

# Efficient, Self-Contained Handling of Identity in Peer-to-Peer Systems

Karl Aberer, *Member, IEEE*, Anwitaman Datta, and Manfred Hauswirth, *Member, IEEE*

**Abstract**—Identification is an essential building block for many services in distributed information systems. The quality and purpose of identification may differ, but the basic underlying problem is always to bind a set of attributes to an identifier in a unique and deterministic way. Name/directory services, such as DNS, X.500, or UDDI, are a well-established concept to address this problem in distributed information systems. However, none of these services addresses the specific requirements of peer-to-peer systems with respect to dynamism, decentralization, and maintenance. We propose the implementation of directories using a structured peer-to-peer overlay network and apply this approach to support self-contained maintenance of routing tables with dynamic IP addresses in structured P2P systems. Thus, we can keep routing tables intact without affecting the organization of the overlay networks, making it logically independent of the underlying network infrastructure. Even though the directory is self-referential, since it uses its own service to maintain itself, we show that it is robust due to a self-healing capability. For security, we apply a combination of PGP-like public key distribution and a quorum-based query scheme. We describe the algorithm as implemented in the P-Grid P2P lookup system (<http://www.p-grid.org/>) and give a detailed analysis and simulation results demonstrating the efficiency and robustness of our approach.

**Index Terms**—Peer-to-peer systems, identity handling, self-maintaining, decentralized directory service, distributed hash tables, dynamic resilience.

## 1 INTRODUCTION

IDENTIFICATION provides an essential building block for a large number of services and functionalities in distributed information systems. In its simplest form, identification is used to uniquely denote computers on the Internet by IP addresses in combination with the Domain Name System (DNS) as a mapping service between symbolic names and IP addresses. Thus, computers can conveniently be referred to by their symbolic names, whereas, in the routing process, their IP addresses must be used. Higher-level directories, such as X.500/LDAP, consistently map properties to objects which are uniquely identified by their *distinguished name* (DN), i.e., their position in the X.500 tree. Other directories, such as UDDI, map names onto service descriptions and vice versa. These are just a few examples among many others that map sets of attributes onto objects and that are essential to providing basic functionalities, such as routing of IP packets, searching distributed databases, or retrieving certificates from public key authorities to conduct secure e-commerce.

Although the quality and purpose of identification may differ in the various domains, due to varying requirements and levels of abstraction, the basic underlying problem is always the one of binding a set of attributes to an identifier in a unique and deterministic way. Name/directory services,

such as DNS, X.500, or UDDI, are a well-established concept to address this problem in distributed information systems. Usually, these services are optimized toward the targeted problem area and differ in the degree of (de)centralization, security guarantees, descriptive power, and flexibility. However, none of these preexisting services addresses the specific requirements of peer-to-peer systems. Peer-to-peer systems are inherently decentralized and, thus, identification management should be decentralized as well to avoid scalability problems. For example, peer-to-peer systems are rather dynamic, with nodes frequently joining and leaving the system, and a centralized identification service may easily become a bottleneck. Additionally, it is favorable not to depend on a third-party infrastructure because, if this external service ceases to exist, the peer-to-peer system would no longer be operable. Thus, the peers should be able to manage identification issues themselves. This provides excellent scalability, but introduces security problems that need to be addressed, for example, ensuring that entries are updated only by legitimate parties, being able to detect malicious use, and surviving attacks.

Peer-to-peer systems (also called overlay networks in the literature) such as Chord [29], CAN [24], Freenet [7], [8], Pastry [27], or P-Grid [1], [4] operate on top of a routing infrastructure based on a logical identification of the peers participating in the overlay. For routing, this logical identification is mapped onto an IP address in the routing tables. Since IP addresses are scarce, most peers will have dynamic IP addresses that may change over time. This problem would be solved if Mobile IP [21] or IPv6 [28] were in place already and available at a large scale because they take into account mobility (dynamism) and offer a much larger address space. However, this requires considerable changes in the basic networking infrastructure of the

• The authors are with the School of Computer and Communication Sciences, Swiss Federal Institute of Technology Lausanne (EPFL), Distributed Information Systems Laboratory (LSIR), Batiment PSE-A, CH-1015 Lausanne, Switzerland.

E-mail: {karl.aberer, anwitaman.datta, manfred.hauswirth}@epfl.ch.

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complete Internet and it cannot be foreseen at the moment when this will happen. Our approach could bridge this gap, but it can also be applied in many other settings, for example, in mobile ad hoc networks, because it is independent of the networking infrastructure. Additionally, peers can leave and join the overlay at any time. This dynamism introduces inconsistencies into the routing tables and the whole routing process, which may make correct routing impossible if it is not dealt with appropriately.

In Chord [29], peers that (re)join the overlay with a new IP address adopt a new identity and introduce themselves into the routing infrastructure like a completely new node. This is mainly due to the fact that, in Chord, the logical identifier depends on the IP address. To repair faulty entries in routing tables resulting from node departures, the approach in [17] devises a maintenance protocol. The execution of the periodic stabilization protocol is independent of changes to the network and the adaptation resulting from repairs may compromise structural properties of the routing infrastructure, which may have been established in order to address nonuniform workloads [23]. DKS(N, k, f) [6], a generalization of the Chord model, proposes a correction-on-use protocol to maintain routing tables. The authors show that their protocol is self-stabilizing and more efficient than the Chord maintenance protocol. In their approach, peers can maintain logical identifiers with changing IP addresses, but routing tables need to be reorganized at all depths with the occurrence of every update.

In Pastry [27], nodes have an independent logical ID and, upon reentering the overlay, they may enter their new ID-to-IP binding into the routing tables of peers, encountered when executing the node join protocol. However, as these peers are typically different from those already storing such bindings, stale mappings will be encountered by other peers during query routing. These stale entries are replaced by new routing entries [19], irrespective of whether the peer identified by the stale entry has rejoined with a new IP address or not.

We see the management of dynamic IP addresses in overlay networks as an instance of the more general problem of identification. In this paper, we will present our decentralized, self-maintaining approach to identification and prove its applicability and validity by applying it to the basic problem of changing IP addresses in P-Grid (<http://www.p-grid.org/>), our structured peer-to-peer system. In contrast to the approaches of Chord, Pastry, and DKS, our strategy can track changes in the mapping. This is important as soon as information on the characteristics of specific peers is exploited for routing purposes, such as their trustworthiness, quality of service, or locality. Thus, our approach is, in particular, relevant for applications such as e-commerce [11], trust management [3], and mobility management in ad hoc networks. If information about peers is gathered from earlier interactions and the choice of routing table entries is made dependent on such properties, changes to the structure of the overlay network due to modification of routing tables should be avoided if possible (unless triggered by the application). This is, in particular, true for changes resulting from a peer's physical address,

which may be completely independent of a peer's other properties. The approaches of changing the logical IDs or restructuring routing tables as a result of changes to the peers' physical IDs (Chord, Pastry) would incur a loss of information. Thus, our approach makes the overlay network logically independent of the underlying physical network. This separation of concerns is an important step towards creating semantic overlay networks as a basic constituent in distributed information management. It is worth mentioning that this functional advantage comes at no specific additional cost. All approaches (including the one we introduce here) incur message costs of order  $O(\log^2 n)$  for maintenance.

Currently, file-sharing is the most popular use of P2P systems. Here, user response time is a major issue and identification is viewed to be only of subordinate importance. However, this is already changing since reputation, data authenticity, and fair use of resources have become major issues in P2P systems and require identification as a service to address them. Also, quickly finding the peer that offers information of interest will reduce response time. If peers have dynamic network addresses, this again requires an identification service as described in this paper.

To support dynamic IP addresses as an application of identification, it is necessary to address the following problems: 1) How can universally unique identifiers be mapped onto physical addresses in a secure, decentralized, and efficient way and be maintained securely by the owner? 2) With the possibility of changes of the mapping, i.e., the physical addresses, how can a peer detect whether it is still talking with the intended entity? This means that a) if peer  $p_1$  goes offline and a different peer  $p_2$  gets associated with  $p_1$ 's old IP address, the other peers in the system must be able to detect this change and react accordingly and b) if a peer goes online again with a new IP address, the other peers must be able to detect this, update their routing tables accordingly, and check identification before further information transfers.

Unstructured P2P systems, for example, Gnutella [9], and super-peer P2P systems, for example, Kazaa (Fast Track), are able to address the first problem in a simpler manner than structured P2P systems, but have other shortcomings, for example, excessive bandwidth consumption (Gnutella) or scalability limitations due to inherent centralization (FastTrack). However, any peer-to-peer system should actually address problem 2 for security reasons to avoid simple denial-of-service (DOS) attacks by registering false mappings.

In our approach, peers generate universally unique identifiers locally, independent of their IP address or any other global information, and store them along with their public key, their current IP address, and a cryptographic signature in the P-Grid P2P lookup system [1], [4] on a certain number of peers (replicas). Instead of IP addresses, the unique IDs are used for querying and routing. Mapping an ID onto an IP address in the routing process is done by querying P-Grid using the receiver's ID as the key. If a certain quorum of identical answers is returned, the mapping is considered trustworthy and the peer is contacted. If contacting the peer fails, the peer is either

offline or has changed its IP address. The requester can now either assume that the peer is offline and give up or, in the latter case, submit a new query to determine the new IP address. If contacting the peer succeeds in either case, its public key is used to determine whether the contacted peer is really the one identified by the mapping or whether a different peer is reusing the address, or a malicious peer is trying an impersonation attack. The security concept of our approach is a combination of PGP-like public key distribution and a quorum-based query scheme, elaborated in [11].

This strategy ensures secure mapping, but may seem like introducing a recursive hen-egg problem as we use the mechanism (P-Grid) that depends on using the mappings, also for storing and maintaining the mappings. We show that, despite this recursive dependency, it is in fact possible to devise such a self-contained service which is completely decentralized, self-maintaining, and lightweight by devising algorithms implementing self-healing capabilities. Decentralization may require additional security precautions, which we take into account, but it is of primary concern to avoid performance and especially administrative bottlenecks, i.e., no central authority is required to maintain mappings, but this service is provided securely by the users of the service themselves. In turn, self-maintenance must be addressed properly because, in a decentralized system, no central authority can enforce maintenance.

The paper is structured as follows: Section 2 introduces P-Grid, which we use to verify our approach. Section 3 then defines our identification protocol, which is demonstrated in Section 4 by a simple example. Section 5 then provides the algorithms which are analyzed and evaluated in Sections 6 and 7. Section 8 presents related work and we draw our conclusions in Section 9.

## 2 THE P-GRID DATA STRUCTURE

Since the approach presented in this paper is based on and used in P-Grid as a proof of concept, we briefly introduce it. P-Grid is a distributed data structure based on the principles of distributed hash tables (DHT) [22]. As any DHT approach, P-Grid is based on the idea of associating peers with data keys from a key space  $\mathcal{K}$ . Without constraining general applicability, we will only consider binary keys in the following. In contrast to other DHT approaches, we do not impose a fixed or maximal length on the keys, i.e., we assume  $\mathcal{K} = \{0, 1\}^*$ .

In the P-Grid structure, each peer  $p \in Peers$  is associated with a binary key from  $\mathcal{K}$ . We denote this key by  $path(p)$  and will call it the path of the peer. This key determines which data keys the peer has to manage, i.e., the keys in  $\mathcal{K}$  that have  $path(p)$  as prefix. In particular, the peer has to store them. In order to ensure that the complete search space is covered by peers, we require that the set of peers' keys is *complete*. The set of peer's keys is complete if for every prefix  $s_{pre}$  of the path of a peer  $p$ , there exists a peer  $p'$ , such that  $path(p') = s_{pre}$  or there exist peers  $p_0$  and  $p_1$  such that  $s_{pre}0$  is a prefix of  $path(p_0)$  and  $s_{pre}1$  is a prefix of  $path(p_1)$ . Naturally, one of the two peers  $p_0$  and  $p_1$  will be  $p$  itself in that case. Completeness is guaranteed by P-Grid's construction algorithm. We do not exclude the situation

where the path of one peer is a prefix of the path of another peer. This situation will occur during the construction and reorganization of a P-Grid. Ideally, this situation is avoided since, otherwise, peers with shorter paths (prefixes) will have high storage loads and, thus, load balancing is compromised. Thus, any algorithm for maintaining a P-Grid should eventually converge to a state where the P-Grid is *prefix-free*, i.e., for peers  $p_0$  and  $p_1$ , we have

$$path(p_0) \not\subseteq path(p_1) \wedge path(p_1) \not\subseteq path(p_0),$$

where  $s \subseteq s'$  denotes the prefix relationship among strings  $s$  and  $s'$ . An indexing structure based on similar principles such as P-Grid, which does not require the prefix-free property is described in [20].

We also allow multiple peers to share the same paths; in that case, we call the peers replicas. The number of peers that share the same path is called the *replication factor* of the path. Replication is important to support the redundancy and, thus, robustness of a P-Grid in case of failures and to distribute workload when searching in a P-Grid.

To be able to search in P-Grid, peers maintain *routing tables*. The routing tables are defined as (partial) functions  $ref : Peers \times N \rightarrow \{Peers\}$  with the properties:

1.  $ref(p, l)$  is defined for all  $p \in Peers$  and  $l \in N$  with  $1 \leq l \leq |path(p)|$ .
2.  $ref(p, l) \subseteq Peers_{s_1 s_2 \dots s_{l-1} (1-s_l)}$  with

$$path(p) = s_1 s_2 \dots s_{l-1} s_l \dots s_k, k \geq l,$$

where  $Peers_t = \{p \in Peers | t \subseteq path(p)\}$  for  $t \in \mathcal{K}$ .

For the same association of peers with paths, different P-Grids can be obtained depending on the choice of  $ref(p, l)$ . Algorithms for construction and maintenance of a P-Grid have been introduced in [2].

Having multiple references at each level  $l$  again is necessary to guarantee robustness of the data structure. In the following,  $r$  denotes the maximum number of references maintained at each level. The search algorithm for locating data keys indexed by a P-Grid is defined as follows: Each peer  $p \in Peers$  is associated with a location  $loc(p)$  (IP address in the network). Searches can start at any peer. Peer  $p$  knows the locations of the peers referenced by  $ref(p, l)$ , but not of other peers. Thus, the function  $ref(p, l)$  provides the necessary routing information to forward search requests to other peers in case the searched key does not match the peer's path. Let  $t \in \mathcal{K}$  be the searched data key and let the search start at  $p \in P$ . Algorithm 1 shows P-Grid's basic recursive search algorithm.

**Algorithm 1** Search in P-Grid: search( $t, loc(p)$ )

- 1: **if**  $path(p) \subseteq t$  **then**
- 2:     return( $loc(p)$ );
- 3: **else**
- 4:     determine maximal  $l$  such that  
 $t_1 \dots t_{l-1} (1-t_l) \subseteq path(p)$ ;
- 5:      $r$  = randomly selected element from  $ref(p, l)$ ;
- 6:     search( $t, loc(r)$ );
- 7: **endif**

Algorithm 1 always terminates successfully if the P-Grid is complete and all peers are reachable. Due to the

definition of  $ref$ ,  $search(t, loc(p))$  will always find the location of a peer at which the search can continue (use of completeness). With each invocation of  $search(t, loc(p))$ , the length of the common prefix of  $path(p)$  and  $t$  increases at least by one. Therefore, the algorithm always terminates.

In case of an unreliable network, it may occur that a search cannot continue since the peer  $r$  selected from the routing table is not available. Then, alternative peers can be selected from the routing table to continue the search.

### 3 THE IDENTIFICATION PROTOCOL

This section defines the algorithm and protocol for maintaining ID-to-IP mappings in P-Grid. Generalizing this specific example to other mappings is implicit and straightforward.

Each peer  $p$  is uniquely identified by a universally unique identifier (UUID)  $Id_p$ . Each peer generates this identifier locally once in the bootstrap phase by applying a cryptographically secure hash function to the concatenated values of the current date and time, the current IP address of the peer  $addr_p$ , and a large random number. At bootstrap, each peer  $p$  also generates a private/public key pair  $D_p/E_p$  once. In the following, we use the standard security notations  $D_p(x)$  and  $E_p(x)$ , where  $D_p(E_p(x)) = E_p(D_p(x)) = x$ , to denote the application of the private and public keys in an asymmetric encryption scheme. Note that keys do not have to be certified since we do not need legally binding authentication guarantees as provided by certification authorities. Also, this would introduce centralization and limit scalability. Instead, our approach follows a PGP-like strategy of distributing signed mappings and public keys via independent paths and we apply a quorum-based strategy to find trustful mappings. This provides a similar level of security, but, of course, is not legally binding.

In P-Grid, routing tables and the index hold only these identifiers. Each peer  $p$  additionally has a cache of mappings  $(Id_i, addr_i, TS_i)$  that it already knows.  $TS_i$  denotes a timestamp which must be included to prevent replay attacks, i.e., the recording of transmitted information by a malicious party and replaying it at a later time (the timestamp guarantees the freshness of messages).

The algorithm for handling dynamic IP addresses works as follows (inserts and updates are done according to the algorithm presented in [12]):

#### 3.1 Bootstrap

1. Upon startup,  $p$  determines its current IP address.
2.  $p$  generates  $Id_p, D_p/E_p$ .
3.  $p$  inserts the tuple

$$(Id_p, addr_p, E_p, TS_p, D_p(Id_p, addr_p, E_p, TS_p))$$

into P-Grid using  $Id_p$  as the key. Inserting in P-Grid means that the request is routed to a peer  $R_i \in \mathcal{R}_p$ .  $\mathcal{R}_p$  is the set of replicas responsible for the binary path using  $Id_p$  as the key value. Note that the tuple contains a signed version of the information to be inserted to assure that only the originator of the information can change it. This is a standard strategy used in security which we will use in all data manipulation operations in the following. How the

checking process works will be described in those steps of the algorithm where it is required. If  $Id_p$  already exists in the P-Grid,  $p$  is notified. However, this is very improbable because of the randomization in the generation of  $Id_p$  and the application of a cryptographically secure hash function. Nevertheless, if it should occur,  $p$  generates a new  $Id_p$  and repeats this step.

4. The previous step is repeated a limited number of times, which we denote as  $R_{min}$  in the following, and  $p$  waits for confirmation messages from  $R_{min}$  distinct peers to prevent a malicious peer in  $\mathcal{R}_p$  from distributing false data to the other replicas in  $\mathcal{R}_p$ .
5. As a result of the previous two steps, the mapping will be physically stored at peers in  $\mathcal{R}_p$ . Based on the randomized algorithms that P-Grid uses, we can assume that the individual replicas  $R_i \in \mathcal{R}_p$  are independent and they collude or behave in a Byzantine way only to a degree that can be handled by existing algorithms.

#### 3.2 Peer Startup

1.  $p$  starts up and checks whether its  $addr_p$  has changed. If not, the algorithm terminates. Otherwise, the following steps are taken.
2.  $p$  sends an update message

$$(Id_p, addr_p, TS_p, D_p(Id_p, addr_p, TS_p))$$

to the P-Grid, i.e., a new mapping and a signature for this mapping.

3. Upon receiving the update request, the  $R_i$ s check the signature by verifying that

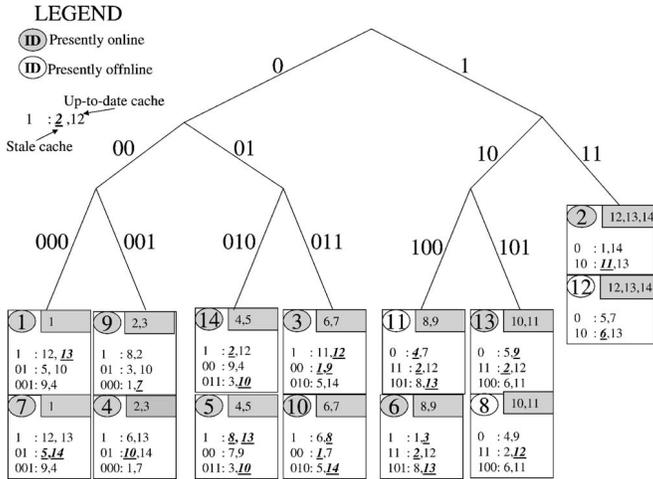
$$E_p(D_p(Id_p, addr_p, TS_p)).Id_p = Id_p$$

(thus, only  $p$  can update its mapping) and  $TS_{R_i} < TS_p$  (to prevent replay attacks). If yes, the new mapping is stored; otherwise, an error message is returned. Note that this operation does not cause a chase because the replicas responsible for storing the mapping already know  $E_p$  from the original insertion of the mapping in the bootstrap phase.

#### 3.3 Operation Phase

In the operation phase,  $p$  is up and running, has registered an up-to-date mapping  $(Id_p, addr_p, TS_p)$ , and is ready to process queries and update requests.

1.  $p$  receives a request  $Q$  from a peer  $q$ .
2. In case  $p$  can satisfy  $Q$ , the result is returned to  $q$ . Otherwise,  $p$  finds out to which peers  $p_f$  it can forward the query according to P-Grid's routing strategy. Then, it checks its routing table and retrieves  $(Id_{p_f}, addr_{p_f}, E_{p_f}, TS_{p_f})$  which had been entered during the construction of P-Grid.
3.  $p$  generates a random number  $\rho$ , contacts  $p_f$ , and sends  $E_{p_f}(\rho)$ . As an answer,  $p_f$  must send  $(D_{p_f}(E_{p_f}(\rho)))$  and  $p$  can check whether  $D_{p_f}(E_{p_f}(\rho)) = \rho$ . If yes,  $p_f$  is correctly identified, i.e.,  $p$  really talks to the peer it intends to, and  $Q$  is forwarded to  $p_f$ .

Fig. 1. P-Grid before Query(01\*) at  $P_7$ .

4. If not, then  $p_f$  has a new IP address (the case that somebody tries to impersonate  $p_f$  is covered implicitly by the signature check above), and  $p$  sends a query to P-Grid to retrieve the current  $addr_{p_f}$  using  $Id_{p_f}$  as the key.
5.  $p$  collects all answers

$$t_i =$$

$$(Id_{p_f}, E_{p_f}, addr_{p_f}, TS_{p_f}, D_{p_f}(Id_{p_f}, E_{p_f}, addr_{p_f}, TS_{p_f}))$$

it receives from the  $R_j \in \mathcal{R}_{p_f}$  (if extended security is required, then the  $R_j$  should sign their answers, i.e., send  $(t_i, D_{R_j}(t_i))$ ).  $p$  has to collect at least  $R_{min}$  answers to detect misinformed or malicious peers, i.e., to check whether a certain quorum of the answers is identical ( $R_{min}$  is defined by each individual  $p$  according to its local requirements for trustworthiness of the reply). Otherwise, the query is repeated a certain number of times before aborting.

- a. As an optimization, the quorum can be avoided under certain circumstances: If  $p$  already knows  $E_{p_f}$ , e.g., from the construction of the P-Grid, or because it has already done a certain number of (quorum-based) queries for  $E_{p_f}$  that have resulted in identical answers, it can assume that its  $E_{p_f}$  is correct. Thus, it can immediately check the validity of the answer by

$$E_{p_f}(D_{p_f}(Id_{p_f}, E_{p_f}, addr_{p_f}, TS_{p_f})).Id_{p_f} = t_i.Id_{p_f}.$$

- b. The scheme can be further optimized (and made more robust and secure) by having all peers store the  $E_{p_s}$  that they receive.
6. Now,  $p$  can proceed with Step 3. In case this is successful,  $p$  enters  $(Id_{p_f}, addr_{p_f}, E_{p_f}, TS_{p_f})$  into its local cache.

## 4 PROCESSING QUERIES

Fig. 1 shows a typical state of a P-Grid network.

Peer  $P_i$  is denoted by  $i$  inside an oval. Online peers are indicated by shaded ovals and offline peers by unshaded

ovals. Peers under the same branch are replicas. For example,  $P_1$  and  $P_7$  are both responsible for paths starting with 000. Without loss of generality, we assume that  $Id_{p_f}$  has a length of four bits. Thus,  $P_7$  holds the public key and latest physical address mapping about  $P_1$  (updated by  $P_1$ ) because  $P_7$  is responsible for the paths 0000 and 0001. The shaded rectangle in the upper-right corner of each peer shows the peer IDs that a peer is responsible for, i.e., whose public key and physical address mapping it manages. Note that there exists no dependency between the peer identity ( $id_{P_i} = 0111$ ) and the path it is associated with ( $path(P_7) = 0000$ ). In its routing table,  $P_7$  stores references for paths starting with 1, 01 and, 001 so that queries with these prefixes can be forwarded closer to the peers holding the searched information. The cached physical addresses of these references may be up-to-date (for example,  $P_{13}$ 's) or be stale (denoted by underlining, for example,  $P_5$ ).

A peer  $P_q$  decides that it has failed to contact a peer  $P_s$ , if one of the following happens: 1) No peer is available at the cached address (trivial case). 2) The contacted peer fails in the authentication as described in Step 3 in the operation phase of the algorithm described in the previous section:  $P_q$  will use  $P_s$ 's public key to verify  $P_s$ 's identity. Since only  $P_s$  knows its private key, which must have been used for the signature, it is the only peer that can pass the identity test. In either of the above two cases, an up-to-date mapping must be obtained by querying the P-Grid. We have investigated two querying strategies:

**Isolated-Query.** Upon receiving a query, a peer checks whether it can answer the request. If not, it forwards the query to at least one of the peers in its routing table according to P-Grid's routing algorithm. If none of these peers can be contacted, the query is abandoned and fails.

**Recursive-Query.** If a peer fails to contact peers in its routing table, it initiates a new query to discover the latest "identity-to-address" mapping of any of those peers. If this is successful, it forwards the query.

Assuming this initial setup, the query processing based on the protocol of Section 3 will work as follows: While the P-Grid is in the state as shown in Fig. 1, assume that  $P_7$  receives a query  $Q(01^*)$ .  $P_7$  fails to forward the query to either of  $P_5$  or  $P_{14}$  since their cache entries are stale. Here, the *Isolated-Query* algorithm fails immediately.

In contrast, the *Recursive Query* algorithm would try to discover the latest addresses for the stale entries.  $P_7$  initiates *Recursive-Query*( $P_5$ ), i.e.,  $Q(0101)$ , which needs to be forwarded to either  $P_5$  or  $P_{14}$ . This fails again.  $P_7$  then initiates *Recursive-Query*( $P_{14}$ ), i.e.,  $Q(1110)$ , which needs to be forwarded to  $P_{12}$  and (or)  $P_{13}$ .  $P_{12}$  is offline, so, irrespective of the cache being stale or up-to-date, the query cannot be forwarded to  $P_{12}$ .  $P_{13}$  is online and the cached physical address of  $P_{13}$  at  $P_7$  is up-to-date, so the query is forwarded to  $P_{13}$ .  $P_{13}$  needs to forward  $Q(P_{14})$  to either  $P_2$  or  $P_{12}$ . Forwarding to  $P_{12}$  fails and so does the attempt to forward the query to  $P_2$  because  $P_{13}$ 's cache entry for  $P_2$  is stale. Thus,  $P_{13}$  initiates another subquery, *Recursive-Query*( $P_2$ ), i.e.,  $Q(0010)$ . Additionally, it may initiate *Recursive-Query*( $P_{12}$ ).  $P_{13}$  sends  $Q(P_2)$  to  $P_5$

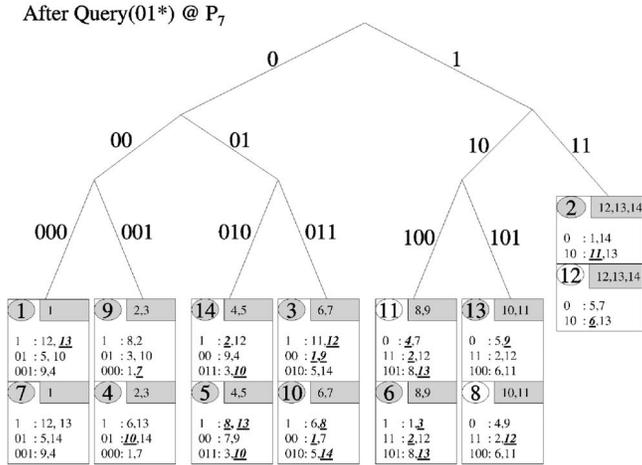


Fig. 2. P-Grid after Query(01\*) at  $P_7$ .

which forwards it to  $P_7$  and/or  $P_9$ . Let us assume  $P_9$  replies. Thus,  $P_{13}$  learns  $P_2$ 's address and updates its cache.  $P_{13}$  also starts processing and forwards the parent query *Recursive-Query*( $P_{14}$ ) to  $P_2$ .  $P_2$  provides  $P_{14}$ 's up-to-date address, and  $P_7$  updates its cache.

Having learned  $P_{14}$ 's current physical address,  $P_7$  now forwards the original query  $Q(01^*)$  to  $P_{14}$ . This not only satisfies the original query, but  $P_7$  also has the opportunity to learn and update physical addresses  $P_{14}$  knows and  $P_7$  needs, for example,  $P_5$ 's latest physical address (we assume that peers synchronize their routing tables during communication since this does not incur any overhead). In the end, the query  $Q(01^*)$  is answered successfully and, additionally,  $P_7$  gets to know the up-to-date physical addresses of  $P_{14}$  and possibly of  $P_5$ . Furthermore, due to child queries,  $P_{13}$  updates its cached address for  $P_2$ . Fig. 2 shows the final state of the P-Grid with several caches updated after the completion of  $Q(01^*)$  at  $P_7$ .

We have not explicitly mentioned concurrency issues in the example above because those are either addressed by the networking layer or do not cause problems since we support only lazy consistency. For example, if the IP addresses change during authentication, the networking layer would drop the connection and the authentication would start anew without causing security or concurrency problems. If the IP address of a peer to be contacted would change after retrieving a mapping, i.e., a query would return a "stale" entry, this would be recognized because the authentication would fail upon contacting the peer present at the retrieved address. Since only the owner can update a mapping, concurrency control is not needed here and, if replicas have not been updated correctly when being queried, this would also be recognized upon contacting the peer and can be accounted for by reissuing the same query. Additionally, we can assume that IP addresses do not change at a high frequency (normally, once a peer goes online, it keeps the same address for at least some hours in typical ISPs' DHCP setups). However, other "hidden costs," for example, updates to the mappings and rectifying stale cache entries (self-healing) need to be taken into account as discussed in the following sections.

## 5 QUERY (SEARCH) ALGORITHM

Algorithm 2 shows the query (search) algorithm in pseudocode. In the following,  $\mathcal{R}_{path}$  denotes the set of peers (replicas) which has the result to a query for path  $path$ . If a peer  $P_q$  receives a query  $Q(path)$  and  $P_q \notin \mathcal{R}_{path}$ , then it tries to route (forward) the query to peers in its routing table according to P-Grid's routing strategy. The set of peers in its routing table to which the query can be forwarded is denoted as  $\mathcal{R}_{path,q}$ .  $P_s$  denotes a stale cache entry.

**Algorithm 2** query  $P_q$  for  $path$  (query( $path$ ) at  $P_q$ )

- 1: if  $P_q \in \mathcal{R}_{path}$  then
- 2:   reply to query;  $\{P_q$  has the requested information}
- 3: else
- 4:    $\mathcal{R} = \{P_j \in \mathcal{R}_{path,q} | P_j$  is at cached address}
- 5: else
- 6:   {the isolated query strategy does not fix stale cache entries as the lazy and eager repair strategies do}
- 7:   if ( $\mathcal{R} = \emptyset$  and lazy repair strategy) or eager repair strategy then
- 8:      $\mathcal{C} = \{\text{all cached peers at all levels}\}$ ;
- 9:     for all  $P_s \in \mathcal{R}_{path,q} \setminus \mathcal{R}$  do
- 10:       forward query( $path(P_s)$ ) to a nonstale entry from  $\mathcal{C}$ ;
- 11:     end for
- 12:   end if
- 13:    $\mathcal{R} = \{P_j \in \mathcal{R}_{path,q} | P_j$  is at cached address}
- 14:   if  $\mathcal{R} \neq \emptyset$  then
- 15:     forward query( $path$ ) to a  $P_j \in \mathcal{R}$ ;
- 16:   else
- 17:     return failure;
- 18:   end if
- 19: end if

In fact, the pseudocode summarizes three different variants of the algorithm which we will consider. The nonrecursive variant (isolated query) provides a result for a query if at least one routing entry is up-to-date for each routing step and the corresponding peers are online. Thus, it only works if the routing tables are sufficiently redundant. The two other variants (lazy repair and eager repair) are recursive and try to fix stale routing tables to increase the success probability of a query. They differ in their approach to repairing stale routing entries. The eager strategy tries to repair any stale entry immediately (correction on use), whereas the lazy strategy starts the repair process only if all routing entries at one level of a routing table are stale (correction on failure). These two variants may trigger child queries at any stage in the routing process until they succeed. The recursive strategies affect the rectification of stale caches at various peers, thereby "self-healing" the overall P-Grid. To avoid cyclic recursions, the queries bear unique identifiers and recursion does not occur when it would apply to a reference that is under repair in a parent query. Additionally, this helps to prevent concurrent repair requests for the same stale entry at one peer.

Deadlock situations, where none of the recursive queries terminates successfully and all entries at one level are stale, may occur. But experiments show that their influence on performance decreases with an increasing network size.

## 6 ANALYSIS OF THE ALGORITHMS

In the analysis of the algorithms below we use the following notations:

- $p_{on}$  denotes the probability of peers being online.
- $p_{dyn}$  defines the probability that a randomly selected entry of a routing table is stale.
- $\mu$  is the probability that an isolated attempt to contact any particular peer  $P_i$  by peer  $P_j$  using its local cache information fails.
- $\epsilon_h$  denotes the failure probability of forwarding a query to any other peer specialized for the other half of the search-subtree.
- $\epsilon$  defines the failure probability of a query.
- $n$  is the number of leaves.
- $r$  is the number of references for the other half of the subtree in P-Grid routing tables for each depth. It is important to note that we can assume these  $r$  references are independent due to the randomized construction process of P-Grid.
- $A$  ( $A_\epsilon$ ) denotes the expected number of attempts (message exchanges) required for a query (along with the achieved error rate).

### 6.1 Analysis of an Isolated Search/Query

We first analyze the effect on P-Grid searches of peers going offline and then rejoining the P-Grid with a possibly different physical address. When a peer  $P_q$  needs to forward a query  $Q(P_i)$ , it may fail to do so because all the peers in  $\mathcal{R}_{P_i,q}$  to which the query may be forwarded are offline or their cached physical addresses are stale (or both). If the overall offline probability of peers is  $1 - p_{on}$  and the probability that a cache entry at  $P_q$  is stale is  $p_{dyn}$ , then the probability that an isolated attempt at  $P_q$  to reach a particular peer in  $\mathcal{R}_{P_i,q}$  is successful equals  $1 - \mu = p_{on}(1 - p_{dyn})$ . Likewise, the failure probability of an isolated attempt to forward a query equals  $\mu = 1 - p_{on}(1 - p_{dyn})$ .

Thus,  $\mu$  represents the coupled probability that a peer is offline and/or the physical address associated with any peer  $P_s$  cached at  $P_q$  has changed. Consequently, when attempts are made to contact  $r$  random peers from the references  $\mathcal{R}_{P_i,q}$  at  $P_q$ , the probability that all  $r$  attempts fail is  $\mu^r$ . So, given a per-hop error tolerance  $\epsilon_h$ , we need a minimum of  $r$  references to which a search may be forwarded such that  $\mu^r < \epsilon_h$ . Thus, we need at least  $A_{\epsilon_h} = \lceil \frac{\log \epsilon_h}{\log \mu} \rceil$  references for the other half of the P-Grid subtree at any depth to achieve a given  $\epsilon_h$  (and vice versa).

With a  $\epsilon_{h_i}$  failure probability for query routing at hop  $i$ , the probability of successful routing to a desired leaf node is  $\prod_{i=1}^H (1 - \epsilon_{h_i})$ , where  $H$  is the expected number of hops to reach the particular leaf node in question. If there are at least  $A_{\epsilon_h}$  references available at any hop, then  $\forall i \epsilon_h \geq \epsilon_{h_i}$  and, thus,  $\epsilon_h$  determines the worst per-hop failure probability. We use this  $\epsilon_h$  for all hops, thus determining a worst-case average performance in the remaining analysis. We thus obtain the effort for one hop of the nonrecursive version of the query as  $A_h^{iso} = A_{\epsilon_h}$ . The expected total cost to process a query in a balanced P-Grid is then  $A_{iso} = \frac{\log_2 n}{2} A_h^{iso}$ .

If  $\epsilon_h$  is achievable at every hop (enough references available), then the success probability is  $1 - \epsilon = (1 - \epsilon_h)^H$ , where  $H$  is the number of times the query needs to be forwarded to reach the leaf node. Thus, the expected value of the achievable success probability is  $1 - \epsilon = E_H[(1 - \epsilon_h)^H]$ . For a general P-Grid, the distribution of  $H$  and, thus, the expectation is difficult to evaluate, but, for a balanced P-Grid,  $H$  is a binomial random variable of size  $\log_2 n$  and parameter 0.5. Hence,  $1 - \epsilon = (1 - \frac{\epsilon_h}{2})^{\log_2 n}$ .

### 6.2 Recursive Queries and Dynamic Equilibrium

While cached entries continuously get stale owing to network dynamics, they trigger recursive queries in order to update the stale mappings. Hence, the recursive version of querying in P-Grid has an inherent self-healing property. With few stale mappings, there is hardly any deterioration in answering the queries, but, as the stale entries accumulate over time, they lead to more frequent recursions. Thus, it is expected that the system will reach a dynamic equilibrium such that the rate of changes will equal the rate at which self-maintenance is done due to recursions. If the rate of changes in the system is very high, then the system's self-maintenance will be unable to catch up with the changes and the system breaks down. In this section, we analyze if a dynamic equilibrium for a given rate of changes is achievable, thus determining the operational zone with respect to the rate of change and, if such an equilibrium is achievable, we evaluate the system behavior (dynamic resilience) at the equilibrium.

In the analysis and the results, we quantify the rate of change considering two kinds of events in the network. With probability  $r_{up}$ , an event consists of peers independently updating their address. With probability  $1 - r_{up}$ , an event consists of peers issuing queries. Since updates necessarily imply the execution of one query to locate a node to which the update is going to be stored, we assume that  $r_{up} \leq 0.5$ .

#### 6.2.1 Eager Recursion

In the eager recursion, all references are checked and the algorithm tries to rectify all stale cache entries immediately. The effort for a single hop is  $A_h = A_h^{iso} + r\mu A_{rec}$  since an expected  $r\mu$  recursions will be initiated at each hop, even if the original query is forwarded, where  $\mu = 1 - p_{on}(1 - p_{dyn})$ . The effort for a recursive query is  $A_{rec} = \frac{\log_2 n}{2} A_h$ . Thus, the expected number of recursions  $N_{rec} = \frac{A_{rec}}{A_h} = \frac{1}{1 - \frac{\log_2 n}{2} r\mu}$ .

A single hop fails when none of the references can be contacted, either because the recursive query fails or the concerned peer is offline. If  $\epsilon_h$  is the probability of failure of a single hop (forwarding) in the querying process, then  $1 - \epsilon_r = (1 - \frac{\epsilon_h}{2})^{\log_2 n}$  (as derived in Section 6.1). The probability that a single hop fails equals the probability that recursions are initiated ( $p_{rec} = \mu$ ) and none of the  $r$  children responses are usable, either because the recursions themselves fail or, even if they do not fail, the concerned routing reference is offline. Thus,  $\epsilon_h = p_{rec}(1 - (1 - \epsilon_r)p_{on})^r$ .

The dynamic equilibrium equation then is:

$$(1 - r_{up})(N_{rec} - 1)p_{on}(1 - \epsilon_r) = r_{up}(1 - p_{dyn})r \log_2 n.$$

The left-hand side is the rate at which successful repairs of stale routing table entries occur due to the  $N_{rec} - 1$  additional recursive queries. Repairs can only lead to a successful update if the peer to be repaired is online, therefore an additional factor of  $p_{on}$ . This reflects the underlying assumption that queries and, thus, repairs occur at a substantially higher rate than the peers are switching between offline and online state. The right-hand side is the rate at which routing table entries turn stale due to changes.

We solve the above equations numerically for  $p_{dyn}$ ,  $\epsilon_r$ , and  $N_{rec}$  to determine the system performance at the dynamic equilibrium given the system parameters  $p_{on}$ ,  $r_{up}$ ,  $r$ , and  $n$ . For the case  $p_{on} = 1$ , it is also relatively easy to see from the equations that  $N_{rec} \leq 1 + \frac{r_{up}}{1-r_{up}} r \log_2 n$ . This shows that eager recursion also exhibits excellent scalability with  $n$ .

### 6.2.2 Lazy Recursion

For lazy recursion, we need to analyze the states of routing tables in more detail. There are  $r$  routing table entries at each peer at each depth. Let  $S_i$  denote the probability that  $i$  out of  $r$  routing table entries at a given depth are stale. In the following, we will also say that a routing table at a given depth is in state  $S_i$ .

When using lazy recursion, queries are triggered if a peer cannot use any of its corresponding routing tables to forward a query. This happens either because the routing entries are stale and the latest ID-to-IP mappings have to be found (using recursive queries) or because the concerned peers are offline. We assume that, in this case, the peer issues parallel queries for all  $r$  references in order to minimize response time. Recursive queries occur with a probability  $p_{rec} = \sum_{i=0}^r S_{r-i} (1-p_{on})^i$ , where  $p_{on}$  is the probability that any particular peer is online.

The effort to forward any query (one hop) is  $A_h = A_h^{iso} + r p_{rec} A_{rec}$ , where  $A_{rec}$  is the total effort in terms of number of messages for a newly issued recursive query. From the properties of a balanced P-Grid, any query requires  $\frac{\log_2 n}{2}$  forwarding steps on average to successfully answer the query. Hence,  $A_{rec} = \frac{\log_2 n}{2} A_h$ . Solving these recursive equations, we obtain the total number of queries including the original and children queries invoked per original (isolated) query  $N_{rec} = \frac{1}{1 - \frac{r p_{rec} \log_2 n}{2}}$ .

As mentioned earlier,  $r_{up}$  fraction of the network events are ID-to-IP mapping changes in comparison to  $1 - r_{up}$  fraction of queries. Routing tables are created based on P-Grid's randomized construction algorithm and each peer is equally likely to be a routing table entry for other peers. If there are  $N$  peers populating a P-Grid with  $n$  leaves (replication factor of  $N/n$ ), then each peer has, on average,  $r \log_2 n$  routing references,  $r$  for each of the  $\log_2 n$  depth of the search tree. Hence, each peer is used as a routing reference  $\frac{N r \log_2 n}{N} = r \log_2 n$  times in the whole P-Grid network. The probability that an update of a specific ID-to-IP mapping affects a routing table entry with  $i$  stale entries then is  $r_{up} S_i \frac{r-i}{r} r \log_2 n$  since the original queries are uniformly distributed and  $r-i$  out of the  $r$  entries are susceptible to become stale.

The self-healing comes into action while processing the original queries, each of which leads to  $N_{rec} - 1$  recursive

queries on average and each of these recursive queries tries to update one routing reference. When recursive queries are triggered in state  $S_i$ , which occurs with probability  $S_i (1-p_{on})^{r-i}$ ,  $i$  out of the  $N_{rec} - 1$  recursive queries are initiated. Thus, in state  $S_i$ , the probability that self-healing occurs due to an initial query is

$$(1 - r_{up}) \frac{1}{p_{rec}} S_i (1 - p_{on})^{r-i} \frac{1}{i} (N_{rec} - 1).$$

However, recursive queries may not always succeed. If the recursion is triggered when  $i$  cached references are stale and the  $r-i$  others are offline, then the  $i/r$  fraction of references can be updated at most. If  $\epsilon_r$  is the probability that a recursive query fails, then  $\binom{j}{i-j} (1-\epsilon_r)^{i-j} \epsilon_r^j$  is the probability that, of the  $i$  possible repairs, only  $i-j$  are successful, such that  $j \leq i$  stale entries are left in the routing table even after recursive queries.  $\epsilon_h = (\mu(1 - (1-\epsilon_r)p_{on}))^r$  and  $1 - \epsilon_r = (1 - \frac{\epsilon_h}{2})^{\log_2 n}$  are derived as in Section 6.2.1.

For the dynamic equilibrium, the inflow to any state  $S_i$  should equal the outflow from  $S_i$ . Hence, the dynamic equilibrium equation is

$$\begin{aligned} & r_{up} S_i \frac{r-i}{r} r \log_2 n \\ & + (1 - r_{up}) \sum_{j=i+2}^r \frac{1}{p_{rec}} S_j (1-p_{on})^{r-j} \frac{1}{j} (N_{rec} - 1) \binom{i}{j-i-1} \\ & (1 - \epsilon_r)^{j-i-1} \epsilon_r^{i+1} \\ & = r_{up} S_{i+1} \frac{r-i-1}{r} r \log_2 n + (1 - r_{up}) \frac{1}{p_{rec}} \\ & S_{i+1} (1-p_{on})^{r-i-1} \frac{1}{i+1} (N_{rec} - 1) (1 - \epsilon_r^{i+1}). \end{aligned}$$

The left-hand side of the equation is the inflow into state  $S_{i+1}$  from  $S_i$  as well as from  $S_j \forall j > i+1$  because of partial repairs. The right-hand side is the outflow from  $S_{i+1}$ . The outflow is caused by two factors: The first is because additional entries turn stale; the second occurs whenever recursions are initiated and at least one cached entry is repaired.

We solve the above equations numerically for  $S_i$ ,  $N_{rec}$ ,  $p_{dyn}$ ,  $\epsilon_r$  and, thus, determine the system's performance (dynamic resilience) at the dynamic equilibrium given the system parameters  $p_{on}$ ,  $r_{up}$ ,  $r$ , and  $n$ .

## 7 ANALYTICAL AND SIMULATION RESULTS

We implemented the algorithms described in this paper in order to verify the analytical models by simulation and to demonstrate their scalability. Due to space limitations, we primarily report on results where  $p_{on} = 1$ , i.e., peers only change their IP addresses but stay available, apart from some analytical results for the more general case of  $p_{on} \leq 1$ . As in the analysis, we do not consider the cost of establishing a quorum and refer the reader to [11].

For the underlying storage, we construct balanced P-Grid overlay networks of variable population sizes  $N = 128, 256, 512$ , and  $1,024$  peers. We set the average replication factor to 8 such that the paths have an average length of 4, 5, 6, and 7 ( $\log_2 n$ , where  $n = N/8$ ). At each depth of the

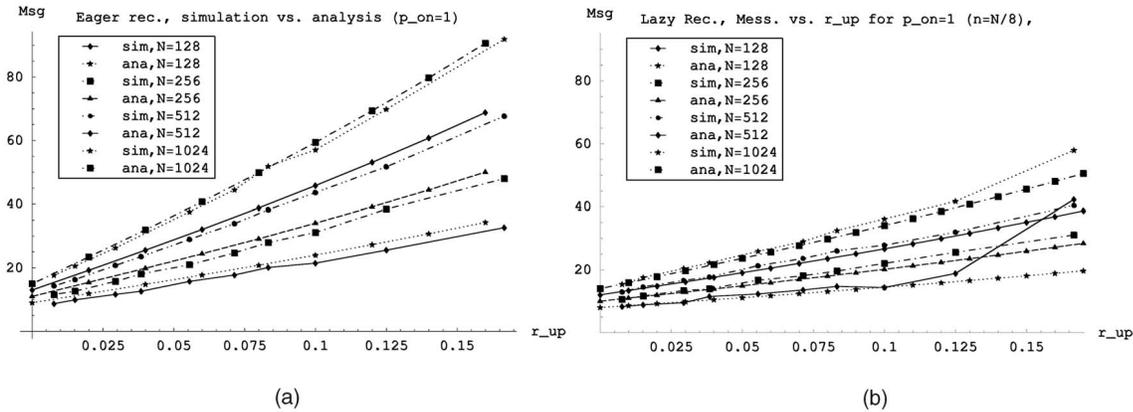


Fig. 3. Simulation results. (a) Messages versus  $r_{up}$ , eager algorithm. (b) Messages versus  $r_{up}$ , lazy algorithm.

routing tables we maintain  $r = 4$  references. The simulation is performed in rounds where, in each round, we issue a random query at a random peer with probability  $1 - r_{up}$  and, with probability  $r_{up}$ , we change the identity of a random peer and perform the necessary update. To reach a dynamic equilibrium state, we run a sufficiently large number of rounds (increasing from  $25N$  to  $100N$  for decreasing values  $r_{up}$ ) and take the mean over the last  $25N$  rounds to obtain values of the measured parameters.

For both the lazy and eager recursive query mechanisms, we could show that the performance of the simulated system matches the predicted performance very well. We summarize the results in Fig. 3, where we show the number of messages generated as a function of the frequency of updates, both when using the eager and the lazy algorithm.

We see that the message cost in the simulation is slightly higher than the predicted cost. This is due to the variation of the staleness of references. Since the message cost depends nonlinearly on the staleness, variations inevitably lead to an increase as opposed to our average case analysis.

We observe that, for the lazy algorithm for small  $N$  ( $N = 128$ ), the model starts to break down when the value of  $r_{up}$  grows. This is so because, for very small networks, combinatorial effects such as cycles and deadlocks, which are not accounted for in the analysis, start to take effect, thus making the model inaccurate. On the other hand, we see that for a larger network population, the predictions are increasingly accurate as is the case for any statistical model. The message cost scales gracefully. Thus, for large networks, our analytical model can be used to reliably predict its performance. We also observe that the lazy algorithm overall consumes slightly fewer messages than the eager algorithm.

Fig. 4 shows the analytical predictions and the observed  $p_{rec}$  values from simulations for varying  $r_{up}$ , which may also be used to verify the accuracy of the analytical model. For  $N = 128$ , the probability of recursion  $p_{rec}$  starts to increase dramatically, which also implies an increase in message cost, and the simulation results deviate from the analytical predictions. Even for moderately large network sizes ( $N = 256$  and higher), the results obtained from both simulations and analysis match well, which shows that the independence assumptions, and statistical results of the analysis are correct once the

system has a moderately large peer population. This is as expected from any statistical model.

We use the analytical model to further explore the properties of the system in dynamic equilibrium. In Fig. 5a, we show how  $N_{rec}$  varies with varying  $p_{on}$  for any  $r_{up}$  value when using lazy recursion. We observe that the algorithm is very robust and the message overhead is stable for a wide range of  $p_{on}$  values. This is so because, for lower  $p_{on}$  values, even fewer stale entries render the routing table unusable and trigger recursions. The intuitive expectation will thus be an increase in  $N_{rec}$ . However, such recursions also have the effect of quickly repairing the routing table such that fewer recursions are triggered later. These two opposite effects balance, hence, the wide stretch of  $p_{on}$  values where the overhead stays stable.

Fig. 5b shows how the overhead varies with increasing network dynamics (increasing  $r_{up}$ ), and we observe that it is more sensitive to  $r_{up}$  at lower  $p_{on}$  values.

While the use of recursion almost eliminates failures, tolerating even very low  $p_{on}$  values and moderately high network dynamics (high  $r_{up}$ ), the incurred effort may not be affordable in a realistic network. In Fig. 5c, we thus provide contour maps corresponding to  $N_{rec}$  values, with  $p_{on}$  in the X-axis and  $r_{up}$  in the Y-axis. The interpretation of the plot is that, if a system (participating peers) is willing to incur an  $N_{rec}$ -fold increase of effort per query with respect to the ideal case ( $p_{on} = 1$  and  $r_{up} = 0$ ), the network will operate for all  $p_{on}, r_{up}$  combinations below the curve, with the success probability being 1. If the system is unwilling to use more

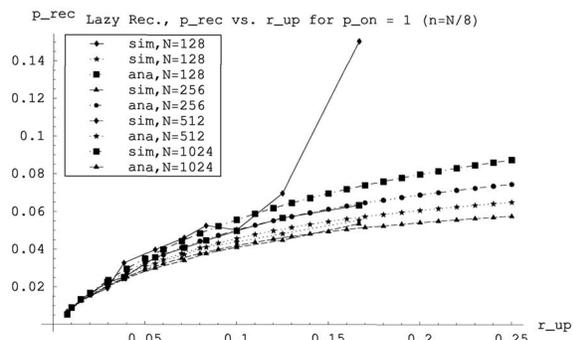


Fig. 4.  $p_{rec}$  versus  $r_{up}$ , lazy.

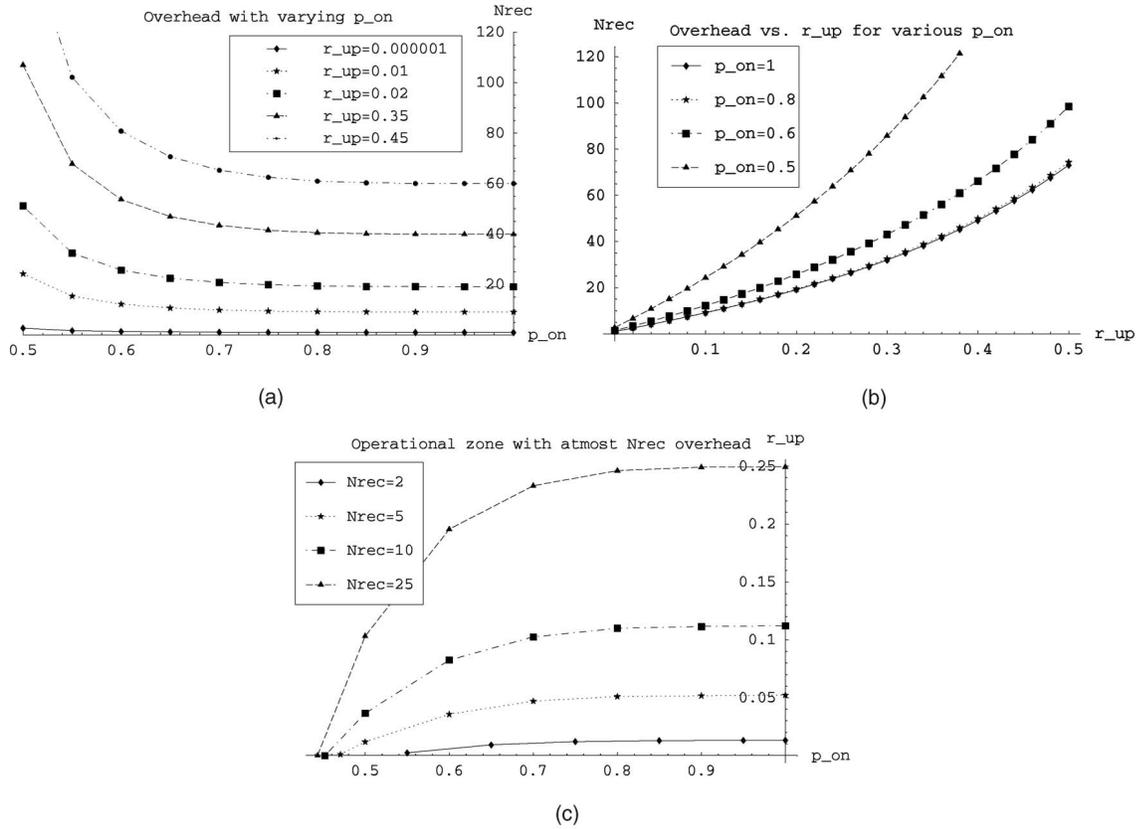


Fig. 5. Analytical results. (a)  $N_{rec}$  versus  $p_{on}$ . (b)  $N_{rec}$  versus  $r_{up}$ . (c) Contour maps for  $N_{rec}$ .

than  $N_{rec}$  effort and if the system operates in the region above the curves of Fig. 5c, there is a nonzero failure probability, which starts increasing with the increase of distance from the curve. Fig. 5c thus captures two important tradeoffs in the system. The first tradeoff is that of efficiency versus probabilistic success guarantee of queries. The second tradeoff is the system’s resilience against the two “demons” of the network, the network dynamics  $r_{up}$  versus average availability of peers in the network  $p_{on}$ .

Finally, we analyze the dependency on varying values of  $p_{on}$ . In Fig. 6, we show the number of messages for a fixed  $r_{up} = 0.2$  and path length 5. We see that, for networks with more peers being online, the lazy strategy is advantageous. The tradeoff is that the lazy strategy collapses earlier. Thus, the eager strategy is more resilient in the case of low availability. This suggests that combined adaptive strategies with various degrees of “eagerness” are an interesting approach for environments with varying online characteristics.

## 8 RELATED WORK

For unstructured P2P systems, such as Gnutella [9], and hierarchical systems, such as FastTrack-based (<http://www.fasttrack.nu/>) systems like Kazaa, dynamic IP addresses are less of a problem. For example, Gnutella builds an unstructured graph of peers in which each peer typically has four permanent connections to other peers. In the case that a connection drops, a peer simply tries to reconnect or tries to connect to another peer it has learned about implicitly through Gnutella’s routing process. Since no routing tables

are maintained, no inconsistencies can occur. However, this comes at the expense of very high network traffic. In hierarchical systems, “routing tables” (in fact, they are rather simple) can become inconsistent, but their scope is limited, so the effect can be compensated easily with existing methods.

Freenet [7], [8] suggests the use of a third-party DNS service that allows the peer to update its name-IP mapping in special DNS domains. However, this introduces a dependency on a third-party service and an element of centralization into the architecture which is in contrast to the principles of decentralization to ensure scalability.

The approaches of Chord [29], DKS [6], and Pastry [27] are the closest ones to ours and have already been discussed in detail and related to our work in Section 1. Their

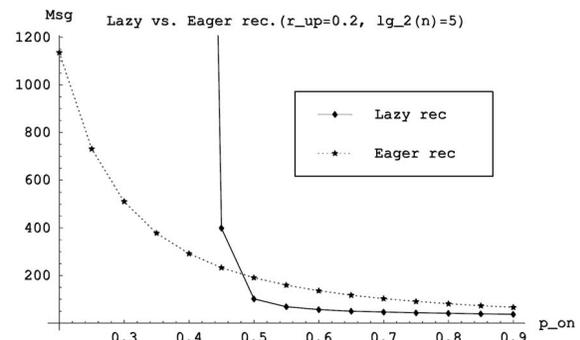


Fig. 6. Dependency on  $p_{on}$ .

approaches are complementary to our work and further comparative studies on their performance are required.

The approach presented in [15] extends Tapestry [30] to address the joining and leaving of peers. In the absence of self-healing, network maintenance is very expensive in this approach in terms of traffic (multicast-based partial flooding of the network) and there are no results on how the approach will cope with the degree of network dynamics ( $p_{on}$  and  $p_{dyn}$ ).

DNS's original specification was extended by several RFCs (RFC2136, RFC2846, RFC2535) so that, in theory, it could maintain dynamic IP addresses through secure nameserver updates. However, this is very heavyweight, requires very elaborate configurations, and is not intended for allowing a large number of peers to change the DNS database. Also, an alternative DNS-based approach presented in [16] is still way too heavy for P2P systems and does not address security and unique identity of peers. To some extent, our approach for recursive queries is similar to DNS's recursive lookup strategy which also updates caches during a name lookup. However, DNS's strategy is much simpler since DNS servers change their IP addresses very infrequently and, thus, the tree structure is basically static which simplifies routing a lot. Additionally, the number of participating DNS servers is considerably lower than the number of peers in a P2P system, the depth of the DNS tree is small, and, in contrast to DNS, our approach is self-contained, i.e., does not depend on a third-party infrastructure.

Other work using a DNS-like hierarchy without a single root has been done in the context of decentralized identification such that some peers authorize other peers to use particular resources they provide. Any peer can authorize other peers to use its local resources as well as possibly delegate the authority to authorize other peers to do so. Systems following this approach are [10] and [5] which are based on [29].

For security, we devise a self-organizing public key infrastructure [11] which is comparable to PGP [13] which uses a similar, decentralized approach. PGP uses transitivity of trust, whereby, if  $P_A$  trusts that  $K_B$  is  $P_B$ 's public key and also relies on  $P_B$  (personally determined) to certify a third party's public key, then  $P_A$  will use  $K_C$  as  $P_C$ 's public key if  $P_B$  certifies it. The strength of such chains is determined by its weakest link and, thus, is highly vulnerable. So, [25] suggests including multiple paths which, however, still offers only limited liability due to intersecting paths. Thus, additionally, authentication metrics [26] are required to quantify the reliability of such multiple paths. This approach, however, is heavyweight, for example, finding multiple paths loads the network considerably and both the multiple paths and the metrics need to be evaluated at each peer and, thus, the effort is not shared. In contrast to that, our approach does not suffer from these problems at all. In P-Grid, random (independent) peers replicate identity information (mappings) and, thus, our approach does not incur any costs in finding independent paths, the use of a quorum mitigates malicious behavior, and storage and search costs are distributed among the peers and require substantially

lower computing and network resources. Additionally, since a subset of peers (to which searches are routed efficiently) are responsible for a given key, it is also simple to revoke or update mappings, which is superior to PGP-based schemes. Further discussions are provided in [11].

## 9 CONCLUSIONS

This paper described a decentralized, self-maintaining, lightweight, and secure directory service based on secure identification. We have demonstrated that our algorithm is robust and applicable in unreliable environments such as current peer-to-peer systems and that it operates well, even if we assume low online probabilities. Our approach has five major contributions:

1. We separate identity from network properties and, thus, introduce the concept of logical independence into overlay networks,
2. We provide a general approach to identify entities and to bind arbitrary information to them,
3. We demonstrate that the approach does not corrupt structural properties of the used P2P system and retains existing knowledge and semantics,
4. We explicitly address security to guarantee the correctness of identities, and
5. We have explored a P2P system's dynamic resilience in the presence of changes in the underlying network in contrast to other works that have only addressed static resilience of P2P systems [14], [18].

The service is based on the P-Grid P2P system and applied in P-Grid itself to mitigate the problem of dynamic IP addresses. To prove the efficiency and applicability of our approach, we have provided an analytical model for the dynamic equilibrium case and have evaluated our algorithm based on this model. Additionally, we have provided simulation results to verify the correctness of the model. Our infrastructure offers a sufficient level of security—deliberately balancing costs against application requirements—by combining a PGP-like approach for circulating public keys with a quorum-based query scheme that provides robustness against cheating peers. The presented approach is self-maintaining since it requires only little manual configuration and then operates without requiring further explicit maintenance mechanisms since this is accomplished implicitly by using the network.

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## REFERENCES

- [1] K. Aberer, "P-Grid: A Self-Organizing Access Structure for P2P Information Systems," *Proc. Sixth Int'l Conf. Cooperative Information Systems (CoopIS)*, 2001.

[2] K. Aberer, A. Datta, and M. Hauswirth, "The Quest for Balancing Peer Load in Structured Peer-to-Peer Systems," Technical Report IC/2003/32, EPFL, 2003.

[3] K. Aberer and Z. Despotovic, "Managing Trust in a Peer-2-Peer Information System," *Proc. 10th Int'l Conf. Information and Knowledge Management (CIKM)*, 2001.

[4] K. Aberer, M. Hauswirth, M. Puceva, and R. Schmidt, "Improving Data Access in P2P Systems," *IEEE Internet Computing*, vol. 6, no. 1, 2002.

[5] S. Ajmani, D.E. Clarke, C.-H. Moh, and S. Richman, "ConChord: Cooperative SDSI Certificate Storage and Name Resolution," *Proc. First Int'l Workshop Peer-to-Peer Systems (IPTPS '02)*, 2002.

[6] L. Onana Alima, S. El-Ansary, P. Brand, and S. Haridi, "DKS(N,k,f): A Family of Low Communication, Scalable and Fault-Tolerant Infrastructures for P2P Applications," *Proc. Third IEEE/ACM Int'l Symp. Cluster Computing and the Grid (CCGRID)*, 2003.

[7] I. Clarke, T.W. Hong, S.G. Miller, O. Sandberg, and B. Wiley, "Protecting Free Expression Online with Freenet," *IEEE Internet Computing*, vol. 6, no. 1, 2002.

[8] I. Clarke, O. Sandberg, B. Wiley, and T.W. Hong, "Freenet: A Distributed Anonymous Information Storage and Retrieval System," *Proc. Designing Privacy Enhancing Technologies: Int'l Workshop Design Issues in Anonymity and Unobservability*, 2001.

[9] Clip2, The Gnutella Protocol Specification v0.4 (Document Revision 1.2), June 2001, [http://www9.limewire.com/developer/gnutella\\_protocol\\_0.4.pdf](http://www9.limewire.com/developer/gnutella_protocol_0.4.pdf).

[10] R. Cox, A. Muthitachoen, and R. Morris, "Serving DNS Using a Peer-to-Peer Lookup Service," *Proc. First Int'l Workshop Peer-to-Peer Systems (IPTPS '02)*, 2002.

[11] A. Datta, M. Hauswirth, and K. Aberer, "Beyond 'Web of Trust': Enabling P2P E-Commerce," *Proc. IEEE Conf. Electronic Commerce (CEC '03)*, 2003.

[12] A. Datta, M. Hauswirth, and K. Aberer, "Updates in Highly Unreliable, Replicated Peer-to-Peer Systems," *Proc. 23rd Int'l Conf. Distributed Computing Systems*, 2003.

[13] S. Garfinkel, *PGP: Pretty Good Privacy*. O'Reilly & Assoc., 1994.

[14] K. Gumjadi, R. Gumjadi, S. Ratnasamy, S. Shenker, and I. Stoica, "The Impact of DHT Routing Geometry on Resilience and Proximity," *Proc. ACM SIGCOMM*, 2003.

[15] K. Hildrum, J.D. Kubiawicz, S. Rao, and B.Y. Zhao, "Distributed Object Location in a Dynamic Network," *Proc. 14th Ann. ACM Symp. Parallel Algorithms and Architectures (SPAA)*, 2002.

[16] P. Huck, M. Butler, A. Gupta, and M. Feng, "A Self-Configuring and Self-Administering Name System with Dynamic Address Assignment," *ACM Trans. Internet Technology*, vol. 2, no. 1, 2002.

[17] D. Liben-Nowell, H. Balakrishnan, and D. Karger, "Analysis of the Evolution of Peer-to-Peer Systems," *Proc. 21 Ann. ACM Symp. Principles of Distributed Computing (PODC)*, 2002.

[18] D. Loguinov, A. Kumar, V. Rai, and S. Ganesh, "Graph-Theoretic Analysis of Structured Peer-to-Peer Systems: Routing Distances and Fault Resilience," *Proc. 2003 Conf. Applications, Technologies, Architectures, and Protocols for Computer Comm.*, 2003.

[19] R. Mahajan, M. Castro, and A. Rowstron, "Controlling the Cost of Reliability in Peer-to-Peer Overlays," *Proc. Second Int'l Workshop Peer-to-Peer Systems (IPTPS '03)*, 2003.

[20] M. Aris Ouksel and O. Mayer, "A Robust and Efficient Spatial Data Structure: The Nested Interpolation-Based Grid File," *Acta Informatica*, vol. 29, 1992.

[21] C.E. Perkins, B. Woolf, and S.R. Alpert, *Mobile IP Design Principles and Practices*. Prentice Hall PTR, 1998.

[22] C.G. Plaxton, R. Rajaraman, and A.W. Richa, "Accessing Nearby Copies of Replicated Objects in a Distributed Environment," *Proc. Ninth Ann. ACM Symp. Parallel Algorithms and Architectures (SPAA)*, 1997.

[23] A. Rao, K. Lakshminarayanan, S. Surana, R. Karp, and I. Stoica, "Load Balancing in Structured P2P Systems," *Proc. Second Int'l Workshop Peer-to-Peer Systems (IPTPS '03)*, 2003.

[24] S. Ratnasamy, P. Francis, M. Handley, R. Karp, and S. Shenker, "A Scalable Content-Addressable Network," *Proc. ACM SIGCOMM*, 2001.

[25] M.K. Reiter and S.G. Stubblebine, "Resilient Authentication Using Path Independence," *IEEE Trans. Computers*, vol. 47, no. 12, Dec. 1998.

[26] M.K. Reiter and S.G. Stubblebine, "Authentication Metric Analysis and Design," *ACM Trans. Information and System Security*, vol. 2, no. 2, 1999.

[27] A. Rowstron and P. Druschel, "Pastry: Scalable, Distributed Object Location and Routing for Large-Scale Peer-to-Peer Systems," *Proc. IFIP/ACM Int'l Conf. Distributed Systems Platforms (Middleware)*, 2001.

[28] *Big Book of IPv6 Addressing RFCs (Big Book)*, P.H. Salus, ed. Morgan Kaufmann, 2000.

[29] I. Stoica, R. Morris, D. Karger, F. Kaashoek, and H. Balakrishnan, "Chord: A Scalable Peer-To-Peer Lookup Service for Internet Applications," *Proc. ACM SIGCOMM*, 2001.

[30] B.Y. Zhao, J.D. Kubiawicz, and A. D. Joseph, "Tapestry: An Infrastructure for Fault-Tolerant Wide-Are Location and Routing," Technical Report UCB/CSD-01-1141, University of California, Berkeley, 2001.



**Karl Aberer** received the PhD degree in mathematics in 1991 from the ETH Zürich. He has been a full professor at EPFL since September 2000, where he heads the Distributed Information Systems Laboratory of the School of Computer and Communications Sciences. His main research interests are in distributed information management, P2P computing, semantic Web, and the self-organization of information systems. From 1991 to 1992, he was a postdoctoral fellow at the International Computer Science Institute (ICSI) at the University of California, Berkeley. In 1992, he joined the Integrated Publication and Information Systems institute (IPSI) of GMD in Germany, where he became manager of the research division Open Adaptive Information Management Systems in 1996. He has published more than 80 papers on data management on the WWW, database interoperability, query processing, workflow systems, and P2P data management. Recently, he was PC chair of ICDE 2005, DBISP2P 2003, RIDE 2001, DS-9, and ODBASE 2002. He is an associate editor of *SIGMOD RECORD* and a member of the editorial boards of the *VLDB Journal* and *Web Intelligence and Agent Systems*. He is a member of the IEEE and the IEEE Computer Society.



**Anwitaman Datta** received the BTech degree in electrical engineering from the Indian Institute of Technology (IIT Kanpur). He is a research assistant in the Distributed Information Systems Laboratory at the Swiss Federal Institute of Technology in Lausanne (EPFL). Prior to joining EPFL, he worked at Transwitch India as an associate member of the technical staff. He is currently pursuing a PhD degree under the supervision of Professor Karl Aberer.

His research interests include peer-to-peer systems, ad hoc networks, epidemic algorithms and self-organization, and resilience of decentralized systems. He is a member of the National Competence Center in Research on Mobile Information and Communication Systems (NCCR-MICS).



**Manfred Hauswirth** received the MS and the PhD degrees in computer science from the Technical University of Vienna in 1994 and 1999, respectively. He has been a senior researcher in the Distributed Information Systems Laboratory at the Swiss Federal Institute of Technology in Lausanne (EPFL) since January 2002. Prior to his work at EPFL, he was an assistant professor in the Distributed Systems Group at the TU Vienna where he still lectures courses on distributed systems. His main research interests are in peer-to-peer systems, distributed information management, self-organizing systems, semantic Web, and security in distributed systems. He has published numerous papers and coauthored a book on distributed software architectures. He has served on numerous program committees of international scientific conferences and is a member of the IEEE, the IEEE Computer Society, and the ACM.

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