances

The protocols presented in the Simple Control Plane protocol and the Locarno Treaties still need consensus on the distances between all nodes in the system. This can be cumbersome as the number of nodes increases in the system in  $O(N^2)$ , where N is the number of nodes. Consensus might become too costly for that reason.

The idea is to change that consensus with a declared position and a random committee of checkers. The question is still: how to choose the committee? If sampled randomly, the chances are big that the selected nodes are far away from the node that they are supposed to check, and above a certain threshold, the correlation between pings and distances are not satisfactory [11].

Therefore the committee of checkers can be selected to be the n closest nodes based on the declared distances. And n can be adapted to increase if one node does not pass the checks.

If a node does not pass the checks, it either means that this node is faulty or that the number of checkers is constituted of a majority of malicious nodes. One can solve the second problem by increasing the number of checkers n, and progressively a majority of honest nodes should have checked the node. It the pings still does not match what the node declared, then that means the node itself is faulty.

#### 5.2.2 Protocol

The protocol is mostly the same as the simple control plane protocol [Figure 4.3]. The only difference is the consensus on the pings which are now replaced by a declared distance, which is announced before the level assignments, and a round of checks and announce of the checks.

#### 5.2.3 Attack on Protocol

Another question can be, what are we supposed to do with a node that is not passing the tests? First, it is important to notice that it won't change the view that all nodes have of the system, as nodes use the declared distance to compute their bunch and cluster. If used with the Locarno Lottery, a malicious node could use that system to declare a fake position and virtually go to a strategic place where it can unbalance the system. This is what one may want to avoid.

Two different approaches are considered to solve this problem, the first is to exclude the malicious node from the system, but it might lead to the redrawing of a certain number of regions. Another strategy could be to define the position of the faulty node with an approximation based on the ping. If we have the position of the other nodes and we fix the location of the unknown faulty node, one might do that by computing the intersection between the circles based on the pings. This triangulation strategy [Figure 5.9] can block one faulty node to reach the desired position. This strategy is imperfect for two reasons. First, the Internet suffers from triangle inequality violations [16], and second, it is possible that the circles based on the pings do not intersect at the same point. In that case, one has to consider what could be the position which satisfies most of the constraints that are given. But this was not designed due to time reason. An analysis of the triangle inequality violations was made by Pantea Karimi in another project [10].

As nodes can announce a position, which is checked in priority by close nodes, with this protocol, if there is a sufficient number of malicious nodes, they can declare that they all live in a neighbouring region and validate each other. This means that regions with a majority of malicious nodes could be created. But that was already allowed with the other protocols. This means as well that these nodes participate in regions, from which they are actually far away. Thus this will break the latency assumption of one region. There is no simple solution to this problem,

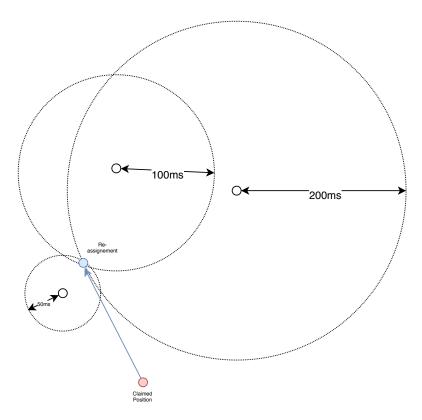


Figure 5.9 – Triangulation can be used to reassign the position of a malicious node.

but that fact has no essential consequences on the system so it seems to be an acceptable weakness.

### 5.3 Discussion: Space/Time Interaction distance

One of the principal reasons to split the system based on locality is because of most regular transactions between people are local. Therefore one wants to ensure that in case of a global partition, most of the transactions can still be processed flawlessly. The first idea for the locality was the following. As there should be more interaction in local regions, they can be processed locally. This means that by using locality, the real goal is to maintain the interactions between the nodes. In that case, the space metric is used to get an insight into the number of interactions between nodes. And this is a reasonable approximation, but it might be worth it to try to quantify these interactions directly.

This goes in an orthogonal direction that the first goal of CRUX and Nyle. Indeed this part does not try to create regions based on the latency or the availability, but on the concept of interaction between nodes. This could help if cross-region interactions are creating some overhead, and this can be the case depending on the underlying system. With the new proposed distance, nodes that interact often would be put in small regions.

#### 5.3.1 Interactions as a Distance on Space/Time Graphs

If one wants to leverage the locality of interactions to build regions, it might be worth it to investigate the following case. Imagine that some nodes A and B interact often, but they are not part of the same local region. By design, there is a bigger region in which they interact, and each of these interactions should pass through this bigger region. One property that might be useful is that these frequent interactions should have an impact on the system leading to the creation or update of a region to include the interacting nodes. If the metric that defines distance is changed from kilometers (or milliseconds if pings are used to approximate distance) to "interactions". One should be able to redraw the whole system based on that and to apply Crux to create regions. Now how to define this metric? Let's try with the following definition of distance:

$$\forall A, B \in S$$
 
$$d(A, B) = \frac{1}{\# \text{ messages between A and B per unit of time}}$$
 (5.2)

Where S is the set of nodes in the system.

It is interesting to note that this quantity has the property of a distance but not of a metric [7]. The properties of a metric and distances are listed below. Indeed for the first property, if we define that the number of messages that one node sends to itself is infinite, the distance from one node to itself would be zero. For the second property, the number of messages is positive meaning that the distance is always positive. For the third, the interactions are counted as symmetric (if A is sending a message to B, we count that as an interaction between A and B). But for the fourth, the triangle inequality is not respected, and that is a problem indeed one should notice that if A is close to B and B to C but A and C may never interact therefore are "far from each other".

**Properties** The properties of a metric are 1, 2, 4 which implies 3. The properties of a distance are 1, 2, 3 but not necessarily 4 [7]. In the case of the interaction distance Equation 5.2, 4 is not respected.

$$\forall A, B \in S$$

- 1.  $d(A, B) = 0 \Leftrightarrow A = B$
- 2.  $d(A, B) \ge 0$
- 3. d(A, B) = d(B, A)
- 4.  $d(A, C) \leq d(A, B) + d(B, C)$

**Example: Swiss rail network** A parallel can be made with the Swiss rail network. Indeed in some cases, it is much faster to take a train from A to B and then to take a train from B to C than taking a bus from A to C [Figure 5.10] [Figure 5.11] .

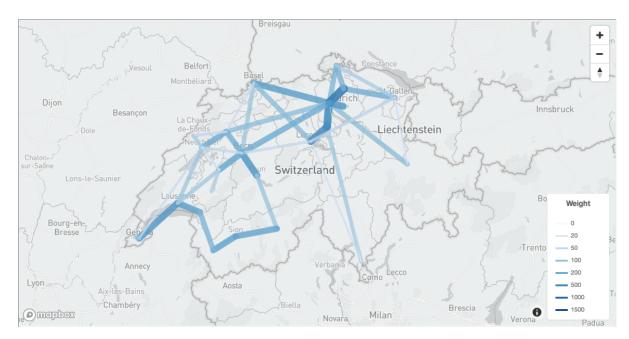


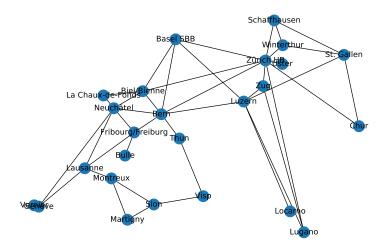
Figure 5.10 – Map of the train network in Switzerland, line-width is proportional to the number of connections per day. Three criteria were held for the selection of the cities: size, if they are a capital and my own preferences. There is an edge between two cities if there is a direct connection in the dataset. This map was done using a Python API [17] and is based on public data [22].

The fact that this new quantity is a distance and not a metric does not create a problem in our case. Indeed all nodes are considering their distances directly to all the other nodes in the system. Before, nodes were required to compute their pings to any other node in the network. Replacing that with the interaction distance does not change anything. Triangle inequality could be useful if one was trying to find a path from A to B and was considering going by different other nodes to arrive at its goal. In our case, this is not the case, and the hypothesis is that nodes have a one-to-one communication system. Therefore it's only required to know the distance between any pair of points to be able to draw a map of the system. Indeed if nodes are given levels, and every node knows the pairwise distance to every other node, then it is possible to compute the bunch and cluster of every node.

#### **5.3.2** Finding Meaning

To understand better what this distance means, some examples are considered. We want to understand what it means to move with that new distance as well as joining and leaving the system.

**Movements for Nodes With Interaction Distance** It is easier to understand what it means to move in that space by looking at the relative distance between nodes. Imagine that node *A* gets



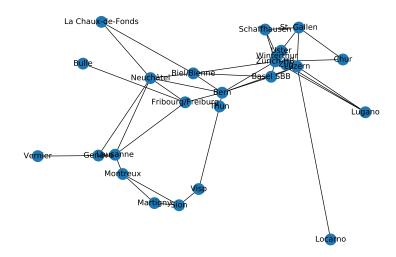


Figure 5.11 – The train network is drawn again, using the regular distance first. In the second figure, the graph is displayed using the interaction distance as force in a force-directed graph. Ensuring that nodes that are close with regard to the interaction distance are close on the graph. Three criteria were held for the selection of the cities: size, if they are a capital and my own preferences. There is an edge between two cities if there is a direct connection in the dataset.

closer to node B but away from C in that space. That means that the interactions between A and B increase and on the contrary that the interactions between A and C decrease.

**Joining nodes with Interaction distance** If a node joins the system and starts to interact with others, this can be viewed as a node coming from infinity and getting closer to other nodes.

**Churning nodes with Interaction distance** If a node churns and stops answering the other, this can be interpreted as a movement in the interaction space. It is equivalent as if the churning nodes moved to infinity.

"Regions" With Interaction Distance The concept of the "region" is harder to conceive with that new notion of distance. It might be useful to use the parallel with the Swiss rail network Figure 5.11, let's imagine a node at EPFL and try to conceptualize what might correspond to the equivalent of "local", "regional" and "global regions". The "local" region might be depicted with what places can be reached within 15 min of public transportation. As the frequency of some lines, e.g. the metro, are much higher than some bus lines, the places that are reachable by this means of transportation would be considered as local. At the regional level, it might be what places are reachable within 1 hour of public transportation. The global region still covers all the nodes.

#### **5.3.3** Justification to Replace the Locality

Changing the distance from the regular one to interactions might have some implications on the property that we want to keep in the system.

**Partition Resistance** Even more than preserving working regions composed of geographically close nodes, it might be more interesting to preserve the set of nodes that have many interactions. Since these are perhaps the nodes that are doing the most operations of the system. This justifies the use of this new distance.

**Region Validation for Transaction** One problem that Nyle wanted to solve was region validation to allow fast processing of transactions. This is still possible in that case. However, the region does not correspond to the same anymore. But they would correspond to the example depicted in subsection 5.3.2. This might be acceptable for a client.

#### 5.3.4 Protocol

The protocol is the same as the one described in Locarno Treaties in section 5.1. The only difference is that the distance is replaced by the new distance [Equation 5.2]. The computation of the number of messages is done in the following way: each node keeps track of the count of messages it receives from other nodes between epochs, and post the results at the beginning of the next epoch instead of the pings. Each node is able then to compute the new distance, and the algorithm for regions can be used directly. In the first epoch, as nodes did not have the time to interact a lot with each other, the map of the system will be very regular with the same distance between each node. One assumes that because of the underlying system, nodes will start to interact more with a small subset of other nodes, creating an ensemble of nodes that are close, upon which the local regions are created.

#### 5.3.5 Drawback

This new distance might have a lot of interesting properties, but the major drawback is that it can change a lot from one epoch to the next. Two examples can be seen in [Figure B.1] and [Figure B.2], where the new definition of the distance was used, and a map of the system was displayed using a force-directed graph drawing was used to take into account the distance between the nodes. It is interesting to notice that only using the control plane without having an underlying system has for consequence that most nodes have the same number of interactions. It is leading to a regular distribution in space. The only nodes that have less interaction are the nodes that are joining the system during this epoch, and they are farther away from the other. As the distance change more often, it might lead to more region transformations. But if the underlying system is working in a stable manner, one can expect that the number of interactions between two nodes stays more or less stable, which might correct this drawback.

### Chapter 6

# **Possible Improvements**

This chapter lists the improvements that could be applied more or less directly to certain parts of the project, but that was not implemented due to time reasons.

In the simple control plane protocol, the live clock that is supposed to be synchronised for every node could be replaced by Timestamps Logical Clocks (TLC) [6]. This could allow the system to be more flexible. However, this was not implemented as it was hard to see how to go from one epoch to another using TLC. Recall that in the existing protocol, at the beginning of the live period, one node of the old committee sends the necessary information to the new committee to begin. Synchronising this with TLC could be hard.

One other improvement that can be added is to allow clients to ask for the generation of regions with special meaning. For example, it could make sense to create a region that is corresponding to precise geographical areas. This could allow the client to know where its transactions are validated precisely. For example, it could mean more to him to know that his transaction is validated in Switzerland and Western Europe but not yet globally than knowing that its transaction is validated in some local area but not globally. It should be immediate to implement it, in the form of an API that accepts a description of a region and that match it to nodes that are inside the described region at the moment.

One of the assumptions that were taken is that the distribution of the levels would be geographically distributed at random. That is the case since the nodes are supposed to be geographically randomly distributed as well. However, it was stated that this aspect could be targeted by malicious nodes. Some mechanisms could be developed to ensure that the levels are geographically distributed at random to avoid this attack. One approach could be to compute the density of levels per region and to detect if it is more or less the same. If it diverges too much, a fall back to random attribution of levels could be applied.

For the sake of completeness, it is important to say that an adaptative approach for the control plane was considered. It was not using epochs, but adapting the regions directly when

nodes were performing an action (joining, leaving, moving). The related works can be found in this files [23], [24]. It was not easy to make this idea work, because if one wants that every node in the system has the same maps, each time that an action is detected it should be communicated to every other node, which was not manageable.

### 6.1 Roadmap

Of course, this work is just a small part of what is left to do to have the first version of Nyle control plane. Here is a list of what is to implement to have the first version of Nyle control plane and description of the current progress.

- Based on the location through time and space of nodes, build regions. (Done in this work)
- Use the transaction validation to give info on the validated region. This could be done in the form of an API. A client could send a request to some nodes to see if its transaction was already validated in a given region. The nodes could give updates each time another region has accepted his transaction. (To do)
- Dealing with moving actors. (Done in this work)
- Manage the transfer of data from one epoch to the next (To do)

Here are some steps that are required for the Data Plane of Nyle.

- In each of the region of the regions build a Blockchain. (Could use an existing one.)
- Dealing with double-spending issues. (To do) (if a node spends the same coin in different regions).

### **Chapter 7**

### Conclusion

This works proposed a control plane for locality-preserving blockchains. First, a simple version of the control plane was designed. This protocol splits the time into epochs, containing a registration period and a live period. Nodes can register for the next epoch by providing a valid *endorsement* to the participants of the current epoch during the registration period. The current participants then proceed to generate consensus on the list of future participants. At the beginning of the live period, all the pings between the participants are computed, and participants draw levels from a public source of randomness, and the regions are created deterministically from the pings and the levels. This first version is already reaching the goal that was expected from the control plane, which is to deal with nodes entering, leaving and moving in the system. The threat analysis was done, and it seems to be secure given that no more than  $f_i$  malicious nodes are in the system at any epoch i, with  $f_i$  given by  $3f_i + 1 = N_i$  and where  $N_i$  is the number of participants at the epoch i. However, it was demonstrated that this protocol was consuming many resources in memory and communication.

A series of improvements were proposed. The first one, called *Locarno Treaties* proposed to change the system of a lottery to allow nodes to keep their level, while ensuring that their final distribution was not unbalanced. It was then shown that with this improvement, the differences from one epoch to the next were reduced drastically. A second one, called *Fog of the War* was proposed to reduce the needs of communication. It is worked by changing the map of all pings between participants in the system with a declared position, which is then checked by a committee of checkers. The security analysis of this improvement was done, as well. However, the implementation was not made due to time reasons.

A third improvement called *Space/Time Interaction Distance* was proposed as well. The idea of this improvement was to change the notion of locality, from the conventional interpretation of *distance* to a new one. With this new interpretation, nodes that are interacting a lot are viewed as close. Contrariwise, nodes that do not communicate are separated with an infinite distance. A node that churns is seen from the others as a node which is moving towards infinity.

The implementation of the simple version of the control plane, the first and the third Strawman was made in Go. It was done using the Cothority Framework and based on an existing code base from Cristina Basescu. The evaluation was made on Deterlab. This work enhances Nyle by proposing a control plane, which is necessary as the system of nodes that run Nyle is not supposed to be stable. It should be possible for nodes to leave, join and move into the system, which is made possible by the proposed control plane. Other applications that are based on CRUX [2] might consider using this work to ensure that nodes can move, churn or enter in the system.

It was a pleasure for me to do this work. Working with locality-preserving blockchains allowed me to dive into the blockchain world and to discover a lot of new technologies. Working with the Cothority Framework was an exciting experience, and it sharpened my programming skills by understanding concurrency better. I found that the logic of decentralized and distributed systems are complex, but I find it really interesting to develop protocols for these systems.

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# **Appendix A**

# **Locarno Treaties: Data**

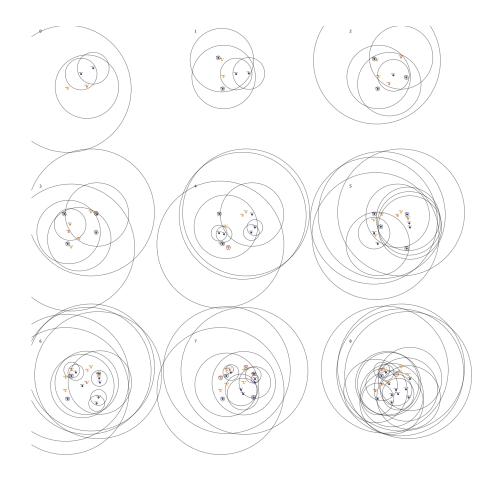


Figure A.1 – Graphs of the system using random lottery at each epoch, the levels are depicted in different colors.

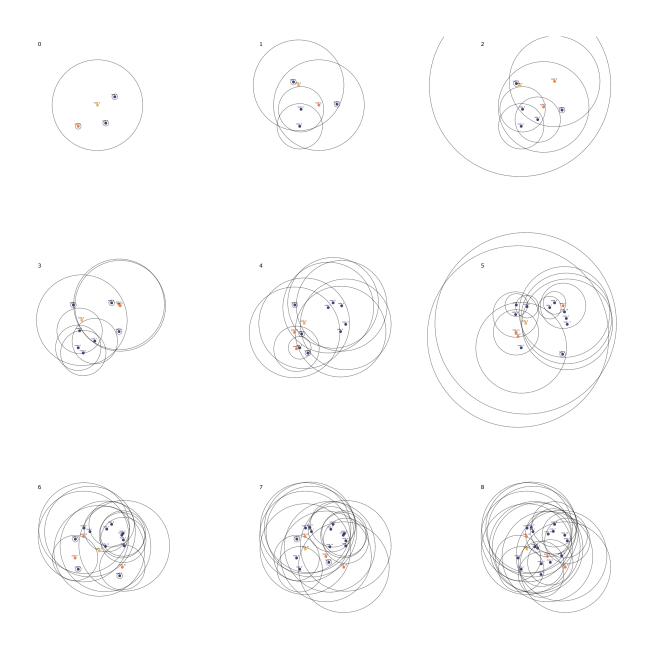


Figure A.2 – Graphs of the system using  $Locarno\ Treaties$  lottery at each epoch, the levels are depicted in different colors.

# **Appendix B**

# **Space Time: Data**

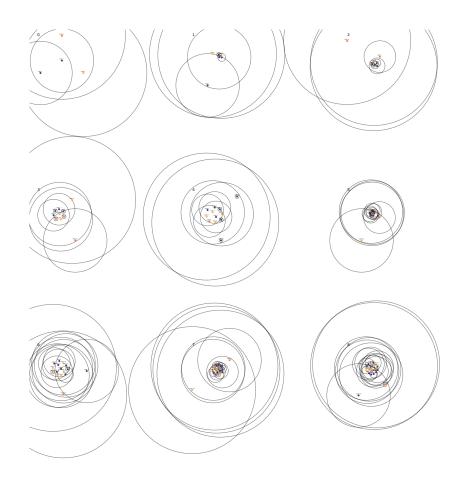


Figure B.1 – Graphs of the system using the new definition of the distance and random lottery at each epoch, the levels are depicted in different colors.

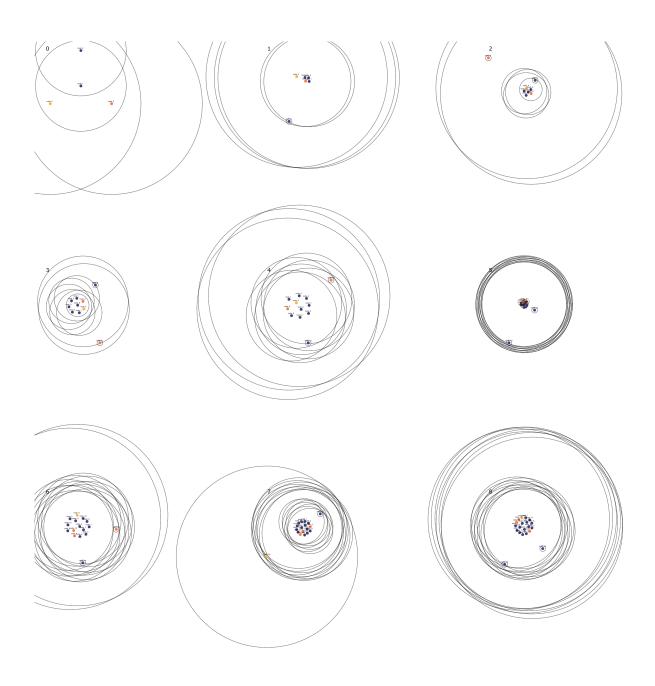


Figure B.2 – Graphs of the system using the new definition of the distance and *Locarno Treaties* lottery at each epoch, the levels are depicted in different colors.

	Name	Random Level	Locarno Level	X	Y	SpaceTime X	SpaceTime Y
)	Node 0	0	0	40.31	254.23	24.79	-48.22
l	Node 1	0	0	60.26	98.32	48.49	-25.58
2	Node 2	0	1	148.63	134.85	28.17	-26.93
3	Node 3	2	0	195.48	236.62	45.51	-46.47
4	Node 4	2	2	31.55	26.72	-22.07	-52.79
5	Node 5	0	0	250.73	129.83	-64.90	200.00

Table B.1 – Description of the system for Epoch 1.

	Name	Random Level	Locarno Level	X	Y	SpaceTime X	SpaceTime Y
)	Node 0	0	0	40.31	254.23	49.46	19.91
1	Node 1	0	0	21.96	259.85	34.73	34.54
2	Node 2	0	1	148.63	134.85	51.27	42.54
3	Node 3	2	0	201.12	27.50	23.04	53.01
1	Node 4	2	2	49.25	27.52	25.75	11.01
5	Node 5	0	0	250.73	129.83	11.69	28.96
6	Node 6	1	1	237.37	23.28	-190.00	-158.04
7	Node 7	1	0	151.83	224.03	74.06	-31.92

Table B.2 – Description of the system for Epoch 2.

	Name	Random Level	Locarno Level	X	Y	SpaceTime X	SpaceTime Y
0	Node 0	0	0	40.31	254.23	-57.44	-3.48
1	Node 1	0	0	21.96	259.85	-12.92	-51.60
2	Node 2	0	1	148.63	134.85	21.74	-34.24
3	Node 3	1	0	294.78	88.66	-37.94	26.42
4	Node 4	1	2	54.87	47.19	27.06	8.88
5	Node 5	0	0	274.02	290.94	-43.06	-37.13
6	Node 6	2	0	237.37	23.28	-8.13	-12.40
7	Node 7	2	0	151.83	224.03	1.12	30.00
8	Node 8	2	0	68.63	283.58	92.18	-126.46
9	Node 9	1	1	270.43	9.18	117.42	200.00

Table B.3 – Description of the system for Epoch 3.

	Name	Random Level	Locarno Level	X	Y	SpaceTime X	SpaceTime Y
0	Node 0	0	0	40.31	254.23	-7.61	-65.71
1	Node 1	0	0	21.96	259.85	-65.57	-45.77
2	Node 2	0	0	94.82	270.93	2.92	10.83
3	Node 3	0	0	73.13	21.70	33.37	-50.91
4	Node 4	2	2	22.54	190.61	-23.89	-26.00
5	Node 5	0	0	274.02	290.94	44.76	33.88
6	Node 6	2	0	237.37	23.28	-3.04	55.86
7	Node 7	2	0	284.77	51.97	48.17	-11.59
В	Node 8	1	0	289.02	242.48	-51.31	46.13
9	Node 9	2	1	270.43	9.18	-73.01	7.58
10	Node 10	0	1	17.92	180.81	172.23	-154.31
11	Node 11	0	0	281.74	114.36	43.01	200.00

Table B.4 – Description of the system for Epoch 4.

	Name	Random Level	Locarno Level	X	Y	SpaceTime X	SpaceTime Y
0	Node 0	0	0	40.31	254.23	-4.61	-24.37
1	Node 1	0	0	195.36	135.24	24.83	-31.13
2	Node 2	0	1	121.80	59.15	30.13	-20.63
3	Node 3	0	0	78.31	38.28	21.02	-2.93
4	Node 4	0	2	22.54	190.61	0.92	-4.09
5	Node 5	0	0	158.61	150.27	-5.84	-13.89
6	Node 6	2	0	237.37	23.28	9.32	-14.03
7	Node 7	1	0	284.77	51.97	27.10	-10.89
В	Node 8	2	0	294.03	246.83	15.94	-24.40
9	Node 9	2	1	204.49	215.15	1.63	-32.49
10	Node 10	0	1	17.92	180.81	11.97	-36.47
11	Node 11	0	0	296.34	115.18	10.98	0.09
12	Node 12	1	0	64.98	126.63	70.62	15.25
13	Node 13	2	0	8.71	66.51	-74.01	200.00

Table B.5 – Description of the system for Epoch 5.

	Name	Random Level	Locarno Level	X	Y	SpaceTime X	SpaceTime Y
)	Node 0	0	0	40.31	254.23	-51.31	-57.07
l	Node 1	0	0	195.36	135.24	56.70	-11.64
2	Node 2	0	0	121.80	59.15	3.24	-13.90
3	Node 3	0	0	78.31	38.28	44.51	-42.24
1	Node 4	0	2	22.54	190.61	-10.86	-78.06
5	Node 5	0	0	158.61	150.27	38.49	30.07
3	Node 6	2	0	237.37	23.28	4.57	42.91
7	Node 7	2	0	307.43	56.86	24.73	4.95
3	Node 8	1	0	294.03	246.83	-63.98	10.68
9	Node 9	2	1	204.49	215.15	-25.86	39.11
10	Node 10	0	1	33.84	197.23	-30.96	9.05
11	Node 11	0	0	188.26	181.69	-19.49	-45.90
12	Node 12	2	0	132.69	134.87	22.46	-59.31
13	Node 13	2	0	8.71	66.51	-62.99	-22.44
14	Node 14	1	0	131.37	148.74	20.75	191.27
15	Node 15	0	1	69.93	69.26	210.00	2.51

Table B.6 – Description of the system for Epoch 6.

	Name	Random Level	Locarno Level	X	Y	SpaceTime X	SpaceTime Y
0	Node 0	0	0	40.31	254.23	44.82	-32.46
1	Node 1	0	0	195.36	135.24	23.69	-42.40
2	Node 2	0	0	127.36	71.11	37.25	0.45
3	Node 3	0	0	78.31	38.28	-13.90	18.27
4	Node 4	0	1	22.54	190.61	54.95	-12.59
5	Node 5	0	0	158.61	150.27	54.23	11.40
6	Node 6	1	0	237.37	23.28	22.88	34.34
7	Node 7	2	0	307.43	56.86	-18.81	-17.10
8	Node 8	2	0	153.08	223.42	38.19	24.37
9	Node 9	2	0	116.75	127.76	-10.41	-33.05
10	Node 10	0	1	152.15	283.84	12.76	12.53
11	Node 11	0	0	188.26	181.69	5.31	-40.87
12	Node 12	1	0	132.69	134.87	26.25	-21.53
13	Node 13	1	0	8.71	66.51	-22.57	3.59
14	Node 14	2	0	131.37	148.74	5.87	-8.45
15	Node 15	0	1	86.54	79.72	-1.75	31.73
16	Node 16	2	2	65.63	137.88	-190.00	157.01
17	Node 17	1	0	100.00	20.72	111.23	-85.22

Table B.7 – Description of the system for Epoch 7.

	Name	Random Level	Locarno Level	X	Y	SpaceTime X	SpaceTime Y
0	Node 0	0	0	40.31	254.23	55.84	-6.18
1	Node 1	0	0	211.18	244.47	20.42	-63.24
2	Node 2	0	0	127.36	71.11	23.97	26.69
3	Node 3	0	0	94.11	55.61	3.17	32.03
4	Node 4	0	1	36.39	192.52	43.25	13.27
5	Node 5	0	0	158.61	150.27	54.84	-32.35
6	Node 6	2	0	259.99	52.13	-12.69	-10.00
7	Node 7	2	0	307.43	56.86	-36.79	-17.48
В	Node 8	1	0	153.08	223.42	37.13	-12.09
9	Node 9	1	0	116.75	127.76	13.46	2.65
10	Node 10	0	1	239.23	257.28	-31.06	-37.56
11	Node 11	0	0	188.26	181.69	-13.74	20.71
12	Node 12	2	0	132.69	134.87	-28.60	8.46
13	Node 13	0	0	8.71	66.51	1.51	-31.86
14	Node 14	2	0	145.68	155.97	26.88	-37.18
15	Node 15	0	1	43.55	199.44	-18.76	-53.44
16	Node 16	1	2	73.22	140.48	-0.38	-62.24
17	Node 17	2	0	56.03	16.60	43.18	-51.05
18	Node 18	0	0	82.08	35.23	-98.10	200.00
19	Node 19	1	0	193.24	68.52	116.45	110.87

Table B.8 – Description of the system for Epoch 8.

### **Appendix C**

### **Dataset on Master Thesis**

Here are some important random facts about this master's thesis. The aggregation of data was stopped the day of the printing.

Language	Files	Blank	Comment	Code
Go	26	1'272	841	4'285
TeX	8	316	124	2'061
Jupyter Notebook	4	0	2312	449
Python	4	79	2	315
Markdown	4	60	0	135
Total	47	1'732	3'279	7'241

Table C.1 – Line of code for the different languages used in that project.

Number of	Total
Commits	192
Coffees	276
Days	90
Graphs	28

Table C.2 – Some random stats.