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PulsarCast

Scalable and reliable pub-sub over P2P networks

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Thesis to obtain the Master of Science Degree in

Information Systems and Computer Engineering

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October 2019

Acknowledgments

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Abstract

The publish-subscribe paradigm is a wildly popular form of communication in complex distributed systems. A lot of research exists around it, with solutions ranging from centralised message brokers, to fully decentralised scenarios (peer to peer). When we are focusing on scalability, decentralisation poses the best option. There is, however, a clear lack of decentralised systems accounting for reliability, message delivery guarantees and, more importantly, persistence. To this end, we present PulsarCast, a decentralised, highly scalable, pub-sub system seeking to give guarantees that are traditionally associated with a centralised architecture such as persistence and eventual delivery guarantees.

Keywords: Publish Subscribe, Peer to peer, Reliability, Persistence, Eventual delivery

Resumo

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Palavras-Chave: TODO

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Chapter 1

Introduction

The publish-subscribe (pub-sub) interaction paradigm is an approach that has received an increasing amount of attention over the course of the century [2] [3]. This is mainly due to its special properties, that allow for full decoupling of all the communicating parties. Taking a closer look at this definition one can see that this comes hand in hand with the way information is consumed nowadays, with the exponential growth of social networks like Twitter and the usage of feeds such as RSS.

1.1 Motivation

First, we should define what the publish-subscribe pattern is. In this interaction paradigm, subscribers (or consumers) sign up for events, or classes of events, from publishers (or producers) that are subsequently asynchronously delivered. This decoupling can be broken into three different parts. The decoupling in time, space and synchronisation.

The time decoupling comes from the fact that publishers and subscribers do not need to be actively interacting with each other at the same time; this means that the publisher can publish some events while the subscriber is disconnected and the subscriber can be notified of an event whose publisher is disconnected. Space decoupling gives both parties the benefit of not needing to know each other in order to communicate, given that consumers and producers are focused on their specific roles (consuming/producing) and do not care for who is doing what, or how many producers are for example. Synchronization decoupling is a consequence of the asynchronous nature of the pub-sub pattern, as publishers do not need to be blocked while producing events and subscribers can be asynchronously notified. The decoupling that this kind of system offers makes it the ideal candidate for very large networks that need a way to communicate in an efficient way.

Due to the properties described above, a lot of applications rely on the publish-subscribe paradigm and a lot of work has been done by companies like Twitter ¹ and LinkedIn into making these systems capable of scaling to a large number of participants, with the creation of tools like Kafka ², which aim at guaranteeing low latency and high event throughput. Other examples are the multiple message queue systems like Apache Active MQ ³, RabbitMQ ⁴, Redis ⁵, etc. These solutions are, of course, centralised and as such suffer from all the common issues that affect centralised solutions: it is quite hard to maintain and scale these systems to a large number of clients. Peer-to-Peer networks, on the other hand, have proven numerous times, that this is where they shine, with examples such as Gnutella, Skype and most

¹<https://www.infoq.com/presentations/Twitter-Timeline-Scalability>

²<http://kafka.apache.org/documentation/#design>

³<http://activemq.apache.org/>

⁴<https://www.rabbitmq.com/>

⁵<https://redis.io/topics/pubsub>

recently IPFS ⁶. All of these systems are a living proof of the high scalability P2P can offer, with pub-sub systems over P2P networks being an active research topic with a lot of attention.

1.2 Goals

As we are going to cover in the next sections, lots of different solutions exist. However, most of them either rely on a centralised or hierarchic network to have a reliable system, with stronger delivery and persistence guarantees, or end up sacrificing these same properties in order to have a decentralised system with the potential to scale to a much larger network.

The solution we propose is Pulsarcast, a pub-sub module with a strong focus on reliability, eventual delivery guarantees and data persistence, while maintaining the ability to scale to a vast number of users. Our solution takes advantage of the network infrastructure and network protocols we have in place today. There is also, to the best of our knowledge, a lack of pub-sub systems with such a strong focus on persistence, which is something our solution does.

1.3 Document Roadmap

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⁶<https://ipfs.io/>

Chapter 2

Related Work

In this section, we will cover the research work and industry references that can be considered relevant to our initial objective. The following section 2.1 will lay the ground to define how pub-sub systems are structured. In section 2.2 we will cover a set of systems defined as relevant. Finally, section 2.3 will address some of the web technologies of interest in this area.

2.1 Distributed Publish-Subscribe Paradigm

In this section we will cover the basis of the pub-sub paradigm, defining a taxonomy we will later use to classify relevant systems. We will start by covering the *Subscription Model*, followed by the *Network Architecture* and *Overlay Structure*. Finally, we address the *Subscription Management and Event Dissemination*.

2.1.1 Subscription Model

When considering pub-sub systems, there is a set of different options that will lay ground for the behaviour of the whole system. We call these options, design dimensions. Specifically, in our case, one of the biggest decisions when designing a pub-sub system is what kind of subscription model to use. The subscription model determines how subscribers will define which events they are interested in. There are three major approaches covered by relevant literature [2] [3] and that implementations usually follow:

- Topic based subscriptions
- Content based subscriptions
- Type based subscriptions

Topic based subscription model employs, as the name states, the notion of topics or subjects to allow participants to subscribe to relevant content. These topics are identified by keywords and can be naturally viewed as a group or a channel to which participants can send messages (publish) and receive messages (subscribe). This approach was one of the earliest models in the pub-sub paradigm, with references such as TIBCO ¹, mainly due to its similarity with the group communication systems already in place at the time. Some examples of the topic based approach allow building a topic hierarchy. A specific one is using a UNIX path like approach, which allows a topic hierarchy just like paths in a file system. Consider as an example:

¹<https://www.tibco.com/>

```
/fruits
/fruits/citrus
/fruits/citrus/orange
```

The list above is an example of 3 topics, that act as 3 different tiers on a hierarchy. This allows for specialisation and the possibility to extend the subscription structure already in place. There are numerous solutions that cover the topic based subscription scenario. Specifically, in the distributed/decentralised area, we have solutions like Scribe [4], Bayeux [5], Tera [6] and Poldercast [7].

The content based subscription model brought a different approach that sought to use the content of the event message itself as a way for subscribers to specify the messages they were interested in [8]. Essentially, subscribers could define fields, or conditions on those same fields that would make an event match a subscription or not. Consider the following example of a simple message and subscription, represented using JSON ².

Message

```
{
  exchange: "Euronext Lisboa",
  company: "CTT",
  order: "buy",
  number: "100",
  price: "5.55",
}
```

Subscription

```
{
  exchange: "Euronext Lisboa",
  order: "buy",
  number: ">50",
  price: "<10",
}
```

The example above translates into a subscription to a stock exchange pub-sub system, where the client would receive all the event messages for *buy orders* of more than 50 stock actions for a maximum price of 10€. The notion of subscription is much more complex in this model but allows for a much more powerful, expressive and accurate message filtering. Usually, in order to implement this, systems rely on the definition of schemas as a way to create subscriptions. Some examples of solutions that follow a content based subscription model are Gryphon [9], Jedi [10], Siena [11], Meghdoot [12], Mercury [13] and Sub-2-sub [14].

Also worth referencing is the **type based subscription model**. [15]. The type based model seeks to use the type scheme of a programming language without introducing a topic hierarchy. Instead, it focuses on the idea that, in practice, messages part of the same topic usually are of the same type and notify the same kind of event. As such we can rely on a straightforward type-safe interpretation of messages belonging to the same topic, since most topic based systems only offer, at most, weakly typed interfaces. This, of course, comes quite handy when working with strongly typed languages such

²<https://www.json.org/>

as Java and C++. One other aspect also worth mentioning is that, similar to topic based systems, the type based system also offers a notion of hierarchy through sub-typing. In this area, Hermes [16] is a reference system implemented on top of a distributed network.

While looking back at these different models it is crucial to understand how they are tied to the expressiveness of the system as a whole. Choosing a topic based subscription model will allow for an easier implementation when it comes to message filtering at each node, but it will clearly affect the capabilities of the system. On the other end, a content based subscription model allows for a lot more expressiveness in subscription definition, but it makes it a lot harder to implement a scalable way of filtering messages. It is also important to note that these three categories are not strict distinct models, but somewhat fluid and subject to hybridisation, as is quite possible to have solutions in between, such as content based filtering through the use of special topics, or content based filtering only for pre-set fields. As such, not all approaches are easy to categorise and, for some specific scenarios and systems, the line is quite thin between the multiple subscription models.

It is also interesting to look at the application space and notice that not all applications have the same expressiveness requirements. This makes the existence of multiple subscription models not only justifiable but required. Consider the example that was given above for a stock exchange system: this kind of applications have a need for a complex set of subscription patterns, quite different from the ones you would probably have for a chat or social media application, which would rely heavily on the notion of topics and groups.

2.1.2 Network Architecture

Independently of the subscription model used, the system approach to the network architecture is crucial as it will, not only set the way clients interact with it, but will also determine a lot of the properties that the solution will benefit from (such as scalability, reliability, etc.). Networks can generally be categorised as centralised or decentralised.

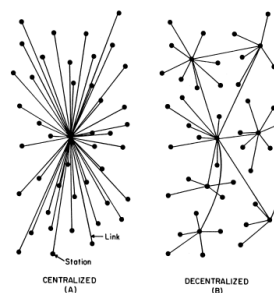


Figure 2.1: Example of a Centralised and a Decentralised network, extracted from [1]

Note that the goal of a pub-sub system is to enable the exchange of events in an asynchronous manner, with the decoupling of producers from consumers as previously discussed. This can be easily achieved using an entity which is responsible for receiving the messages from the producers, storing them and distributing them across all the consumers. This is what we refer to as a **centralised architecture**, motivated by the need of this central entity. This is the approach adopted by a lot of the message queue systems like Apache Active MQ, RabbitMQ and Redis. The usual focus for applications relying on this kind of systems is on reliability and data consistency but with a low data throughput. Typically expected to operate in a more stable environment, such as datacenters. Figure 2.2 is an example to illustrate how would a centralised pub-sub system work.

Being the broad term that it is, centralised encompasses a lot of different solutions. One can have

centralised solutions that employ a distribution of load through different nodes in order to improve the overall scalability of the system. In the pub-sub field, these networks of servers are commonly referred to as brokers. There are multiple pub-sub systems that follow this approach. More precisely Gryphon [9], Siena [11] and Jedi [10]. But, even between them, there are some clear differences on how these broker networks organise. In both Gryphon and Jedi, these nodes organise in a hierarchical fashion, or define what we call a **broker hierarchy**. As for Siena, the nodes resort to not following a specific structure, making it effectively a **broker mesh**.

The asynchronous nature of the pub-sub paradigm also allows for a different approach to message forwarding, with both producers and consumers being responsible for storing and forwarding messages, without the need of an intermediary entity. This approach is referred to as a **decentralised architecture** as there is no central entity that could easily become a bottleneck for the whole system. Additionally, when the network is **fully decentralised** it is commonly referred to as peer to peer (P2P) architecture, for it relies solely on the communication between peers in the same network. An example of a pub-sub system following this approach is Scribe [4]. This kind of systems have a great focus on scalability and, consequently, on efficient message delivery.

2.1.3 Overlay structure

Working with a P2P architecture has its own set of challenges. When we rely on the communication between peers we need a way to create and maintain links between multiple nodes in a network. Hence the overlay networks. The idea is to have a structure of logical links and nodes, independent of the physical network beneath them that actually powers the communications through. Unlike traditional layer-3 networks, the structure of these overlays is not dictated by the fairly static physical topology (presence and connectivity of hosts), but by logical relationships between peers. This way we have the potential to manipulate the logical network at the application level, without needing to change the network backbone that connects the nodes. This approach was key to deploy P2P applications such as Gnutella ³, Kazaa ⁴ or Skype ⁵ on top of the existing Internet infrastructure.

In practical terms, each node maintains a view of its neighbours in the overlay network, which translates into the communication links between them. There are different approaches to the way this state is stored and maintained, with two main categories dominating the P2P ecosystem. At one end of the spectrum we have the **unstructured overlay** networks, where peers form a network with no clear structure or hierarchy (commonly referred to as a network mesh) with each peer connected to a subset of other nodes independent of their ID, localisation, network IP address, etc.

³<https://web.archive.org/web/20000620113133/http://gnutella.wego.com>

⁴<https://web.archive.org/web/20040701062605/http://www.kazaa.com:80/us/index.htm>

⁵<https://www.skype.com>

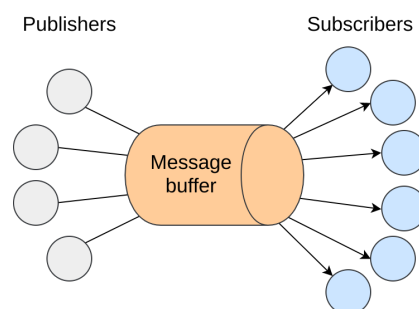


Figure 2.2: Example of a centralised message broker

Unstructured overlays: These rely on membership protocols that try to preserve a couple of key properties, such as the network diameter and its average degree. A great amount of these membership protocols use gossip based (also referred to as epidemic) approaches in order to do this. These approaches exploit properties that arise when information is disseminated in a random, or close to random, way. These probabilistic approaches help to keep the overlay connected in the event of network failures.

One relevant example is Cyclon [17], a membership protocol that uses a gossip based approach to help maintain a network which resembles a random graph in terms of degree distribution, clustering coefficient and path length. In order to do this, the approach followed by Cyclon is, at each node, besides keeping a fixed size of neighbours (other nodes in the network), to also keep information on when for the last time that node was contacted. Periodically, each node contacts the oldest node of its neighbours (i.e. the node which has been the longest time without being contacted) and shares with it a fixed size partial list of its neighbours, to which the contacted peer replies back with its own partial view of its neighbours. Each node updates its neighbours list with the new info (either by filling empty cache slots or by replacing entries that were sent in the previous contact). It is also worth noting that during this exchange, the node that initiated the contact will drop the contacted node of its neighbour list, as the contacted node will inversely add the node that established contact to his. This way we end up with a uniform and organic way to disseminate node information across the network. This approach is based on a technique named shuffling [18].

The unstructured overlay has an interesting set of properties, such as its ability to accommodate a highly dynamic network with a high resilience to network failures and churn (i.e. high volumes of changes in network participants). However, the lack of structure in the network usually limits the kind of queries for content one can run through. The delivery of messages in the network will always follow a probabilistic best effort approach. Finally, unstructured gossip based approaches rely on a pre-set of conditions that, if not met accordingly, may affect the whole behaviour of the system [19]. For example, the selection of neighbours is a key aspect and should assume a random or pseudo-random fashion. If disturbed by a small set of nodes that could either be malfunctioning or behaving selfishly, the basic properties of the network like its resilience could be severely affected.

Structured overlays: On the other end of the spectrum of overlay networks we have the **structured overlay**, where peers are organised according to a specific structure, like a ring, a tree or a

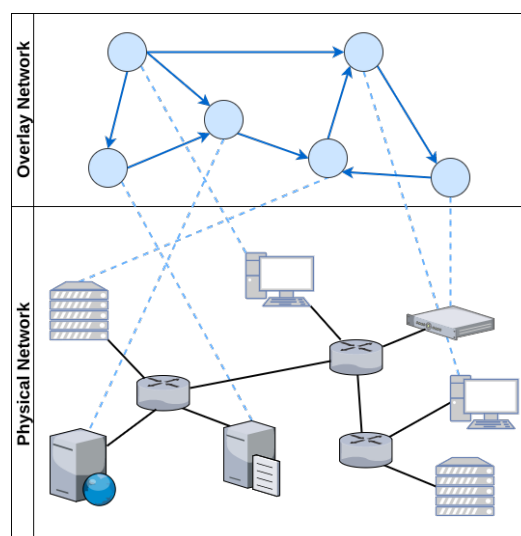


Figure 2.3: A comparison between the physical network and a logical overlay

multi-dimensional space. This is usually achieved by imposing constraints on how the nodes should be organised based on their identifiers. In order to do this, a common approach is to think of the ID space as a hash table to where the content should then be distributed. The distribution of content is then done based the value of the keys generated for each piece of information, keys with values close to a node ID will be stored in that node. This is commonly referred to as a Distributed Hash Table (or DHT for short) since the key space is distributed across multiple nodes. For example, **Chord** [20], one of the first examples of a DHT, organises the nodes in a ring like structure based on their ID (which results from the SHA-1 hash ⁶ of its IP address). The content is then distributed in this key space, using the same hashing function to produce the content key that was used to produce the node ID.

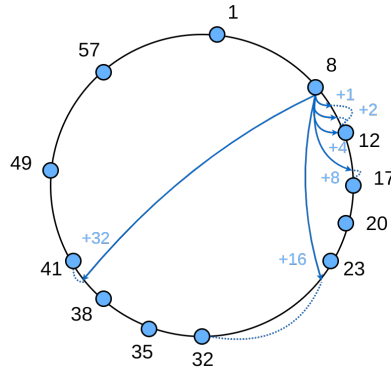


Figure 2.4: Example of a simple Chord ring and the finger table of a node

It is common for Distributed Hash Tables to have a cost of $O(\log N)$ in terms of the number of nodes contacted, on average, to search for a given key (where N is the number of nodes in the network). Chord base structure per se only gives us $O(N)$, as such, Chord uses a mechanism to allow for a speedier search. At each node, an additional routing table is kept with m entries, where m is the number of bits in the key space. Each i th entry in this table will be this node's successor (next node in the ring in a clockwise direction) with an ID, at least, bigger than 2^{i-1} (modulo 2^m) in the key space. For example, for a node with ID 8, the 4th entry will be the first node in the ring with an ID larger than 16. This table, also referred to as finger table, will allow for a logarithmic search as demonstrated in Chord's specification.

Another approach is followed by **Kademlia DHT** [21]. Just as in Chord, nodes have 160 bit identifiers and content is stored in the nodes whose IDs are close to the content key (160 bit identifiers too), but the way the routing tables are structured and maintained is quite different. For starters, Kademlia relies on a XOR based distance metric between 2 keys, where the distance between 2 keys is the resulting bitwise XOR operation interpreted as an integer. The XOR metric gives us an interesting set of properties. It is unidirectional (just like Chord clockwise direction) ensuring that lookups for the same key converge along the same path but, unlike Chord, it is symmetric, as such, the distance between x and y is the same as the distance between y and x . This symmetry allows Kademlia queries to give valuable insights along every node they go through, helping out in populating each node's routing table.

Kademlia nodes keep contact information about each other in a list, size m where m is the number of bits used for the keys in the system, and where each entry is a list itself of maximum size k (a system wide parameter) containing all the known nodes of distance between 2^i and 2^{i+1} of itself. These lists are appropriately called k -buckets and are kept sorted by time last seen (least recently seen node at the head). Whenever a node receives a message, it updates the appropriate k -bucket for the sender's node ID, inserting it in the respective k -bucket or moving it to the tail of the list if it is already there. K -buckets aim at implementing a least-recently seen eviction policy, where live nodes are never removed. This

⁶<https://tools.ietf.org/html/rfc3174>

stems from a careful analysis of Gnutella trace data [22] where the longer a node has been up, the more likely it is to remain up for another hour. Whenever a node wants to retrieve or store content it uses a recursive node lookup procedure in order to find the k closest nodes to a given key. This lookup can be run with multiple queries in parallel, because nodes have the flexibility to forward messages to any of the k nodes in a bucket, aiming for lower latency.

A completely different method is used in the **Content Addressable Network DHT**[23]. In CAN, the key space used to address the content stored in the DHT is a virtual d -dimensional Cartesian coordinate space. In order to store and retrieve content, the generated keys use a uniform hashing function that maps the key into the d -dimensional space, resulting in a point. The overall space is split into different areas referred to as zones. Each node is responsible for a zone and, consequently, for all the keys stored in that zone. Retrieving a key can be done by calculating its corresponding point in the d -dimensional space and, if the point does not belong to this node space or any of its neighbours (nodes responsible for adjacent zones) it can be routed through CAN infrastructure in order to find the node responsible for storing the key. Intuitively, routing in CAN works by following the straight line from the source to the destination coordinate in the Cartesian space. In practice, this is done by forwarding the message to the neighbour closest to the destination coordinate. Interestingly enough, the usage of a multidimensional space as the key space for the DHT, makes the distance metric in the CAN DHT as a simple Cartesian distance between two points.

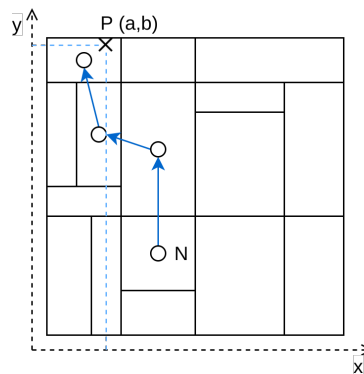


Figure 2.5: Example of a 2 dimensional CAN routing command

Other popular examples in the DHT field are **Pastry** [24] and **Tapestry** [25] (that we kept out for the sake of simplicity, although a lot of the mechanisms described above apply to these). DHTs present a set of interesting benefits, such as good routing performance (usually logarithmic in the number of nodes), the limited size of state kept at each node (usually logarithmic routing tables), a better support for exact match and other complex queries and also present stronger guarantees on message delivery. If the hashing function is properly selected it can also be ensured that the load is balanced properly across the network. However, these networks lack the tolerance for heavy network partitions and network churn that the usual unstructured network can bare with.

Hybrid overlays: As with everything discussed so far, not every solution lies at each end of the spectrum, and overlay structure is no different. Recent research has been pushing more and more towards hybrid solutions that take advantages of both sides. Such example is **Vicinity** [26] which employs Cyclon (discussed above) as a peer sampling service to help out in building an ideal structure that links nodes based on their proximity (for some notion of proximity, e.g. latency, localisation, etc.). In the end, we get a structured overlay, generated from an unstructured, gossip based, overlay (hence the hybrid solution). More importantly, this overlay will have properties that guarantee that it is an almost ideal structure for a

given proximity metric. The Vicinity system discusses that the usage of probabilistic mechanisms helps out in keeping a healthy and reliable structure.

2.1.4 Subscription Management and Event Dissemination

Now that we have set the underlying structures that power up the network, it is time to cover the specific requirements of a pub-sub system. We have two different aspects to cover: subscription management and event dissemination. By subscription management we refer to a set of key factors that will determine the overall performance of the pub-sub system, specifically in terms of matching events with subscribers, the selected representation for subscriptions, registering new subscriptions and deleting subscriptions. Event dissemination dictates how will the events be propagated through the system, in a way that avoids burdening specific nodes, but assures that all the subscription requirements are met. It is natural that in some ways these two aspects are connected (e.g. the way we store our subscriptions will probably impose a set of restrictions on how our events will be propagated) but it is still possible to make a clear distinction between how they work and their role in the overall system.

As discussed before, in order to match subscribers with publishers, some kind of state must be kept (what we refer to as subscriptions). There are plenty of ways of doing this and factors like network architecture and subscription model come into play here. For a system with a centralised architecture, this is not such a big challenge, since the central nodes will be responsible for keeping and managing the state, matching events with the correct subscribers and making sure the event propagation works accordingly. However, in a distributed or a decentralised scenario, this is not such a trivial problem to solve.

One interesting property of topic based systems in a decentralised and distributed scenario is that their subscription management and event dissemination can be easily implemented with an application level multicast system if we cluster subscribers of some topic/group in a single structure (e.g. a multicast tree). For example, consider the topic */foobar* issued by a particular node in a pub-sub system. If, when new subscriptions are issued to this node, a tree like structure is built that allows events related to this topic to flow accordingly, disseminating a new event in */foobar* is just a matter of sending the event to the root of the tree. From there, dissemination can flow blindly through the multiple links. Subscriptions are then represented as simple dissemination trees for each topic, which, interestingly enough, ends up also representing how the actual events will be propagated in each topic. The root node (or nodes) acts as a *rendezvous* which, as the name suggests, it is where events are targeted at and new subscriptions issued to. The core idea is that, by relying on such nodes, eventually, all the system state will be synchronised (all the events will be propagated to the expected nodes and no subscription is left unattended). This does not mean that other nodes cannot cache state though, the idea of the *rendezvous* is to have a basic reassurance in subscription management and event dissemination. Ideally this would be implemented in a distributed fashion, keeping as much pressure out of the *rendezvous* node as possible. This is the approach followed by Scribe and Bayeux.

The usage of *rendezvous* nodes and tree like structures to represent subscriptions is not something particular to topic based systems. There are examples of these techniques in content based systems also, specifically Gryphon and Jedi. Hermes, on the other hand, is an example of the same mechanisms with a type based subscription model. A more detailed description of how this is done in Gryphon and Scribe will be made further along since they have different approaches motivated by their different options in network architecture and subscription model.

For content based systems though, a common approach is to use multidimensional spaces as a way to represent subscriptions. The idea is to have each dimension refer to a specific attribute of the pub-sub schema.

```
{
  exchange: String,
  company: String,
  order: String,
  number: Integer,
  price: Float,
}
```

Considering the example above, we could map each of the given attributes to a given dimension and end up with a 5 dimensional space that we could use to route events accordingly. Meghdoot is an example of a content based pub-sub system that follows an approach close to this one, using a CAN DHT with $2n$ dimensions, where n is the number of attributes in the schema. We will cover Meghdoot further down, but it is worth mentioning that there are other alternatives to using a multidimensional space DHT to replicate this behaviour. Mercury for example relies on the usage of several ring-based DHTs to recreate this multidimensional space and support range queries, using one DHT per attribute.

A different approach to managing subscriptions and disseminating events in topic based systems is by having an overlay for each different topic. The idea is that by clustering nodes one can afford an easier event dissemination as well as an easy way of matching events with subscribers, since it is just a matter of propagating a given event inside its overlay. In order to keep everything connected, a general overlay can be used, that will allow all the nodes to have visibility on the whole set of topics. In this scenario, subscriptions are simply represented as being part of a specific network of peers, that could take any form or shape, or even be unstructured. For an unstructured network, the propagation of events could be a simple flooding algorithm, as it happens in Tera. Tera, a topic based pub-sub system, follows an approach close to this one. It keeps two distinct gossip based overlays, one responsible for keeping state on entrypoints for each topic (peers which are subscribed to a given topic and that can act as dissemination points for it) and another used to keep the subscribers of each topic. This clustering approach, where subscribers of a given topic are kept in a topic specific overlay, helps out in the dissemination step after an event has been published and reached the cluster. Another example following this approach is Poldercast, which uses a set of three different overlays to keep the pub-sub network running. We will cover Poldercast more thoroughly later on.

2.2 Relevant Pub-Sub Systems

We now describe in further detail the systems which most resemble the work we are going to do.

2.2.1 Gryphon

Gryphon [9] is a content based pub-sub system built on top of a centralised broker hierarchy topology. Developed at IBM, Gryphon uses an interesting approach to match events with subscriptions [27]. Gryphon relied on a distributed broker based network to build a tree structure representing the subscription schema. Considering a schema with multiple attributes - A_1, \dots, A_n - each level on the subscription tree would represent a specific attribute. So, for example, if we were to have an event with a value V_1 for the attribute A_1 , at the root node (which represents the attribute A_1) the link followed by the event would be the one that would represent the value V_1 . The event would then be propagated through the multiple branches of the tree until it arrives at the broker node that represented all the specific values for that event. From there it would then be propagated to all the subscribers registered with that broker node. Figure 2.6 illustrates this approach.

When a client issues a new subscription, the same approach will be followed until the subscription arrives at the broker node that represents it. If for some reason, the tree does not have an edge for a specific value of an attribute, a new edge will be created. During both of these approaches (subscription and event propagation), a subscription or event that does not name an attribute at a given level will follow the edge with label * (do not care).

Gryphon has been successfully deployed over the Internet for real-time sports score distribution at the Grand Slam Tennis events, Ryder Cup, and for monitoring and statistics reporting at the Sydney Olympics ⁷.

2.2.2 Siena

Siena [11] is a content based pub-sub system built on top of a centralised broker mesh topology. Siena does not make any assumptions on how the communication between servers and client-server works, as this is not vital for the system to work. Instead, for server to server communication, it provides a set of options ranging from P2P communication to a more hierarchical structure, each with its respective advantages and shortcomings.

Events in Siena are treated as a set of typed attributes with values. Consequently, subscriptions (or *event filters* as they are referred to in Siena) select events by specifying a set of attributes and constraints on its values. When issuing a new subscription, a client sends its subscription to its broker node, which then forwards it throughout the network. At each node, the subscription leaves some state behind, identifying it and the neighbour which previously forwarded the message. This is crucial, for these will be the dissemination paths that events will follow when travelling through the network. Siena also defines an interesting concept of *subscription coverage*. A subscription S is covered by a subscription M if, whenever S is matched by an event e , then M is matched by e as well. Although a simple concept, it saves a considerable overhead during subscription dissemination and processing. A broker that detects a link with a more general subscription will not need to forward subscriptions that are covered by it.

⁷<https://www.research.ibm.com/distributedmessaging/gryphon.html>

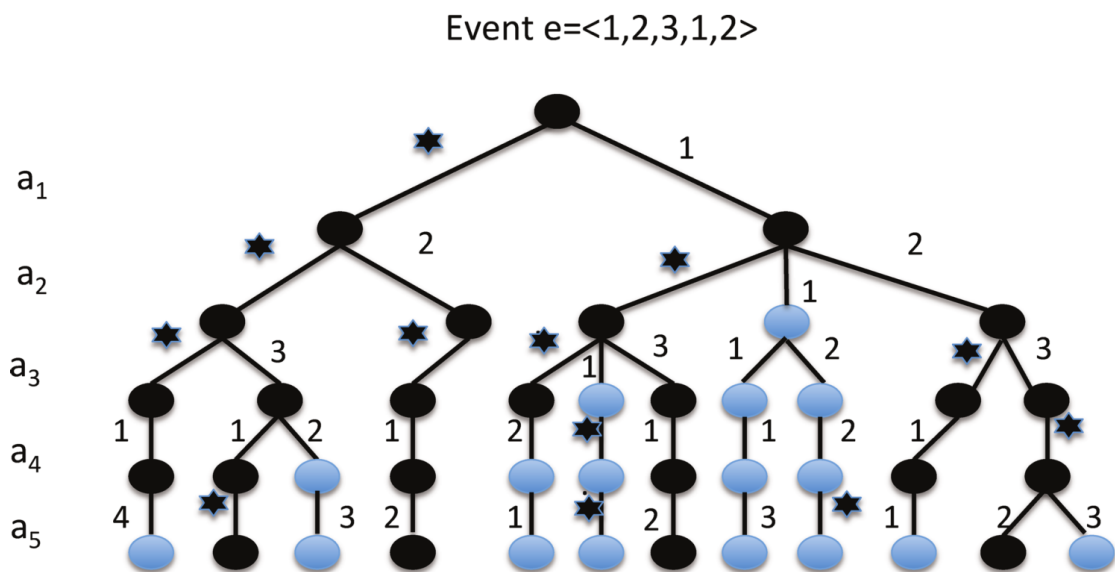


Figure 2.6: extracted from [2]. Each level of the broker tree represents an attribute. When the event $e = \langle 1, 2, 3, 1, 2 \rangle$ is published, all dark circles (representing brokers) are visited.

Event dissemination will work based on the previously set state at each broker node. In the end, events will technically follow the reverse paths of the subscriptions. A detail worth noting is that Siena optimises for *downstream replication*, that is, events should be routed as one copy as far as possible and should replicate only downstream.

Interestingly enough Siena also proposed another influential idea, which is the idea of *advertisements*. This concept could be viewed as a reverse subscription. The concept is simple, a node advertises to the network the type of content it is producing. In this paradigm, advertisements are propagated throughout the network and when a subscription is issued, it follows the paths previously set by the advertisements, effectively *activating* the path. Events are then forwarded through these activated paths.

2.2.3 Scribe

Scribe [4] is a topic based pub-sub system built on top of a fully decentralised network (P2P). In order to do this, it relies on Pastry DHT as its overlay structure. This allows it to leverage the robustness, self-organisation, locality and reliability properties of Pastry. Pastry DHT is at all similar to the DHTs described in the previous section (Chord and Kademlia), with a specific effort on achieving good network locality and a routing mechanism close to that of Kademlia.

Scribe subscriptions are represented by a multicast tree, with each different tree representing a specific topic (or *group* as it is referred in Scribe). The root of this tree acts as the *rendezvous* node for the group. Each group has a *groupid* assigned to it, as such, the *rendezvous* node will be the one with the closest ID in the network. This multicast tree is built by joining the multiple Pastry routes from each group member to the *rendezvous*. This dynamic process happens whenever a new node decides to join a group. In order to do that, it asks Pastry to route a *JOIN* message with the *groupid* as the key. At each node along the path, the Scribe forward method is invoked to check this node is already part of this group (also called a *forwarder*). If it is, it accepts the *JOIN* request and sets the node as its child, else this node will become a *forwarder* for the group, sets the requesting node as its child and it sends a *JOIN* request to this group. Note that any node can be a *forwarder* for any group, it does not need to be an active part of it (i.e. subscriber or publisher).

Disseminating an event in a group is a matter of disseminating it through its respective multicast tree. Fault tolerance mechanisms can be implemented on top of this system but, out of the box, Scribe provides only best effort delivery. As for the *rendezvous* nodes, their state can be replicated across the k closest nodes in the leaf set of the root node. Whenever a failure is detected by one of the children, it will issue a *JOIN* message which, thanks to Pastry's properties will be routed to a new root node which has access to the previous state of the *rendezvous*.

2.2.4 Meghdoot

Meghdoot [12] is a content based pub-sub system. It is built on top of a P2P network, specifically CAN DHT (already covered in the previous section). Meghdoot leverages the multidimensional space provided by the CAN DHT in order to create an expressive content based system.

In Meghdoot, subscriptions are defined over a schema of n attributes. Each attribute has a *name*, *type*, and *domain*, and can be described by a tuple $\{Name: Type, Min, Max\}$. *Min* and *Max* describe the range of domain values taken by the given attribute. All the peers in the system will use this same model. A subscription will then be a set of predicates over the previously defined attributes. In order to map this to the CAN DHT, Meghdoot defines the n attributes schema as a $2n$ dimensional space in the DHT. Subscriptions will be a point in this multidimensional space, where the range query it defines will be represented as two separate dimensions per attribute in the DHT (hence the $2n$ space). Each

subscription is routed through the CAN DHT until it reaches the peer responsible for managing the zone it is part of.

Event dissemination in Meghdoot will be a matter of routing each event through the CAN DHT. The events too will be defined by points in the multidimensional space. The point will be represented by the value of that same attribute in each of dimensions used to map it. For example, for a 2 dimensional space (x, y) (only one attribute), an event with a value z would be mapped to a point $x = y = z$. Once the event arrives at the node responsible for managing that specific zone in the DHT, it will be up to it to route the event to all of its neighbours that are part of the region affected by it. An interesting property of the $2n$ dimensional space is that half of it is left unexplored by the default subscription algorithm. This allows that space to be used to persist replicas of the subscriptions on the other half, making Meghdoot a system with fault tolerance by default.

2.2.5 Poldercast

Poldercast [7] is a recent pub-sub system with a strong focus on scalability, robustness, efficiency and fault tolerance. It follows a topic based model and follows a fully decentralised architecture. The key detail about this system is that it tries to blend deterministic propagation over a structured overlay, with probabilistic dissemination through gossip based unstructured overlays. In order to do this, Poldercast uses 3 different overlays. Two of them, Cyclon and Vicinity, we covered in the previous section and the third one closely resembles Chord in many ways.

Poldercast subscriptions are represented as a structured ring overlay. Each topic has its own overlay in fact, with all subscribers (and only them) of the corresponding topic connected to it. This overlay is maintained by a module referred to as the *Rings Module* and its overall mechanisms closely resemble Chord's ones. In order for each node to have visibility across the whole pub-sub network, Vicinity, with the help of Cyclon, will be responsible for keeping an updated set of peers participating in each of the available topics in the network. Subscribing to a topic will then be a matter of consulting this set of peers and joining the specific overlay for the topic.

Propagating events will be a matter of forwarding the event through the specific topic overlay. It is important to notice that Poldercast assumes only peers subscribed to a topic can publish to that same topic. The way this propagation works is through the ring overlay that, despite being similar to Chord, it has some important differences. It does not use a finger table at each node to speed up propagation. Instead, with the help of Vicinity, each node keeps a random set of peers for the topics it is part of. With them, whenever a node receives a message from a specific topic, it will propagate the event through a set of these peers. This propagation will be based on a system wide fanout parameter. It will also forward the event to its successor or predecessor (depending on where the event originated from), or will simply ignore if it is not the first time it has received it. These mechanisms, depending on the fanout parameter, guarantee average dissemination paths for each topic to be asymptotically logarithmic.

Through the multiple mechanisms described above, Poldercast attempts to provide a set of guarantees. To start with, only nodes subscribed to a topic will receive events published to that topic. In other words, no relay nodes are used. It also focuses on handling churn through the use of a mixture of gossip mechanisms, ensuring a highly resilient network. Finally, it seeks to reduce message duplication factor (i.e. nodes receiving the same message more than once).

2.2.6 Systems Analysis

Let us now analyse all the relevant pub-sub systems we used as a basis for our work. Table 2.1 will serve as a useful comparison mechanism for this. A couple of notes on the terminology used. We

refer to *delivery guarantees* as the ability to deliver a message under normal working conditions and *fault tolerance* as the ability to keep such guarantees under churn. This, of course, depends on the persistence of subscriptions and mechanisms to replicate these. The rest of the criteria were addressed in the previous sections.

Systems / Properties	Subscription Model	Architecture	Overlay Structure	Subscription Management	Event dissemination	Relay Free Routing	Delivery Guarantees	Fault Tolerance
Gryphon	Content based	Centralised broker hierarchy	N/A	Each broker responsible for a subscription scheme	Tree hierarchy	N/A	Yes	Best effort
Siena	Content based	Centralised broker mesh	N/A	Keep state at each node	Flood with cached state	N/A	Yes	Best effort
Jedi	Content based	Centralised broker hierarchy	N/A	Keep state at each node	Tree hierarchy	N/A	Yes	Best effort
Bayeux	Topic based	Decentralised	Tapestry DHT	Rendezvous node	Multicast tree	No	Yes	Best effort, no subscription persistence
Scribe	Topic based	Decentralised	Pastry DHT	Rendezvous node	Multicast tree	No	Yes	Best effort, no subscription persistence
Medhboot	Content based	Decentralised	CAN DHT	Points in CAN DHT	CAN routing	No	Yes	replicated subscriptions
Hermes	Type based	Decentralised	Pastry DHT	Rendezvous node	Multicast tree	No	Yes	Best effort
Tera	Topic based	Decentralised	Gossip based overlay	Unstructured overlay per topic	Random walks and flooding	No	no	Best effort
Mercury	Content based	Decentralised	Ring based DHTs	Overlay per attribute in schema	Route through ring overlays	No	Yes	Best effort
Sub-2-Sub	Content based	Decentralised	Ring based DHT and gossip based overlay	Clustering of similar subscriptions	Gossip and ring overlay routing	No	No	Best effort
Poldercast	Topic based	Decentralised	Ring based DHT/ Vicinity / Cyclon	Ring overlay per topic	Ring overlay routing	Yes	Yes (every publisher is a subscriber)	High resilience to churn, no subscription persistence

Table 2.1 : Comparison table for the relevant system

2.3 Web Technologies

When building any kind of network focused system nowadays, there is no question that one should take advantage of the full potential that the web has to offer. Browsers evolved a lot over the past years and allow for a vast world of possibilities in terms of applications that can be built on top of it. P2P applications are no exception here. In the next sections, we will cover a set of technologies that allow for a modern distributed application to run, not only on the desktops and servers we are used, but also in browsers running in multiple platforms.

It is indisputable that one cannot think of modern web development without speaking of **Javascript**⁸. Javascript is a lightweight, interpreted, programming language, known as the scripting language for the web. Initially created with the purpose of allowing the creation of simple interactions and animations in web pages it is now one of the main programming languages for the web⁹. It is used, not only for client side programming but also to power server side applications. Since Javascript has different runtimes, it became necessary to create a standardised base from which the multiple browser vendors and runtime maintainers could work from. Hence ECMAScript, the standard for the Javascript implementation.

As it was previously said, nowadays, Javascript is not restricted to browsers only. **NodeJS**¹⁰ was the first successful implementation of a Javascript runtime for the server, built on top of Chrome's V8 JavaScript engine¹¹. This allowed developers to write and run Javascript programs in multiple architectures and operating systems, with access to a set of common native libraries that allow to interact with relevant parts of the system¹² such as network, filesystem and others. A key aspect in NodeJS was the way it chose to deal with the lack of support from Javascript for multithreading: the use of an event loop that powers an event-driven architecture capable of asynchronous I/O.

Yet another key element in the NodeJS and Javascript ecosystem is **NPM**¹³, its package manager. NPM was one of the main drivers of a philosophy that is deeply ingrained in the JS ecosystem which focuses on building small reusable packages that everyone can use and build on top of. This is heavily inspired by the UNIX philosophy summarised by Doug McIlroy¹⁴ - "Write programs that do one thing and do it well. Write programs that work together". This approach ended up being a major differentiator on how modern web applications are developed. Currently, NPM is one of the largest package registries in the world¹⁵. This mindset though is really important, for it allows applications to be built on top of previously published packages, making modularity and code reusability core values of the ecosystem. Even more interesting is the sudden possibility offered by having the same programming language supporting different environments (browsers, servers, desktops, etc.), all of this powered by a common way of publishing and sharing code.

When focusing specifically on P2P apps, the past years have brought together a set of new network protocols that empower communication between browsers in a real-time fashion and also provide alternatives to TCP¹⁶. **WebSockets**¹⁷ aimed at providing a real-time, full-duplex communication between clients and servers over TCP, but it was **WebRTC**¹⁸ that paved the way for new P2P applications that could run in the browser. WebRTC focuses on powering real-time communications, like audio/video stream or just arbitrary data, between browsers, without the need of an intermediary. This, of course,

⁸<https://www.ecma-international.org/publications/standards/Ecma-262.htm>

⁹<https://insights.stackoverflow.com/survey/2017>

¹⁰<https://nodejs.org>

¹¹<https://developers.google.com/v8/>

¹²<https://nodejs.org/api/>

¹³<https://www.npmjs.com/>

¹⁴<https://archive.org/details/bstj57-6-1899>

¹⁵<http://blog.npmjs.org/post/143451680695/how-many-npm-users-are-there>

¹⁶<https://tools.ietf.org/html/rfc793>

¹⁷<https://tools.ietf.org/html/rfc6455>

¹⁸<https://www.w3.org/TR/webrtc/>

is a real breakthrough in the P2P field as it allows browsers to receive incoming connections. On other hand, alternatives to the TCP transport, such as **uTP**¹⁹ and **QUIC**²⁰, came through, seeking to bring reliability and order delivery without the poor latency and congestion control issues of TCP. This provided new suitable alternatives to communication between peers on top of UDP, a transport that has been vital in P2P applications that need an affordable way to perform NAT²¹ traversal.

In the application realm, there have been quite a few in the past years that seek to leverage all these new technologies and breakthroughs. One of the examples most worth mentioning is the **InterPlanetary File System** (IPFS)²², a P2P hypermedia protocol designed to create a persistent, content-addressable network on top of the distributed web.

At the core of IPFS is what they refer to as the **Merkle DAG**²³. The Merkle DAG is a graph structure used to store and represent data, where each node can be linked to based on the hash of its content. Figure 2.7 provides an example of this.

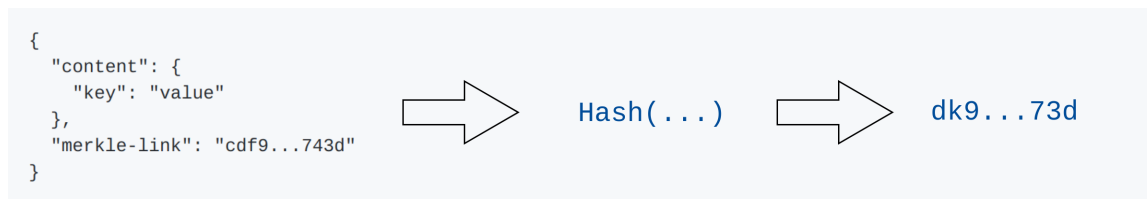


Figure 2.7: JSON representation of a Merkle node with a Merkle link

Each node can have links to other nodes, creating a persistent, chain like, structure that is immutable as documented in figure 2.8

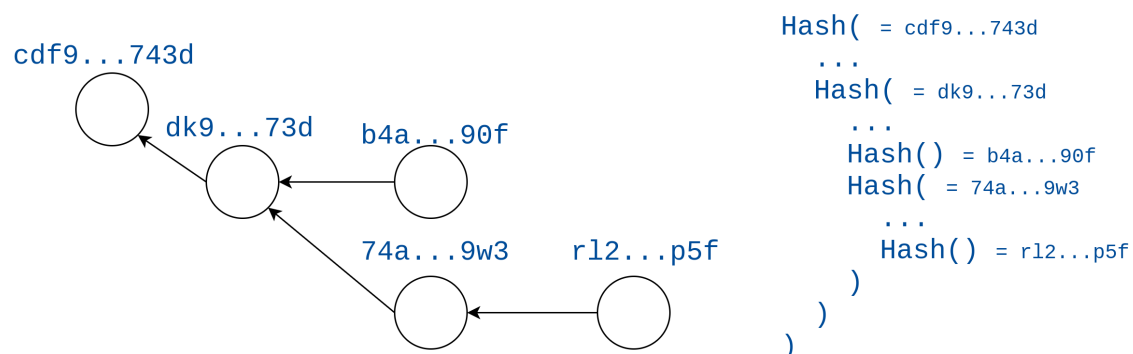


Figure 2.8: Graph visualisation of a Merkle DAG and its respective hash function dependencies

IPFS has an interface around this structure referred to as **InterPlanetary Linked Data** (IPLD) which focuses on bringing together all the hash-linked data structures (e.g. git) under a unified JSON-based model. In order to interact with IPLD, IPFS exposes an API that allows us to insert and request random blobs of data, files, JSON objects and other complex structures. Having implementations in both Go and Javascript, IPFS leverages the modularity mantra in a fascinating way, focusing on creating common interfaces that allow for different pieces of the architecture to be changed and selected according to one's needs. All of this without impacting the overall application and its top level API. These came from the observation that the web we have today is a set of different heterogeneous clients, that have

¹⁹http://www.bittorrent.org/beps/bep_0029.html

²⁰<https://datatracker.ietf.org/wg/quic/about/>

²¹<https://tools.ietf.org/html/rfc2663>

²²<https://ipfs.io>

²³<https://github.com/ipld/specs/blob/95df205ca5fdb961ec2c2265a169989fef595db1/FOUNDATIONS.md>

different needs and resources. As such, not everyone can rely on the same set of transports, storage management and discovery mechanisms. These small modules that constitute IPFS have recently been brought together under the same umbrella, as **libp2p**²⁴, a set of packages that seek to solve common challenges in P2P applications.

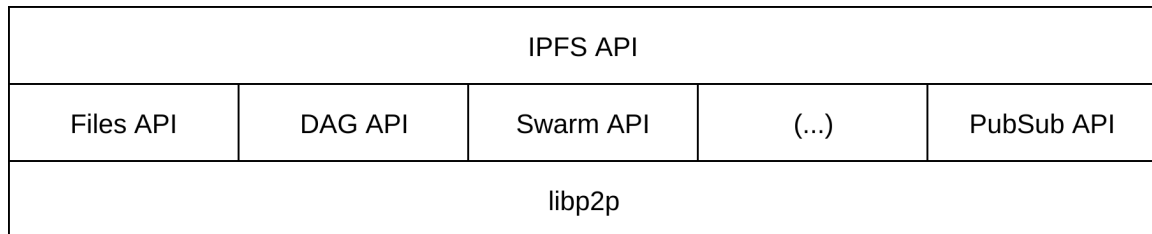


Figure 2.9: An illustration on the IPFS architecture

Interestingly enough, a recent addition to libp2p, and consequently IPFS, was a pub-sub module, with a naive implementation using a simple network flooding technique. Even though libp2p was created with the initial purpose of serving as the foundation of IPFS it is now possible to use libp2p as a standalone module for peer to peer apps, with the possibility to hand pick the functionalities we intend to use.

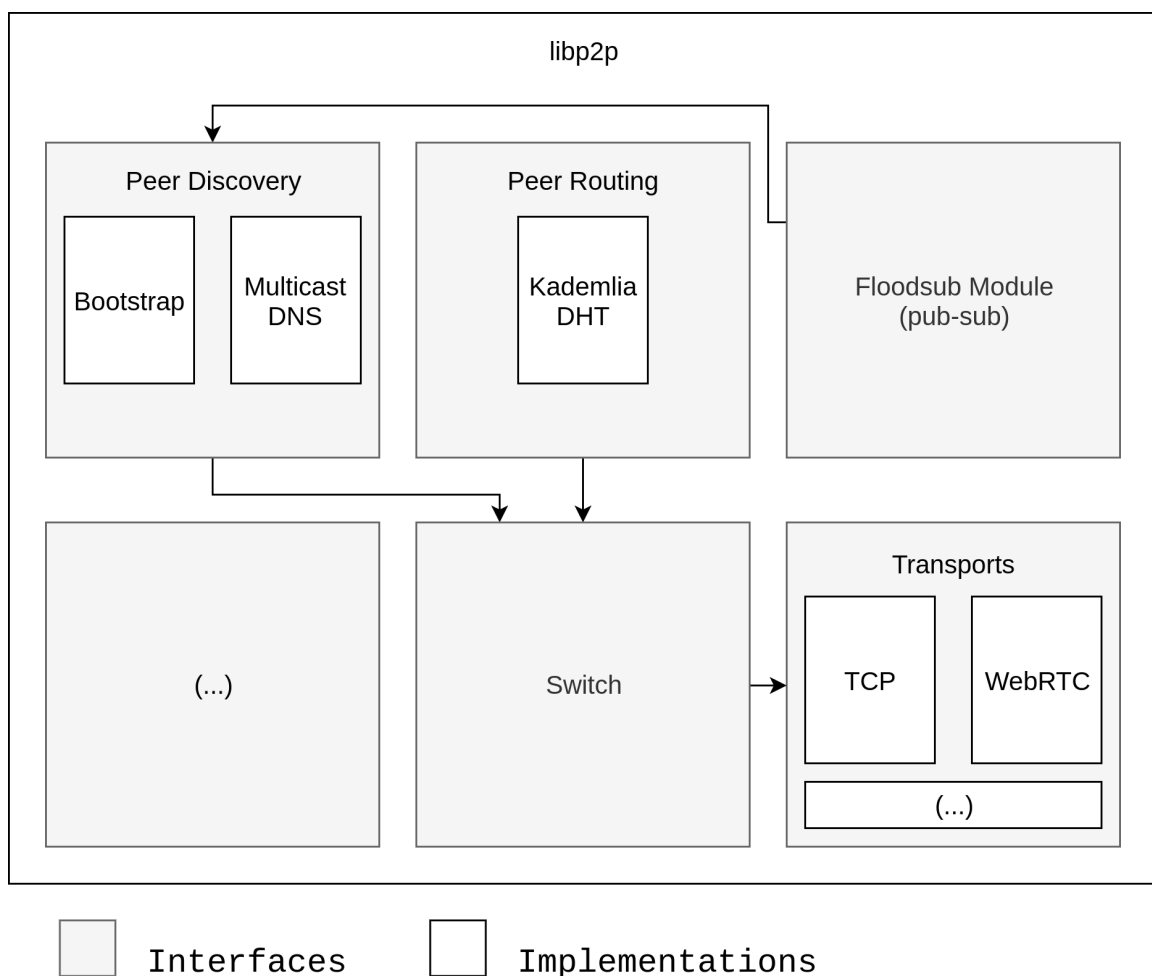


Figure 2.10: An illustration on the libp2p architecture

²⁴<https://libp2p.io>

2.4 Summary

TODO

Chapter 3

Pulsarcast

In this chapter we will introduce and describe our solution. Pulsarcast is a peer to peer, pub-sub, topic based system focused on reliability, eventual delivery guarantees and data persistence. We seek this while not fully compromising the scalability given by the decentralised nature of our architecture. Looking through our related work it became clear that few fully decentralised solutions exist that try provide these kind of guarantees. Yet, if we carefully look at the most popular and widely adopted centralised pub-sub solutions it is clear that most of them heavily rely and depend upon these same guarantees.

We opted for the simpler topic based subscription model given that, in our view, a well structured and implemented topic based model is more than enough for a great percentage of our use cases. In the end, we compromise a bit of the expressiveness of the system in order to avoid bringing more complexity in, something we believe will pay off.

This chapter is divided as follows, we will start by covering the use case of our system in section 3.1, where we will introduce some of our broader architectural decisions. Next, we will move to section 3.2 where we will deep dive into Pulsarcast's data structure model and how it is distributed across the network. Finally, we will look into one of the most important parts of our architecture in section 3.3 where, based on the covered related work and the taxonomy we defined, we present the algorithms and mechanisms used for managing the subscriptions and event dissemination. (TODO missing more chapters)

3.1 Use Case

Pulsarcast is a fully decentralised solution, as it has been previously introduced. This means that each node plays a key part in fulfilling the system purpose, delivering events and ensuring its dissemination. Conceptually speaking, Pulsarcast provides four methods for clients and applications to interact with the system, create a topic, subscribe to a topic, unsubscribe from a topic and publish an event in a topic. From a broader perspective Pulsarcast relies on two overlays to fulfil its needs. Kadmelia DHT, used for a range of purposes from peer discovery, content discovery and to bootstrap our other overlay, the Pulsarcast overlay. The Pulsarcast overlay is actually a set of different overlays or, as we call it, dissemination trees. These trees are on a per topic basis and are the key factor in the way we disseminate information across our decentralised network. Figure 3.1 illustrates the multiple overlays in action.

The subscription model followed by Pulsarcast is a topic based one, but still allowing for some expressiveness through the usage of sub-topics to enable more complex structures. When a peer publishes an event or creates a new topic a set of the overlays described is used accordingly. For Pulsarcast,

both of these actions, happen to take a similar course. That is because the system views these pieces of information (or descriptors as we call it) as fairly similar, given their importance. Figures 3.2 and 3.3 provide an overview of what flow for creating this information and for accessing it looks like.

As Pulsarcast's goal is to give users, and any applications built on top of it, the reassurance that events reach their destination and that they are able to rebuild as much of the event or topic history as they see fit, we double down on our efforts to persist and propagate data. Every topic and event is stored



Figure 3.1: Representation of the Pulsarcast overlays



Figure 3.2: Flow for creating a new Topic/Event descriptor

in the Kadmelia DHT prior to being forwarded through the topic dissemination trees. This ensures the data is persisted by a set of nodes (that might even be extraneous to the topic at hand) and anyone is later able to fetch the data using only the DHT if they want to. Afterwards, we forward the data through the appropriate dissemination trees previously built (we will cover this process in section TODO). Currently, every node participating in the data transmission through the dissemination tree stores it indefinitely, although it is something due to be changed in a later revision of our protocol. On the other hand, when someone wants to fetch a piece of data (a topic or an event) it starts by performing a local search in the system, it might have been something that the node has ran through when forwarding events across their dissemination trees. If this fails though, a query to the DHT is in order.

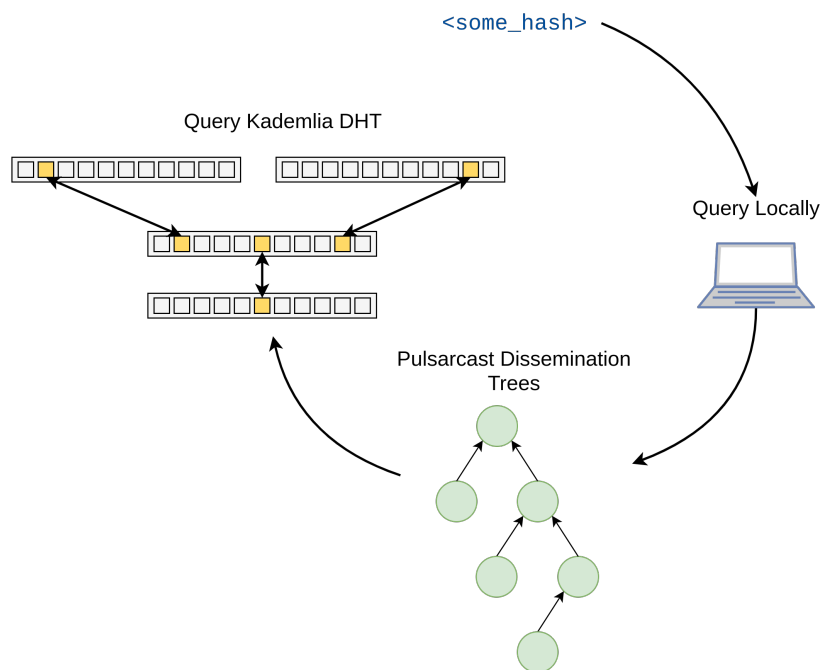


Figure 3.3: Flow for querying a Topic/Event descriptor

3.2 Data Structures

Pulsarcast has a set of two very important data structures to which we refer to as event and topic descriptors. To help us represent this data we rely on a concept already introduced in our related work, the Merkle DAG.

All of our data structures are immutable, content addressable and linked together to form a Direct Acyclic Graph (Merkle DAG). Events link both to their respective topic descriptor and a past event in that topic. Topics on the other hand, link to their sub-topics (if any) and a previous version of themselves. Figure 3.4 provides a broader picture of how it all fits together. Immutability and content-addressability give us verifiability and, consequently, the assurance that the state of our distributed system is the same no matter where we are accessing it from or who is viewing it. It also allows us to build a notion of history which, if you think about it, plays nice into a pub-sub scenario. Through these links and the mechanisms described in the previous section, users and applications are free to rebuild their topic and event history to any point they wish. Be that because they were not part of the network at the time or because they missed out due to some system or network failure, acting as a NACK (not acknowledged) for relevant events.

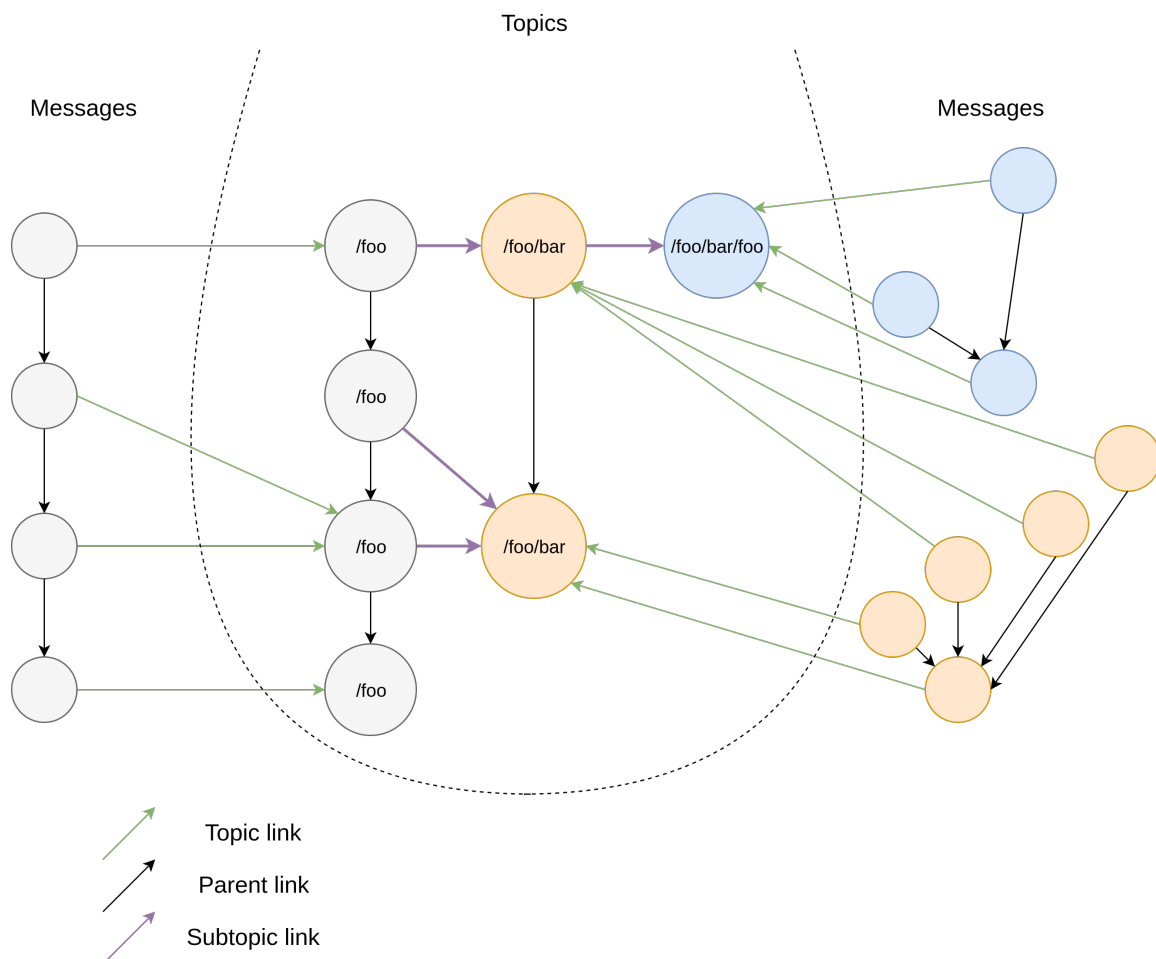


Figure 3.4: Representation of the Pulsarcast DAG

Given we are discussing addressability and linking between content, the representation used for our identifiers is an important part of our system specification. That was one of the main reasons for us to borrow inspiration from systems like IPFS and decided to use *multihash*¹. Multihash is a

¹<https://github.com/multiformats/multihash>

convention for representing the output of many different cryptographic hash functions in a compact, deterministic encoding that is accommodating of future change. This is because multihash actually encodes the type of hash function used to produce the output. All of the relevant identifiers in our system are multihashes, this includes node identifiers as well as the identifiers for both event descriptors and topic descriptors themselves (given they are actually the hash of its content). Each of the descriptors contain a set of relevant metadata as well as the actual information that they refer to. The following JSON like representations 3.1 and 3.2 provide an accurate description of the schema and format of our data structures. We will cover however some of the properties.

Parent links in the event descriptor serve as a reference to previous events in the topic tree. A Pulsarcast node that has just received an event can, through its parent link, know a previous event of this same topic and act on it accordingly (fetch it or not). Depending on the type of topic we have at hand (something we will cover further in this document) this parent link can have different meanings and relevance.

As for the parent links in the topic descriptor, these act as a reference to a previous version of this same topic. Keep in mind that data in Pulsarcast is immutable, as such, one cannot update content that has already been published and disseminated. We can however create a new reference of it and link to what we consider to be a previous version. This is the exact use case for the parent links in the topic descriptor, to act as a link to previous versions of this same topic. Possible changes to the topic descriptor can encompass changes to the topic metadata for example, or additions of new sub-topics.

In topic descriptors, sub-topic links are indexed under a `#` key. Commonly, these are indexed by name, but it is not mandatory, it is actually up to the topic and consequently its owner to choose accordingly. There is no limit to how many sub-topics a topic can have. One really important note though is that every topic actually comes with a default meta topic as a sub topic. The idea is for this meta topic to be used to disseminate changes for the original topic descriptor, something we will cover in section 3.3.

Both descriptors have an author field that is self descriptive, essentially meaning the peer responsible for creating and, in the case of the topic, maintaining this descriptor. The topic descriptor however has an extra field which is the publisher field. This is because the producer of the content (author) and the peer responsible for actually pushing this into the Pulsarcast dissemination trees (publisher) might not actually be the same peer.

```

1 {
2   "name": <string>,
3   "author": <peer-id>,
4   "parent": {                                //The parent link for this topic
5     "/": <topic-id>
6   },
7   "#": {                                      //Sub topic links
8     "meta": {                                //Meta topic
9       "/": "zdpuAkx9dPaPve3H9ezrtSipCSUhBCGt53EENDv8PrfZNmRnk"
10    },
11    <topic-name>: {
12      "/": <topic-id>
13    },
14    ...
15  },
16  "metadata": {
17    "created": <date-iso-8601>,
18    "protocolVersion": <string>, //Pulsarcast protocol version
19    "allowedPublishers": {                //If enabled, whitelist of allowed publishers
20      "enabled": <boolean>,
21      "peers": [ <peer-id> ]
22    },
23    "requestToPublish": {                 //Enable request to publish
24      "enabled": <boolean>,
25      "peers": [ <peer-id> ]             //Optional whitelist able to request
26    },
27    "eventLinking": <string>,            //One of: LAST_SEEN, CUSTOM
28  }
29 }

```

Listing 3.1: Topic descriptor schema in a JSON based format

Metadata for the event descriptor is quite simple. It includes a creation timestamp in ISO8601 format and the version of the protocol at the time the event was published. Remember, these are content addressable immutable data structures, as such the info we provide in these metadata fields will be persistent and verifiable, something we take advantage of. On the other hand the topic descriptor is a bit more complex. Besides the timestamp and version, it includes further configuration options that tell us how event dissemination and event linking will be handled for all of the topic, something we will cover in section 3.3.

A key objective for these data structures and, specifically, to the metadata design has been for it to be easily extensible. The protocol version aids us with this, easily conveying any kind of breaking changes. Examples of fields and properties that could be added in the future include things such as author and publisher signatures, so that peers could verify the authenticity of all the content.

```

1 {
2   "name": <string>,
3   "publisher": <peer-id>,           //Peer who published the event
4   "author": <peer-id>,             //Author of the event
5   "parent": {                       //The parent link for this event
6     "/": <topic-id>
7   },
8   "topic": {
9     "/": <topic-id>
10  },
11  "payload": <binary-data>
12  "metadata": {
13    "created": <date-iso-8601>,
14    "protocolVersion": <string>,    //Pulsarcast protocol version
15  }
16 }

```

Listing 3.2: Event descriptor schema in a JSON based format

The data in Pulsarcast however is distributed, as illustrated by figure 3.5, which means we have to deal with an extra layer of complexity in our system. We again tackle this with the way our data is represented, the Merkle DAG. The fact that all the data is addressed based on its content means that the representation and indexing done at each node is the same we do system wide. Descriptors are persisted using the Kadmelia DHT and disseminated through the Pulsarcast overlay, with each node then keeping this state locally. This allows us to abstract state at each node in a manner where you can refer to the same piece of data in the same way and expect the same representation and result, whether you are looking locally or system wide.

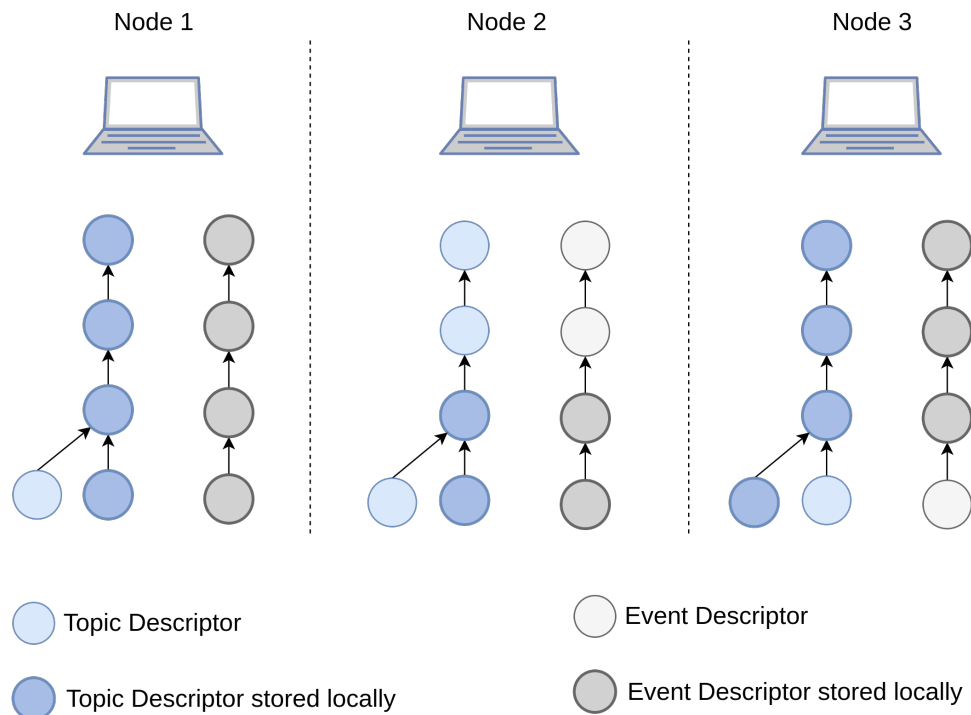


Figure 3.5: Overview of how state is kept across the network

3.3 Subscription Management and Event Dissemination

In Pulsarcast, both the subscription management and the event dissemination lie on top of the multiple overlays built on a per topic basis or, as we call it, the dissemination trees. These trees represent the path traversed by the events in order to reach the necessary subscribers, so, in the end, these end up being the actual representation of both subscriptions and dissemination paths. In order to better understand them we will start by understanding how the system handles the creation of topics, new subscriptions, followed by how events are propagated (with a detailed view of the algorithms used). We will see some of the configurations the topic descriptor allows for that will change the way events are propagated and published. Finally we will run through the messages sent by each node in order to perform these operations, a key part in our distributed system.

Before we can speak about a new subscription a topic must already exist. In order for this to happen a node starts by creating the meta topic descriptor. This meta topic descriptor is to be used to disseminate any changes relative to the topic descriptor at hand and is linked as a sub topic of it. Only after it has been created and stored in the Kadmelia DHT does the node proceed to create the actual topic descriptor (with the meta topic linked as a sub topic), which is then also persisted in the DHT. When any change to the original topic descriptor is in order, a new topic descriptor is created (remember the immutability of our data structures) but with the original topic descriptor linked as a parent and with the same meta topic linked as sub topic. When these changes happen the new topic is always published as an event in the meta topic. The algorithm 1 provides an overview of the procedure to create a new topic.

Algorithm 1: Create a new topic

```
1 Function CreateTopic(newTopic)
   Input: newTopic = data for new topic creation
2   begin
3     parent  $\leftarrow$  newTopic.parent;
4     if parent == null then ;                               // Check if the topic has a parent link
5
6     | metaTopic  $\leftarrow$  CreateMetaTopicDescriptor(newTopic);
7   else
8     | metaTopic  $\leftarrow$  parent.subTopics.meta;
9   end
10  topicData  $\leftarrow$  CreateTopicDescriptor(newTopic, metaTopic);
11  Subscribe(metaTopic);
12  Subscribe(topicData);
13  StoreInDHT(metaTopic);
14  StoreInDHT(topicData);
15  Publish(metaTopic, topicData);                          // Publish the new topic in the meta topic
16
17 end
```

With the topic descriptor stored and available to the whole network, its creator will act as the root node in this newly created topic dissemination tree. When a node wants to subscribe to this topic it starts by fetching its descriptor from the Kadmelia DHT. After some sanity checks, such as checking if the node is already part of the dissemination tree, we use the Kadmelia DHT to find the closest known peer to the author of the topic. Keep in mind that we are not actually hitting the network and performing a Kadmelia lookup operation, we are in fact resorting to information previously stored locally by the DHT

in its K buckets. The closest known peer id is used by the node and stored as its parent in this topic dissemination tree. The join request is then forwarded to it where the sender peer id is extracted and used as its children in this topic dissemination tree, followed by repeating the whole process again. This recursive operation across the network ends when the join request hits a node that is either already part of the dissemination tree for this topic or, the actual author of the topic. Algorithm 2 provides a more detailed generic procedure to be used at every node when receiving or sending a subscription request (or a join request as we call it) and figure 3.6 tries to provide a visual representation of the whole subscription flow. It is important to note that in order to maintain the dissemination trees every node must keep some state of its neighbours for every tree. If by some chance a node is unable to connect to a neighbour, a retry mechanism is in place for a limited amount of retries (a configurable parameter). If the node is still unable to connect then it goes through the subscription procedure again.

Algorithm 2: Join request handler for each node

```

1 Function ReceivedJoin(fromNodeId, topicId)
   Data: nodeId = node id of this node
   Input: topicId = topic id
   Input: fromNodeId = node who we got the join request from

2 begin
3   topicData  $\leftarrow$  GetTopicData(topicId);
4   if fromNodeId  $\neq$  nodeId then
5     AddToChildren(t, fromNodeId);      // Add as children in dissemination tree
6     if topicData.author == nodeId then ;      // This node is author of the topic
7
8     | return
9   end
10  if GetParents(topicId)  $\neq$  null then ;      // Already part of dissemination tree
11
12  | return
13 end
14 else
15  | if topicData.author == nodeId then ;      // This node is author of the topic
16
17  | return
18  end
19 end
20 peer  $\leftarrow$  GetClosestKnownPeer(topicData.author);
21 AddToParents(topicData.id, peer);      // Add as parent in dissemination tree
22 SendRPC(topicData.id, peer);
23 end

```

Considering the topic creation and subscription management previously discussed we can see that event dissemination becomes easier to handle, almost as a consequence of the way the subscription management was built, and dissemination trees again play their key part here. Pulsarcast however allows for some additional customisation and configuration at the topic level focused on providing a lot more flexibility to our system. At topic creation, the author of it has the ability to configure which nodes are allowed to publish, if and which nodes can request to publish and how events are linked together (through the parent link). These options are *requestToPublish*, *allowedPublishers* and *eventLinking*, all

mentioned in the previous section TODO, we will see how each one of these fits together with the way events are disseminated. Figures 3.7 and 3.8 provide visual aids to how these options come together for event dissemination.

When a node wants to publish an event in a topic it starts by fetching the topic descriptor, first locally and then, if it is not present, from the Kadmelia DHT. This way we have access to the topic data as well as its configurations. The node then checks if it is actually allowed to publish through the topic configuration whitelist mechanism. This option, *allowedPublishers*, can either be enabled and, if so, a list of nodes is provided that is checked before publishing, or it can be disabled and in that scenario every node can publish a message. If the node cannot publish the message, it will check if it can

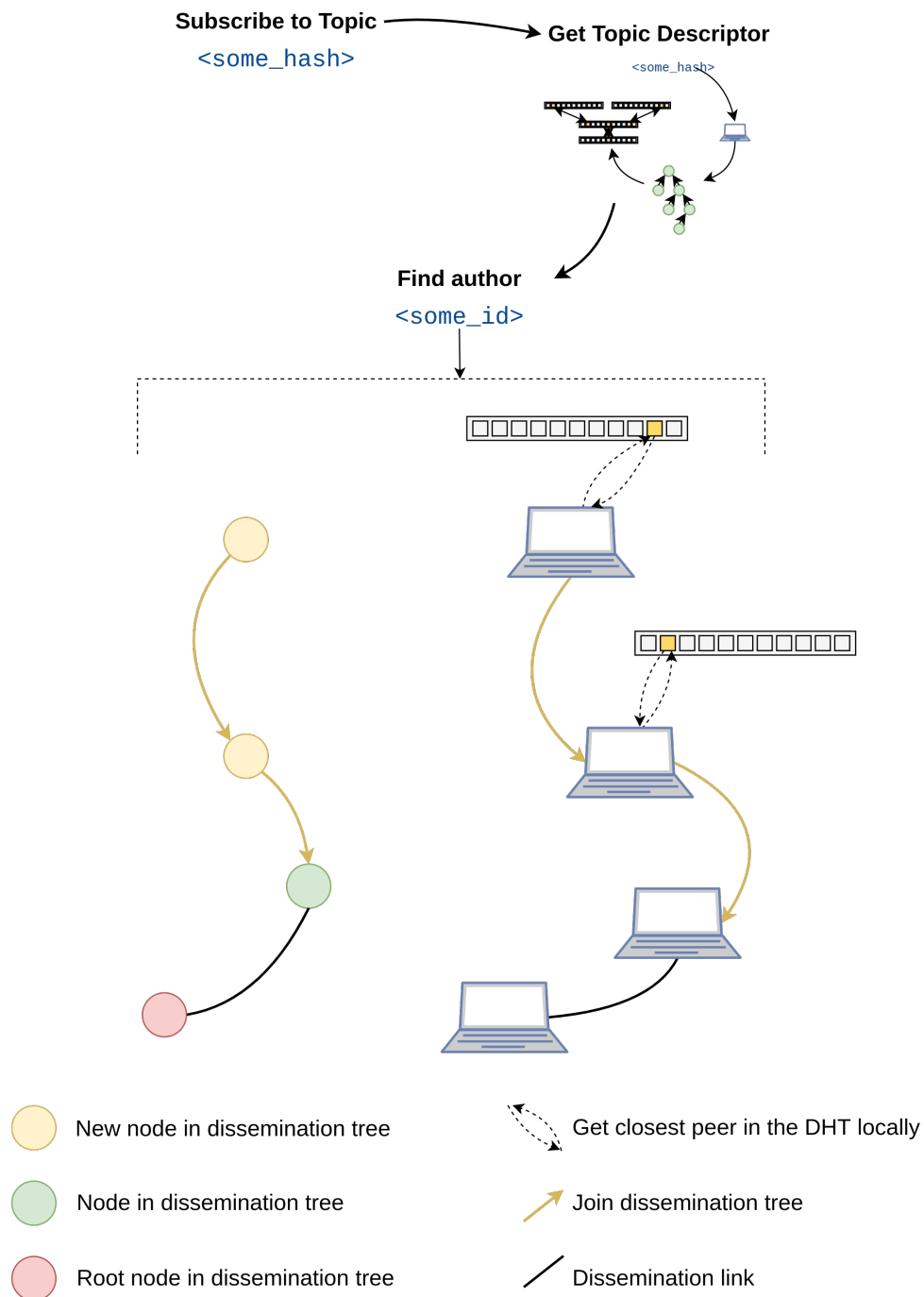


Figure 3.6: Overview of the flow for creating a new subscription

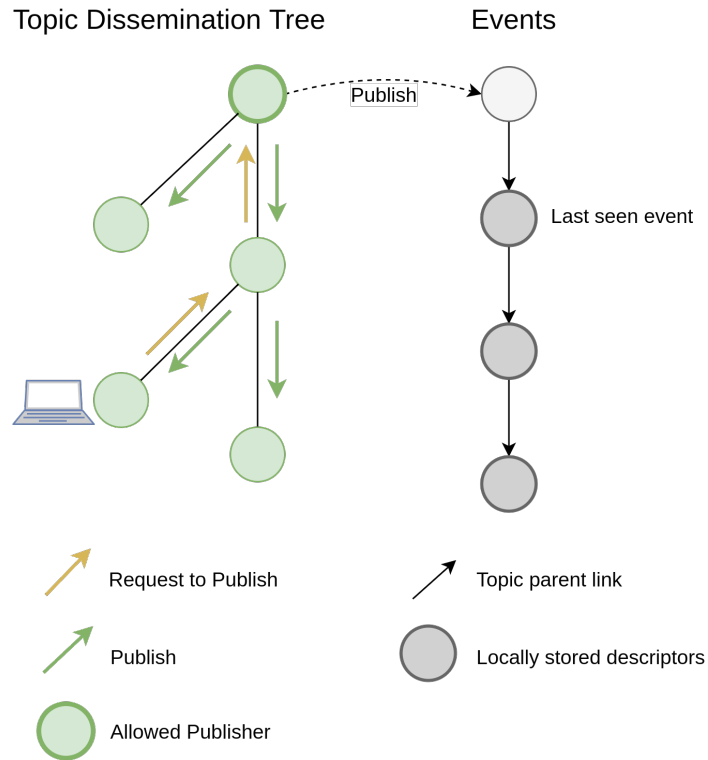


Figure 3.7: Event dissemination mechanism for a topic with only the author allowed to publish, last seen event linking and request to publish allowed. This scenario provides order guarantee.

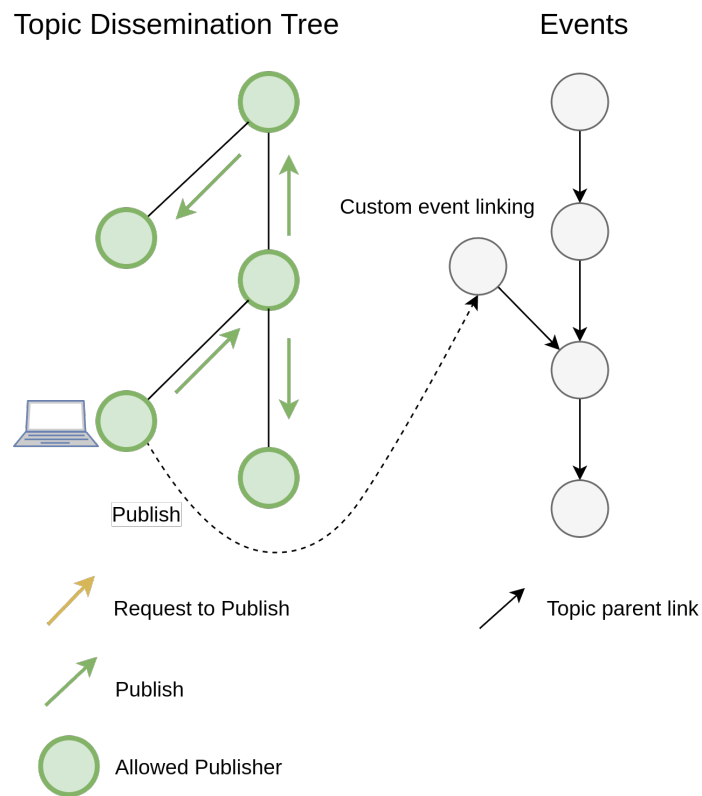


Figure 3.8: Event dissemination mechanism for a topic with custom event linking and global publishers allowed

submit a request to publish. This request to publish is another option set in the topic descriptor, through the *requestToPublish* field, that, if enabled, allows every node in the network to submit these special requests. Optionally, it can also be a whitelist of nodes allowed to submit these. When a request to publish is forwarded across the network, it will propagate across the dissemination tree (from children nodes to parents) until it eventually finds a node which is actually allowed to publish this event. This will dictate the difference in the publisher (node who actually publishes the content) and the author (node responsible by creating the content in the first place).

Upon receiving a publish event request, whether if it was initiated at this node or through a remote request to publish, the node starts by appropriately linking the new event to a parent event. This is where the *eventLinking* option in our topic descriptor comes into play. Right now this option can either be *CUSTOM* or *LAST_SEEN*. When the topic allows for custom linking, the client application has the ability to set a custom parent event, as long as it exists. With the last seen option however, the Pulsarcast node takes care of linking the given event to the event last seen by it. After the linking is done, the node can safely store the event descriptor in the Kademlia DHT, followed by disseminating it through its children and parent nodes in this topic dissemination tree. From this point forward, nodes along the dissemination tree will forward the event across branches of the tree where this has not gone through. All of the logic we have covered around event dissemination is better detailed in the algorithms 3 and 4.

Algorithm 3: Event handler for each node

```

1 Function ReceivedEvent(fromNodeId, eventData)
   Data: nodeId = node id of this node
   Input: fromNodeId = node who we got the event from
   Input: eventData = event descriptor
2   begin
3     topicData  $\leftarrow$  GetTopicData(eventData.topicId);
4     if AllowedToPublish(nodeId, topicData) then
5       | SendEvent(fromNodeId, eventData);
6     else
7       | if AllowedToRequestToPublish(nodeId, topicData) then
8       | | SendRequestToPublish(eventData);    // Send request to publish to parent
8       | | node
9       |
10      | end
11    end
12  end

```

Algorithm 4: Event forwarding function

```
1 Function SendEvent(eventData)
  Data: nodeId = node id of this node
  Input: fromNodeId = node who we got the event from
  Input: eventData = event descriptor

2 begin
3   topicData  $\leftarrow$  GetTopicData(eventData.topicId);
4   if IsNewEvent(eventData) then
5     linkedEvent  $\leftarrow$  LinkEvent(eventData);           // Add parent link
6     StoreInDHT(linkedEvent);
7   end
8   if (IsSubscribed(eventData.topicId) == true) then
9     EmitEvent(eventData.topicId, eventData);
10  end
11  for peer  $\leftarrow$  GetChildren(eventData.topicId), GetParents(eventData.topicId) do
12    if fromNodeId  $\neq$  peer then ;           // Do not send the event back
13
14    SendRPC(eventData, peer);
15  end
16 end
17 end
```

It is important to understand some of the properties that these multiple configuration options allow for. The simplest example would be a scenario where only the author of a topic is allowed to publish, event linking is based on the last seen event and request to publish is allowed. In this example, despite every node being allowed to create content, we can achieve order guarantee, with a single stream of events all linked together. Another example would be a scenario where we actually have a whitelist of allowed publishers, no request to publish allowed and last seen event linking taking place. With this we essentially get a simple producer/consumer scenario, with a list of a few selected and vouched for producers that every node is aware of (that could even be expanded later on by the topic author). Finally, on the other end of the spectrum, we have a scenario where everyone is allowed to publish and custom event linking is allowed. Here, we are essentially giving the ability for clients and applications to use event trees to represent data in however they see fit given that, with custom event linking, applications have the ability to shape the event trees however they like. Links can go as far as to imply event causality if applications are programmed and configured as such. All of these scenarios came from a realisation that, it did not make sense to limit Pulsarcast's uses out of the box, specially taking account that through simple configuration we could cater for a broader set of use cases and applications.

3.4 RPC message protocol

We have ran through the overall architecture of Pulsarcast, however we still have not detailed how the nodes communicate with each other. The fact is, Pulsarcast does not favour or define a wire protocol to be used. In our view Pulsarcast can and should work independently of what is used in the transport layer. It does however specify a well defined communication protocol built using Protocol Buffers². Protocol Buffers (or protobuf for short) are Google's open source, language-neutral, platform-neutral, extensible

²<https://developers.google.com/protocol-buffers/>

mechanism for serializing structured data. It allows us to define common light weight interfaces that, through source code generation, work across platforms. Plus, it is fast and quite small once encoded to the protocol buffer binary format (what actually runs in the wire), while also supporting a text based representation, similar to JSON, for readability purposes. With protobuf's, we have defined a set of Remote Procedure Call (RPC) schemas used by our system to communicate between nodes.

We started by defining a common interface for all of our RPC messages as showed in the listing 3.3. In protobufs, every field is associated with a number. These are used to uniquely identify a field in the protobuf binary format³. Our message format is quite straight forward, with 3 fields, *op* (for operation), *payload* representing a generic payload and finally *metadata* containing relevant metadata such as the creation date of this message and the protocol version used. The supported operations for now essentially translate all the actions a node might undertake, which are publishing an event, joining a topic, leaving a topic, creating a topic and requesting to publish. The payload is actually an abstraction and it can hold a topic descriptor, an event descriptor or a topic id depending on the operation field of this message. Finally the RPC schema itself is actually an array of the messages, so that if needed a node can forward multiple operations in one go.

```
1 message RPC {
2   enum Operation {
3     PUBLISH_EVENT = 2;
4     JOIN_TOPIC = 3;
5     LEAVE_TOPIC = 4;
6     NEW_TOPIC = 5;
7     REQUEST_TO_PUBLISH = 6;
8   }
9
10  message Message {
11    optional Operation op = 1;
12    oneof payload {
13      TopicDescriptor topic = 2;
14      EventDescriptor event = 3;
15      bytes topicId = 5;
16    }
17    optional MetaData metadata = 6;
18  }
19
20  message MetaData {
21    optional string created = 1;
22    optional string protocolVersion = 2;
23  }
24
25  repeated Message msgs = 1;
26 }
```

Listing 3.3: Protobuf schema for our RPC messages

The topic and event descriptors also have a specific protobuf schema, essentially a representation of what we have already covered in section 3.2. Listings 3.4 and 3.5 show us the specification of these. In order to keep our messages as lightweight as possible and avoid unnecessarily burdening the network, we opted to have all of our multihash identifiers (such as the author, links, etc.) sent in binary format.

³<https://developers.google.com/protocol-buffers/docs/encoding>

Otherwise, the remaining fields end up being a one to one mapping from the event descriptor and topic descriptor data structure schemas.

```
1  message Link {
2      optional bytes / = 1;
3  }
4
5  message TopicDescriptor {
6
7      optional string name = 1;
8      optional bytes author = 2;
9      optional Link parent = 2;
10     map<string, Link> # = 3;
11     optional Metadata metadata = 4;
12
13     message Metadata {
14
15         enum EventLinking {
16             LAST_SEEN = 0;
17             CUSTOM = 1;
18         }
19
20         message PublishersList {
21             optional bool enabled = 1;
22             repeated bytes publishers = 2;
23         }
24
25         optional string created = 1;
26         optional string protocolVersion = 2;
27         optional PublishersList allowedPublishers = 3;
28         optional PublishersList requestToPublish = 4;
29         optional EventLinking eventLinking = 5;
30     }
31 }
```

Listing 3.4: Protobuf schema of the topic descriptor

```
1 message Link {
2     optional bytes / = 1;
3 }
4
5 message EventDescriptor {
6
7     message Metadata {
8         optional string created = 1;
9         optional string protocolVersion = 2;
10    }
11
12    optional bytes author = 1;
13    optional Link topic = 2;
14    optional bytes payload = 3;
15    optional bytes publisher = 4;
16    optional Link parent = 5;
17    optional Metadata metadata = 6;
18 }
```

Listing 3.5: Protobuf schema of the event descriptor

3.5 Summary

TODO

Chapter 4

Implementation

For our Pulsarcast implementation we decided to take advantage of the *libp2p* ecosystem as it solves a lot of the underlying issues of building a peer to peer system, not specific to our pubsub scenario. This includes dealing with connection multiplexing, NAT traversal, discovery mechanisms, etc. All of which *libp2p*, a community focused project with implementations in multiple languages already solves. We can also take advantage of the utility modules it has and the advantage of having an already working implementation of the Kadmelia DHT. Our focus is then to build a module, implementing the Pulsarcast specification, that clients and apps can take advantage of. Section 4.1 provides a detailed description of it.

Besides our module, we also needed to find a suitable way to test our system as whole. Given our specific needs, we opted to build a custom testbed, detailed in section 4.2 and the basis of the evaluation detailed in chapter 5.

4.1 Pulsarcast Javascript module

We chose to implement our Pulsarcast module in Javascript. As it was covered in our related work, Javascript is ubiquitous, running in browsers, servers and many different kinds of devices and architectures. Through it, we are able to run our Pulsarcast nodes in a multitude of systems and most importantly, direct its usage for the World Wide Web. Plus, *libp2p* has a Javascript implementation focused on cross compatibility between server and browser. This is not to say that in the future we will not have other implementations in different languages, that is in fact one of the reasons for the clear separation between the Pulsarcast specification and its actual implementation. However, we had to choose, and in our view Javascript is the clear winner.

TODO next

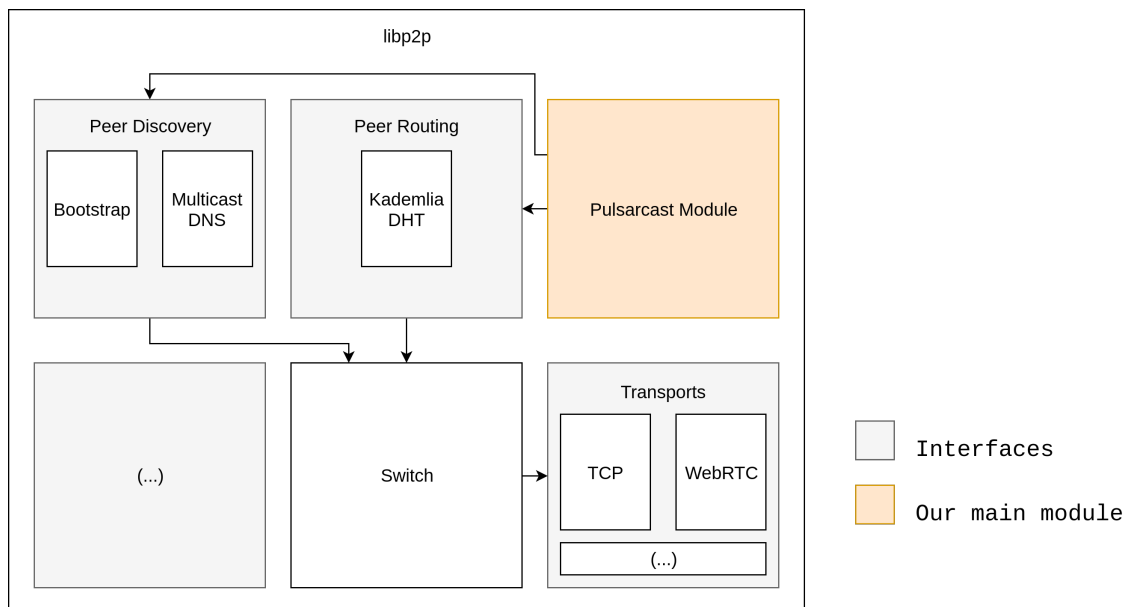


Figure 4.1: Our Pulsarcast module in the libp2p ecosystem

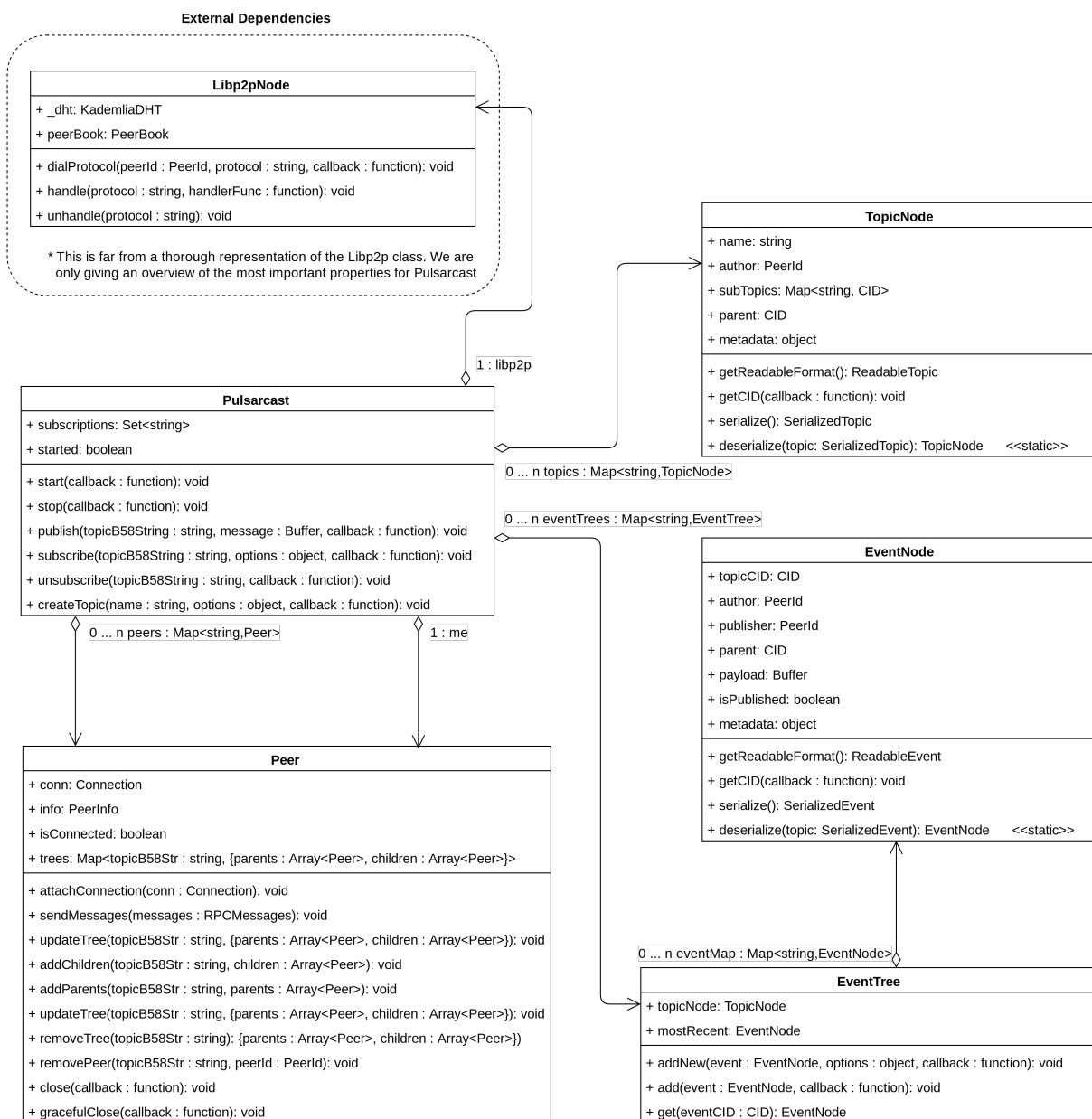


Figure 4.2: UML representation of the classes in our Pulsarcast system

4.2 Testbed

TODO

4.3 Summary

TODO

Chapter 5

Evaluation

Evaluation here...

Chapter 6

Conclusion

Conclusion here...

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Appendix A

Appendix chapter

