

# OPENBAZAAR: AN ONLINE PEER-TO-PEER MARKET

Kevin Chen '15

Aaron Taylor '16

## 1 Introduction

In October 2013, the FBI was able to shut down the Silk Road, an online black market, with the seizure of a single server. To circumvent the problem of a single point of failure, the winners of a hackathon recently unveiled a proof-of-concept for a peer-to-peer version of the Silk Road.

Known as OPENBAZAAR (formerly the Dark-Market), this service incorporates many of the same user experience paradigms as its predecessor: private communication between buyers and sellers, HTML pages to view sellers' wares, a reputation system for ratings and reviews, and an arbiter-escrow feature that ensures a "fair" outcome when deals go sour. Each piece of the system is covered with layers of encryption, based on the bitcoin protocols and elliptic curve cryptography, to ensure that all communications are secure, all transactions are properly mediated, and all identities are correctly verified. Still nascent, OPENBAZAAR has yet to implement several features that would enable the service to enter production mode and be delivered to users.

As the current system currently stands, in order for a seller to maintain a page, they basically need to maintain an active server with a fixed IP address that other users of the network can connect to in order to view their product offerings and initiate transactions. This is less than ideal for a number of reasons.

What has led to the success of other online marketplace systems – such as eBay, Craigslist, and even the Silk Road – is the ease with which users can post items for sale and order items from other sellers. The current system has a large amount of setup due to the direct peer-to-peer nature of the system.

We want to emulate the convenience and simplicity of an environment hosted on a central server within the peer-to-peer network. We work on achieving this by replicating user sites across the network using a distributed hash table (DHT).

In order for this system to work, the data for a seller's marketplace and ratings has to satisfy the following conditions: it must be replicated across several nodes, it must maintain its integrity and be mutable only by the seller/publisher, and it must be

quickly accessible by the users of the system.

We intend to implement a system of replication that brings two main advantages. First, it allows users the convenience of not having to keep their server up constantly if they want buyers to see their wares. Second, it increases availability: in the event that a seller's machine or otherwise needs to go offline, his or her marketplace is being hosted by other nodes in the P2P network.

Replication also has two downsides. First, we must ensure that when Bob requests data for Alice's market, he receives the most up-to-date version of her market. We address the challenge of synchronization later. Second, replication disincentivizes users from maintaining their servers. That is, what is to stop Bob from powering down or disconnecting his machine with great frequency if Alice is hosting his marketplace for him? We address this problem by giving users with greater hosting uptime in the network certain perks and community incentives, such as paying smaller commissions to the third party arbiter during transactions, and positive or negative indicators in the reviews section attached to each user.

The rest of this paper is structured as follows. Section 2 describes how the OPENBAZAAR ecosystem works at a high level between sellers, buyers and arbiters. Section 3 provides an overview on DHTs and KADEMLIA, our DHT of choice. Section 4 briefly describes ENTANGLED, the actual

Python implementation of KADEMLIA we use. Section 5 explains the challenges faced when trying to balance replication and synchronization, and how both might be achieved with ENTANGLED. Section 6 gives an account of the struggles experienced during implementation, all the trials and tribulations of making several gargantuan libraries work in harmony. Section 7 reports on how we might assess how effective ENTANGLED's replication strategy is on availability, and on how we might evaluate its level of synchronization. Section 8 concludes.

## 2 How it works

A user downloads the market software, which runs a daemon in the background and allows a user to become a node in a distributed network with a P2P library known as ZeroMQ, or ØMQ.

For Alice to become a seller, she can edit an HTML file designated as her seller page. Then a buyer like Bob can browse the market, which he runs via web browser. Bob can search for a user's nickname or click on another user's node.<sup>1</sup>

If Bob sees something he wants to buy, he sends a message to Alice. If Alice wishes to engage in trade, an arbiter must be selected to settle disputes in the event that the deal falls through. An arbiter may be selected from overlap between Alice's and

---

<sup>1</sup>At the moment, there is no functionality for searching for user nicknames, and there is a lack of anonymity since Bob must click on Alice's bare IP address if he wishes to view her wares.

Bob’s list of approved arbiters, or randomly if their lists don’t intersect.

Having selected an arbiter, the system creates a new “multisignature” Bitcoin address from the three users’ public encryption keys. During the duration of the transaction, this Bitcoin address holds the buyer’s money in escrow. The transaction is complete when two out of the three parties agree on where the money should go. If everything goes smoothly and the product is shipped to the buyer, both buyer and seller sign a transaction to move the bitcoins out of escrow and into the seller’s account. If the product is defective or never ships, the arbiter must step in.

Finally, each participant rates all other participants. Ratings are cryptographically signed with the rater’s private key, which prevents users from forging reviews. Sellers with better ratings will naturally attract more buyers.

### 3 Architectural Overview

The OPENBAZAAR repository is incipient but constantly being updated. Currently, the only supported features are the ability to connect to the distributed marketplace and the ability to view your market in the browser; transactions, ratings, and arbitrations are not possible. Furthermore, the data for the marketplace is stored persistently with a user-created MongoDB database. However, we would like to en-

sure the availability of every user’s marketplace by spreading out data. This is done with a distributed hash table (DHT), which provides fault tolerance, scalability, and decentralized autonomy.

#### 3.1 What is a DHT?

A DHT is just a distributed dictionary; that is, hash table buckets are nodes across a network. Just like any other lookup service, it maps keys to values. In this case, the keys are hashed files or hashed file locations, and the values are the files themselves. That is, given some key  $k = \text{hash}(\text{filename})$ , the DHT should be able to figure out which node hosts *filename*, thereby allowing other nodes to request that specific file. This is shown in Figure 1.

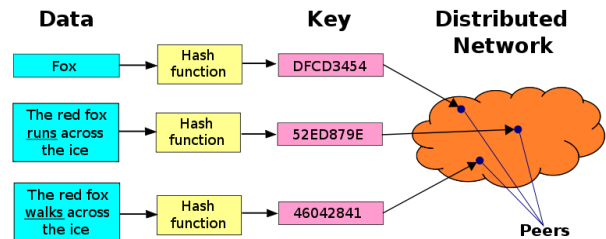


Figure 1:

So how do we map  $\text{hash}(\text{filename})$  to an actual node? In most DHTs, each node has a 160-bit identifier that determines which potential keys each node owns.<sup>2</sup> Specifically, a node  $n$  owns a key  $k$  if  $n$  is the closest node to  $k$ . “Nearness” is computed by a distance function  $\delta(k, n)$ , which varies depending

<sup>2</sup>Keys and node IDs are 160 bits for consistency with the SHA-1 hash function. Nothing stops us from using a different hash function.

on the DHT.

When deploying a distance function, one of the main considerations is load balancing. Ideally, the keyspace is partitioned evenly between all the nodes in the network, so one node doesn't store more keys than another. If this is not the case, then that node can get bogged down, and the entire system will suffer in performance.

This form of consistent hashing ensures that when a node is added or removed from a system, only the keys owned by adjacent nodes are changed. When a node joins the system, it takes responsibility for some of its neighbor's keys. When a node crashes or leaves the system, the keys mapping to the data it held must be allocated to new nodes. Moreover, the more nodes are in a system, the fewer keys have to be remapped on every node entry or exit. In general, consistent hashing makes the DHT more tolerant to *node churn*. This is yet another advantage a DHT holds over a traditional hash table, which remaps its entire keyspace when a bucket is added or removed.

## 3.2 Why Kademlia?

### 3.2.1 Unique Features

There are many different kinds of DHTs out there. They differ in the size of their address space (128- or 160-bit keys?), in the type of hash function is used (SHA-1, SHA-2, etc.), in what gets hashed to pro-

duce keys (file names, file contents, etc.), in redundancy and reliability (nodes can dynamically agree to store the same key, just in case one of them crashes), in the way traffic is routed, and in many other ways.

We opt for the KADEMLIA DHT, which has several unique features. First, it requires minimal configuration. When a node wants to join a network, little else is required of it than to perform a self-lookup. By performing a query, the requester becomes aware of all the nodes that exist between it and the request's intended recipient.

Second, this frequently updated awareness affords nodes the ability to route their queries through low-latency paths. And although knowledge spreads like the plague, there is a natural defense against denial of service attacks, since a node can only know about a limited number of other nodes.

Third, not only can KADEMLIA nodes select low-latency routes, but they can also send parallel asynchronous queries to avoid timeout delays.

Fourth, KADEMLIA features unidirectional routing, as opposed to bidirectional routing. All node lookups and value lookups are guaranteed to converge on the same path, regardless of the requester. Thus, caching  $\langle \text{key}, \text{value} \rangle$  pairs along a path will reduce latency. Unidirectionality is a consequence of using a symmetric distance function, namely *bitwise exclusive or* (XOR). That is, the distance function is denoted by  $\delta(x, y) = x \oplus y$ , and its property of

symmetry is denoted by  $\delta(x, y) = \delta(y, x)$ .<sup>3</sup>

### 3.2.2 Node State

Each KADEMLIA node stores a list for every bit in the address space, in this 160. Think of these lists as a node's contacts or peers, and each element in the list stores a peer's IP, port, and node ID. For  $0 \leq i < 160$ , list  $i$  stores peers whose distance falls within the interval  $[2^i, 2^{i+1})$ . That is, the 0<sup>th</sup> list stores peers that are 1 away; the 1<sup>st</sup> list, peers that are 2 or 3 away; the 2<sup>nd</sup> list, peers that are 4, 5, 6, or 7 away; and so on.

Another characteristic of these lists is that all the nodes in the  $i^{\text{th}}$  list share the same  $159 - i$  most significant bits of their node IDs. For instance, if node  $n_1$  is one unit away from node  $n_2$  – denoted by  $n_1 \oplus n_2 = 1$  – then the identifiers of  $n_1$  and  $n_2$  share all but the least significant bit, by definition of XOR.

Figure 2 shows the general structure of the network. Nodes are viewed as leaves in a binary tree. The gray ovals form the peer lists for node 6 (colored in black). The 2<sup>nd</sup> peer list excludes node 3, which is not in the network.

These lists are known as  $k$ -buckets. The peers inside each  $k$ -bucket are ordered by how recently they were seen, with the most recent encounters at the tail. For small values of  $i$ , the  $k$ -buckets

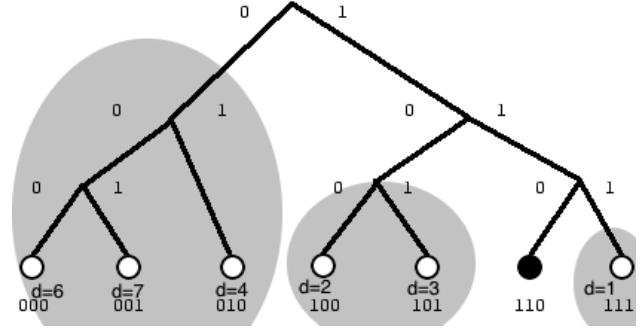


Figure 2: Nodes are leaves.  $k$ -buckets are increasingly large neighborhoods/subtrees.

are probably going to be empty. That is, the 0<sup>th</sup>  $k$ -bucket, which stores the peer that is one away, is almost certainly going to be empty; this is because the keyspace is so large that we will rarely see  $k_1 \oplus k_2 = 1$ . In layman terms, nodes are going to be spread out, so the  $k$ -buckets that can store a wider range of nodes are more likely to be filled.

However, there is a limit to how large a  $k$ -bucket can get: that limit is determined by a system-wide parameter,  $k$ . Every time a node receives a request or reply, it updates its  $k$ -bucket for the sender. If the sender is already in the appropriate  $k$ -bucket, it moves to the tail of the list. If there are fewer than  $k$  entries in the bucket, the sender moves to the tail as well. If the bucket is full, then the recipient node pings the least-recently seen node at the head of the list and waits for a response; if no response comes, the sender node is inserted at the list tail; but if the least-recently seen node responds, then it moves to the list tail and the sender node is discarded.

This least-recently seen eviction policy has two

<sup>3</sup>In KADEMLIA, the distance between two nodes is computed by taking the XOR of their two node IDs.

main advantages. First, it is a natural defense against flooding attacks, like DDoS, since the  $k$ -buckets are capped in size. Second, the preference for old contacts has been empirically shown to have availability benefits: the longer a node has been up, the more likely it is to stay up for another hour.

### 3.2.3 Protocol

The KADEMLIA protocol is comprised of four main RPC calls: PING, STORE, FIND\_NODE, and FIND\_VALUE.

The PING RPC checks to see if a node is online and, as previously mentioned, is used when a  $k$ -bucket is full and a node wants the status of the least-recently seen peer in that bucket.

STORE tells a node to store a  $\langle \text{key}, \text{value} \rangle$  pair.

The FIND\_NODE RPC takes a 160-bit node ID as an argument and returns the  $k$  nodes that are closest to the target ID. FIND\_VALUE works much like FIND\_NODE, except the recipient of a FIND\_VALUE RPC will return a stored value if it has received a STORE RPC for the key.

Underlying these RPCs is the most important and most complex operation in KADEMLIA: node lookup. This entails locating the  $k$  nodes closest to a given node ID. For instance, node lookup is used in the STORE RPC for replication: when a  $\langle \text{key}, \text{value} \rangle$  pair is stored at a particular target node, it is also stored at the  $k$  closest peers of that target node.

Node lookup works in the following way: The

lookup initiator starts by picking  $\alpha = 3$  nodes from its closest non-empty  $k$ -bucket (remember that the closest  $k$ -buckets will probably be empty) and then sends parallel, asynchronous FIND\_NODE RPCs to the  $\alpha$  nodes. Following those FIND\_NODE RPCs, the initiator will become privy to new nodes and can query those. If a round of queries does not return a single node closer to the target node, then the initiator queries nodes that have not already been queried. The lookup ends when it can find nothing closer and when the  $k$  closest nodes have all responded.

More importantly, the KADEMLIA protocol has replication built into its DNA. First, nodes must republish their  $\langle \text{key}, \text{value} \rangle$  pairs on the hour. Second, entries will expire after 24 hours to limit stale data. Finally, when node  $a$  encounters another node  $b$  that is closer to some of  $a$ 's  $\langle \text{key}, \text{value} \rangle$  pairs,  $a$  replicates them over to  $b$ . In short, the marketplace is kept fresh and up to date.

## 4 Entangled API

We use ENTANGLED, a DHT written in Python that builds off of KADEMLIA.

The main object we use is ENTANGLEDNODE, which is basically a KADEMLIA node but with a few more non-standard RPCs, such as DELETE.

KADEMLIA nodes feature the four RPCs – PING, STORE, FIND\_VALUE, and FIND\_NODE – as well as methods to join the network and to republish and

expire data. Each KADEMLIA node stores a routing table, which includes methods to add, remove, and find node contacts. Additionally, the routing table has a method to find all the  $k$ -buckets that need refreshing and a method to update the “last accessed” timestamp of the  $k$ -bucket that covers the range containing a specified key argument.

## 5 Design Challenges

### 5.1 Replication

How much replication is enough data? Suppose there are 100 users in the OPENBAZAAR network. There must be some  $\omega < 100$  for which if we replicate Alice’s data onto  $\omega$  other nodes, we can ensure with sufficiently high probability that Alice’s marketplace will be available “virtually” all the time.

Optimal replication strategies have been explored in [2]. Fortunately, KADEMLIA itself is designed to handle this problem. As previously stated, nodes republish  $\langle \text{key}, \text{value} \rangle$  pairs each hour, entries expire after 24 hours, and data is replicated onto any nodes encountered that are closer to the data’s key.

The ENTANGLED implementation of these features is less clear, however. It can be gleaned from ENTANGLED’s example program that some sort of replication mechanism is at play, as seen in Figure 3.

Indeed, just as the KADEMLIA paper describes, the ENTANGLED node implementation periodically performs  $k$ -bucket refreshes, which entails repub-

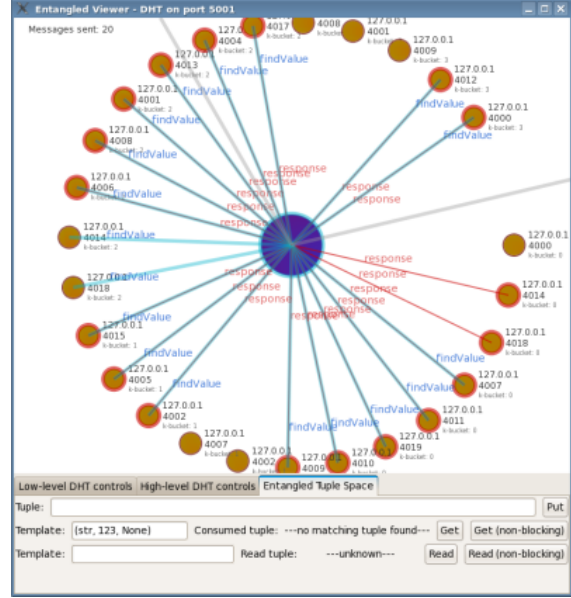


Figure 3: Multiple nodes respond to a FIND\_VALUE query.

lishing and replicating the data as necessary.

### 5.2 Synchronization

There is a natural tradeoff between replication and synchronization. The more replicas a system has, the more effort it must expend in keeping those replicas up-to-date.

Fortunately, the ENTANGLED datastore objects have several methods that are conducive to data consistency: they know when a  $\langle \text{key}, \text{value} \rangle$  pair was last published and originally published, as well as the node ID of the original publisher. Having access to when an entry was last published is critical to synchronization, as it is now possible to implement a “take the most recent” scheme. Of course, this is not without its pitfalls – clock skew and clock drift – but their circumvention is beyond the scope of this

paper.

## 6 Implementation

Our implementation of this system began with reading through the source code and limited documentation of the various pieces of what was to be in our final system and understanding how each of the pieces worked and interacted. Running the actual server for the nodes is an implementation called TORNADO, that handles the creation of a webserver and the majority of the transport layer. The OPENBAZAAR P2P interactions run on a network library called ZeroMQ (ØMQ) that handles most of the peer-to-peer setup and network maintenance between the nodes in the system. The system is designed fairly sensibly, with the various cryptographic components separated out into separate modules from the core market interactions. The website itself is accessed through a browser, typically at `localhost:8888`, and is a fairly straightforward HTML and javascript site that allows for updates to your own market and provides a GUI for interaction with other sites in the network.

### 6.1 Current Implementation

The current implementation is evolving rapidly with contributions from the open-source community, but the basic structure of the codebase has remained relatively the same. The majority of the market inter-

actions are implemented in the node folder. Files within here create the various networking components, including event handlers and protocol implementations, that allow the market to function on its lowest layer.

### 6.2 Additions

created `launch.py` script to create a command-line interface. modified `tornadoloop.py` to handle creation of the ENTANGLED node, modified the implementation of the main eventloop to use both `zeromq` and ENTANGLED modified `market.py` to replace peer-to-peer market functionality with called to the ENTANGLED node and network on both the sending and receiving end. some code deemed unnecessary due to this change

### 6.3 Issues

#### 6.3.1 Understanding the codebase

The first major issue we had was understanding a large, growing, poorly documented OPENBAZAAR codebase. Even as we were reading, new commits were being made to the repository on a daily basis. Reading every line of code would have been a hassle, so we first determined what each high-level module did, and then delved into the most important folders. We avoided in-depth readings of the low-level cryptographic implementations, focusing just on the method headers, and worked towards a



summary understanding of the peer-to-peer interactions of the existing system. We spent most of our time on the market interactions where we would be implementing our desired functionality.

In this manner, we were able to make sense of a codebase tens of thousands of lines long to implement our own functionality within it. The methodology we found useful was finding a starting point, in our case the launch point for the application, and then following the method calls and initializations to understand the connections between the various pieces of the program.

### 6.3.2 Conflicting Systems

Once we had gotten over the hurdle of understanding the functions of various components of the existing codebase, it was not too difficult to figure out how to utilize the ENTANGLED APIs to create the desired functionality. The function calls provide straightforward ways to publish, remove, and retrieve data from the network. However, out of the box, the ENTANGLED implementation used a different networking engine than the rest of the OPENBAZAAR project. Thus, we were left with a chaotic snafu created by two clashing Python networking libraries.

The root of our main problem was that two network event listening loops were trying to run on the same main thread: this is not possible. On the one hand, OPENBAZAAR was running a loop from

the TORNADO library, which handled all its incoming requests and outgoing messages. On the other hand, ENTANGLED nodes handled their network interactions with an object called REACTOR from the TWISTED Python module.

ENTANGLED does not provide documentation on which TWISTED components are required for an ENTANGLED node to function. In the ENTANGLED library's example programs, the only visible use of the TWISTED library is unrelated to the DHT, and involves the direct connections in the application-specific function of file sharing.

For this reason, we initially assumed the REACTOR was unnecessary for just running the DHT. In hindsight, it makes sense that the nodes need an event listener, and overlooking that fact was due to both my relative inexperience in Python and a lack of specificity in the ENTANGLED documentation.

However, that merely brought me back to the same issue that had led to the removal of that line of code in the first place. My initial plan was to run one of the event loops in the separate thread. However, because of the way signals from the operating system are handled in Python, both of the loops demand to be run in the main thread, and produce a variety of error messages to this effect if you try to implement them in a manner otherwise. Additionally, due to the interconnected nature of the ENTANGLED node and the market node, running one in a separate process would just have made a bad

situation worse, with extra layers of complexity necessitated for inter-process communication.

### 6.3.3 Conflict Resolution

After somewhat of a logjam, we dove into the sourcecode for the TORNADO and TWISTED libraries, looking for any commonality in the event loops that could be exploited. As it turns out, we were not the first to have this problem, and buried within the configuration options for TORNADO were two options for bridges between the TWISTED REACTOR *event loop* and the TORNADO *IOloop*. One of these replaced the built-in TORNADO *IOloop* with the TWISTED REACTOR and re-implemented the TORNADO *IOloop* API onto the resulting TWISTED REACTOR. This allowed for the ENTANGLED nodes to interact with the underlying REACTOR, and for the rest of the existing application to interface with the TORNADO API built on top of it.

It was a relief to see this solution work, allowing the ENTANGLED nodes to connect to one another and effectively combining the two separate nodes in the previous conception of the system into a single one, running on the same event loop in the same thread.

After this solution was found, a few details remained to be ironed out with out untested implementation of the ENTANGLED node interactions through API calls. ENTANGLED encodes the data

passed into the DHT...

## 7 Evaluation

### 7.1 Evaluating availability

As mentioned in Subsection 5.1, there must some optimal amount of nodes to which the system can replicate a  $\langle \text{key}, \text{value} \rangle$  pair and guarantee the pair's availability nearly all the time. To test replication's effect on availability, we could launch a network with  $n$  nodes. Then, after some time, we could crash  $\gamma < n$  nodes and perform a `FIND_VALUE(key)`. If the `FIND_VALUE` request does not return the correct value, then this "availability test" fails. To fairly assess the system, we would run a sufficient number of "availability tests."

### 7.2 Evaluating synchronization

## 8 Conclusion

### 8.1 Outside Work

Interestingly, while we have been implementing our fork of this project, the person who has taken over primary development of project on GitHub has begun some limited work on implementing a version of the KADEMLIA DHT. The branch on GitHub is fairly limited, currently containing an implementation of the KADEMLIA Datastore and a few placeholders for where future code may go, but the similarity in our ideas is interesting.

## 8.2 Lessons learned

Over the course of this work, we learned several lessons. First, working with large codebases is surprisingly approachable after a steep initial learning curve. Second, using libraries can be powerful but treacherous, as we saw with our conflict between ENTANGLED and TORNADO. Third, a DHT with a good API can provide very useful functionality in a peer-to-peer system. Fourth, our efforts have been validated by similar work in the open-source project. Fifth, we are super hackers, even more so now than before. Lastly, a huge thanks to Jeannie – you’re the best.

## References

- [1] Petar Maymounkov, and David Mazières, *Kademlia: A Peer-to-peer Information System Based on the XOR Metric*, 2002.
- [2] Edith Cohen, and Scott Shenker, *Replication strategies in unstructured peer-to-peer networks*. New York, NY, 2002.