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# Benchmarking Personal Cloud Storage

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## ABSTRACT

Personal cloud storage services are data-intensive applications already producing a significant share of Internet traffic. Several solutions offered by different companies attract more and more people. However, little is known about each service capabilities, architecture and – most of all – performance implications of design choices. This paper presents a methodology to study cloud storage services. We apply our methodology to compare 5 popular services, revealing different system architectures and capabilities. The implications on performance of different designs are assessed executing a series of benchmarks. Our results show no clear winner, with all services suffering from some limitations or poor implementations. In some scenarios, the upload time of the same file set can take seven times more, wasting twice as much capacity. Our methodology and results are useful thus as both benchmark and guideline for system design.

## Categories and Subject Descriptors

C.2 [Computer-Communication Networks]: Miscellaneous; C.4 [Performance of Systems]: Measurement Techniques

## General Terms

Measurement, Performance

## Keywords

Cloud Storage, Internet Measurement.

## 1. INTRODUCTION

Personal cloud storage services allow to synchronize local folders with servers in the cloud. They have gained popularity, with companies offering significant amounts of remote storage for free or reduced prices. More and more people are being attracted by these offers, saving personal files, synchronizing devices and sharing content with great simplicity. This high public interest pushed various providers to enter the cloud storage market. Services like Dropbox, SkyDrive and Google Drive are becoming pervasive in people's routine. Such appli-

cations are data-intensive and their increasing usage already produces a significant share of Internet traffic [3].

Previous results about Dropbox [3] indicate that design and architectural choices strongly influence service performance and network usage. However, very little is known about how other providers implement their services and the implications of different designs. This understanding is valuable as a guideline for building better performing services that wisely use network resources.

The goal of this paper is twofold. Firstly, we investigate how different providers tackle the problem of synchronizing people's files. For answering this question, we develop a methodology that helps to understand both system architecture and client capabilities. We apply our methodology to compare 5 services, revealing differences on client software, synchronization protocols and data center placement. Secondly, we investigate the consequences of such designs on performance. We answer this second question by defining a series of benchmarks. Taking the perspective of users connected from Europe, we benchmark each selected service, highlighting differences manifested in various usage scenarios.

Our results extend [3], where Dropbox usage is analyzed from passive measurements. In contrast to our previous work and [12, 16] that focus on a specific service, this paper compares several solutions using active measurements. The results in [3] are used to guide our benchmarking definition. The authors of [11] benchmark cloud providers, but focusing only on server infrastructure. Similarly to our goal, [9] evaluates Dropbox, Mozy, Carbonite and CrashPlan. Motivated by the extensive list of providers, we first propose a methodology to automate the benchmarking. Then, we analyze several synchronization scenarios and providers, shedding light on the impact of design choices on performance.

Our results reveal interesting surprises, from poor design choices, to unexpected drop in performance in common scenarios. Overall, the lesson learned is useful to improve design choices and performance. All results and our benchmarking tool will be available to the public to compare results from different locations and to extend the number of tested services.

## 2. METHODOLOGY AND SERVICES

This section describes the methodology we follow to design benchmarks to check capabilities and performance of personal storage services. We use active measurements relying on a testbed composed of two parts: i) a *test computer* that runs the application-under-test in the desired operating system; and ii) our *testing application*. The testing application can run either in the same test computer or in a separate one provided that it can intercept traffic from the test computer. Virtual machines can be used too, e.g., by running the test computer as a virtual host in a controller host. We used this latter setup in this paper.

Our testing application receives as input benchmarking parameters describing the sequence of operations to be performed. The testing application acts remotely on the test computer, generating specific workloads in the form of file batches, which are manipulated using a FTP client. Files of different types are created or modified at run-time, e.g., text files composed of random words from a dictionary, images with random pixels, or random binary files. Generated files are synchronized to the cloud by the application-under-test and the exchanged traffic is monitored to compute performance metrics. These include the amount of traffic seen during the experiments, the time before actual synchronization starts, the time to complete synchronization, etc.

### 2.1 Architecture and Data Centers

The used architecture, data center locations and data center owner are important aspects of personal cloud storage. They have both legal and performance implications. To identify how the analyzed services operate, we observe the DNS name of contacted servers when i) starting the application; ii) immediately after files are manipulated; and iii) when the application is in idle state. For each service, a list of contacted DNS names is compiled.

To reveal all IP addresses of the front-end nodes used by a service, DNS names are resolved to IP addresses by contacting more than 2,000 open DNS resolvers spread around the world.<sup>1</sup> In fact, cloud services rely on the DNS to distribute workload, returning different IP addresses according to the originating DNS resolver [2].

The owners of the IP addresses are identified using the `whois` service. For each IP address, we look for the geographic location of the server. Since popular geolocation databases are known to have serious limitations regarding cloud providers [14], we rely on a hybrid methodology that makes use of: i) informative strings (i.e., International Airport Codes) revealed by reverse DNS lookup; ii) the shortest Round Trip Time (RTT) to PlanetLab nodes [15]; and iii) active `traceroute` to

<sup>1</sup>The list has been manually compiled from various sources and covers more than 100 countries and 500 ISPs.

spot the closest well-known location of a router. Previous works [2, 5] indicate that these methodologies provide an estimation with about a hundred of kilometers of precision, which is sufficient for our goals.

### 2.2 Checking Capabilities

Our previous work [3] shows that personal storage applications can implement several capabilities to optimize storage usage and to speed up transfers. These capabilities include the adoption of *chunking* (i.e., splitting content into a maximum size data unit), *bundling* (i.e., the transmission of multiple small files as a single object), *deduplication* (i.e., avoiding re-transmitting content already available on servers), *delta encoding* (i.e., transmission of only modified portions of a file) and *compression*.

For each case, a specific test has been designed to observe if the given capability is implemented. We describe each test directly in Sect. 4. In summary, our testing application produces specific batches of files that would benefit from a capability. The exchanged traffic is analyzed to determine how the service operates.

### 2.3 Benchmarking Performance

After knowing how the services are designed in terms of both data center locations and system capabilities, we check how such choices influence synchronization performance and the amount of overhead traffic.

In total, we perform 8 experiments in which files of different sizes and formats are synchronized. Each experiment is repeated 24 times per service, allowing at least 5 minutes between experiments to avoid creating abnormal workloads to servers. The benchmark of a single storage service lasts for about 1 day.

### 2.4 Tested Storage Services

We focus on 5 services in this paper for the sake of space, although our methodology is generic and can be applied to any other service. We restrict our analysis to native clients, since our previous results show that this is the largely preferred means to use these services.

Dropbox [4],<sup>2</sup> Google Drive [6] and SkyDrive [13] are selected because they are among the most popular offers, according to the volume of search queries containing names of cloud storage services on Google Trends [8]. Wuala [10] is considered because it is a system that offers encryption at the client-side. We want to verify the impact of such privacy layer on synchronization performance. Finally, we include Cloud Drive [1] to compare its performance to Dropbox, since both services rely on Amazon Web Services (AWS) data centers.

A Linux box is used both to control the experiment and to host the virtual machine running the test com-

<sup>2</sup>Exact tested versions and URLs for downloading can be found in the References.

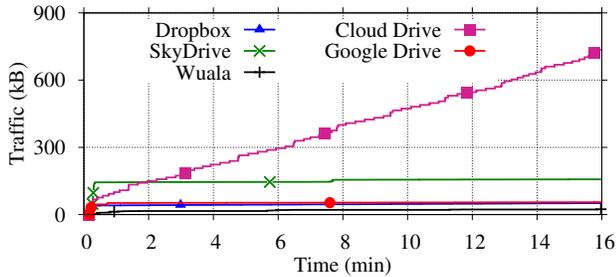


Figure 1: Background traffic while idle.

puter (Windows 7 Enterprise)<sup>3</sup>. Our testbed is connected to a 1GB/s Ethernet network at the University of Twente, in which the network is not a bottleneck.

### 3. SYSTEM ARCHITECTURE

#### 3.1 Protocols

All clients exchange traffic using HTTPS, with the exception of Dropbox notification protocol, which relies on plain HTTP. Interestingly, some Wuala storage operations also use HTTP, since users’ privacy has already been secured by local encryption.

All services but Wuala use separate servers for control and storage. Their identification is trivial by monitoring the traffic exchanged when the client i) starts; ii) is idle; and iii) synchronizes files. Both server names and IP addresses can be used to identify different operations during our tests. For Wuala, we use flow sizes and connection sequences to identify storage flows.

We notice some relevant differences among applications during login and idle phases. Fig. 1 reports the cumulative number of bytes exchanged with control servers considering the initial 16 min. Two considerations hold: Firstly, the applications authenticate the user and check if any content has to be updated. Notice how SkyDrive requires about 150 kB in total, 4 times more than others. This happens because the application contacts many different Microsoft Live servers during login (13 in this example). Secondly, once login is completed, applications keep exchanging data with the cloud. Wuala is the most silent, polling servers every 5 min on average, i.e., equivalent background traffic of about 60 b/s. Google Drive follows close, with a lightweight 40 s polling interval (42 b/s). Dropbox and SkyDrive use intervals close to 1 min (82 b/s and 32 b/s, respectively). The behavior of Amazon Cloud Drive is completely different: polling is done every 15 s, each time opening a new HTTPS connection. This consumes 6 kb/s, i.e., about 65 MB per day! This information is relevant, for instance, to users with bandwidth constraints (e.g., in 3G/4G networks), and to the system:

<sup>3</sup>Clients on OS X and Linux were also checked whether available and showed no significant differences.

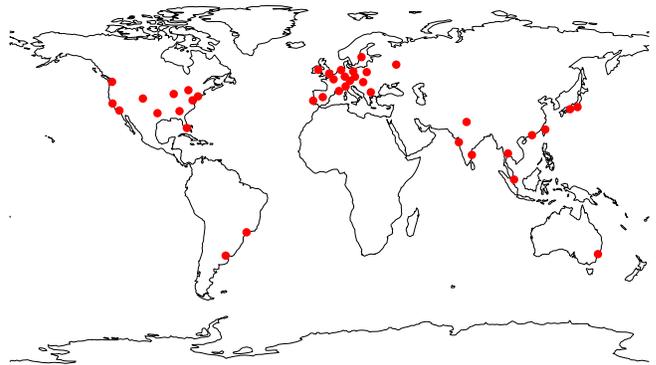


Figure 2: Google Drive’s edge nodes.

1 million users would generate approximately 6 Gb/s of signaling traffic alone! We believe this is a bad implementation that will be fixed in next releases.

#### 3.2 Data Centers

Next, we analyze data center locations. Dropbox uses own servers (in the San Jose area) for client management, while storage servers are committed to Amazon in Northern Virginia. Cloud Drive uses three AWS data centers: two are used for both storage and control (in Ireland and Northern Virginia); a third one is used for storage only (in Oregon). SkyDrive relies on Microsoft’s data centers in the Seattle area (for storage) and Southern Virginia (for storage and control). We also identified a destination in Singapore (for control only). Not surprisingly, most data centers are located in the U.S. Wuala data centers instead are located in Europe: two in the Nuremberg area, one in Zurich and a fourth in Northern France. None is owned by Wuala. All these services follow a centralized design where clients contact the servers using the public Internet as expected.

Google Drive is different: the application TCP traffic is terminated at the closest Google’s *edge node*, from where it is routed to the actual storage/control data center using the private Google’s network. Fig. 2 shows the locations identified in our experiments<sup>4</sup>. Overall, more than 100 different entry points have been located. Such architecture allows to reduce client-server RTT and to offload storage traffic from the public Internet. Performance implications are discussed in Sect. 5.

## 4. CLOUD SERVICE CAPABILITIES

### 4.1 Chunking

Our first test aims at understanding how the services process large files. By monitoring throughput during the upload of files differing in size, we determine

<sup>4</sup>Our results match with Google’s points of presence [7]. Understanding how Google manages traffic inside its network is outside the scope of this paper.

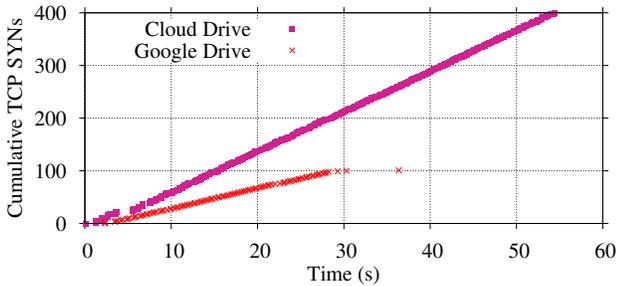


Figure 3: Uploading 100 files of 10 kB.

whether files are exchanged as single objects (no pause during the upload), or split into *chunks*, each delimited by a pause. Our experiments show that only Cloud Drive does not perform chunking. In fact, Google Drive uses 8 MB chunks while Dropbox uses 4 MB chunks. SkyDrive and Wuala apparently change chunk sizes.

Chunking is advantageous because it simplifies upload recovery in case of failures: partial submission becomes easier to be implemented. Partial submission can benefit users connected to slow networks, for example.

## 4.2 Bundling

When a batch of files needs to be transferred, files could be bundled and pipelined so that both transmission latency and control overhead impact are reduced. The benchmark consists of 4 upload sets, each containing exactly the same amount of data, which is split into 1, 10, 100 or 1000 files, respectively.

These experiments reveal a variety of synchronization strategies. Surprisingly, Google Drive and Cloud Drive open one separate TCP (and SSL) connection for each file. Considering management, Cloud Drive opens 3 TCP/SSL control connections per file operation. When several files have to be exchanged, such design strongly limits the system performance due to TCP and SSL negotiations (see Sect. 5). Fig. 3 shows the number of TCP SYN packets observed when Google Drive and Cloud Drive have to store 100 files of 10 kB each: 100 and 400 connections are opened respectively, requiring 30 s and 55 s to complete the upload.

Other services reuse TCP connections in a smarter way. However, SkyDrive and Wuala submit files sequentially, waiting for application layer acknowledgments between each file upload. This can be determined by counting packet bursts, which is proportional to the number of files in our experiments. We conclude that only Dropbox implements a file-bundling strategy.

## 4.3 Client-Side Deduplication

Server data deduplication eliminates replicas on the storage server. In case the same content is already present on the storage, replicas in the client folder can be identified to save upload capacity too.

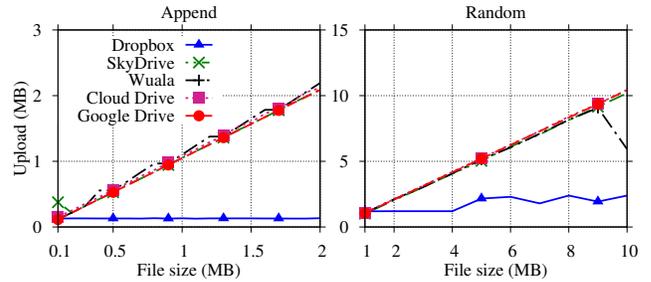


Figure 4: Delta encoding tests. Note the x-axes.

To check whether this feature is implemented, we design the following test: i) a random file is inserted in an arbitrary folder; ii) the same random payload is used to create a replica with a different name in a second folder; iii) the original file is copied to a third folder; and iv) after all copies are deleted, the original file is placed back. The last step determines whether deduplication fails after files are deleted from the local folder.

Results allow to conclude that only Dropbox and Wuala implement deduplication. All other services have to upload the same data even if it is readily available at the storage server. Interestingly, Dropbox and Wuala can identify copies of users' files even after they are deleted and later restored. In the case of Wuala, deduplication is compatible with local encryption, i.e., two identical files generate two identical encrypted versions.

## 4.4 Delta Encoding

Delta encoding is a specialized compression technique that calculates file differences among two copies, allowing the transmission of only the modifications between revisions. To verify which services implement delta encoding, a sequence of changes are generated on a file so that a portion of content is added/changed at each iteration. Three cases are considered: new data added/changed at the end, at the beginning, or at a random position within the file. This allows us to check whether rolling hash mechanisms are implemented. In all cases, the modified file replaces its old copy.

Fig. 4 shows that only Dropbox fully implements delta encoding, i.e., the volume of uploaded data corresponds to the actual part that has been modified. Results in which bytes are inserted at the end and at random positions are shown on the left and right plots, respectively. In the former case, file size has been chosen up to 2 MB. Larger files are instead considered in the latter case to highlight the combined effects with chunking and deduplication. Focusing on Dropbox, observe that the amount of sent traffic increases when files are bigger than Dropbox 4 MB-long chunk. This happens because the original content may be shifted, changing two or more chunks at once. As such, the volume of data to be transmitted is larger than the added data.

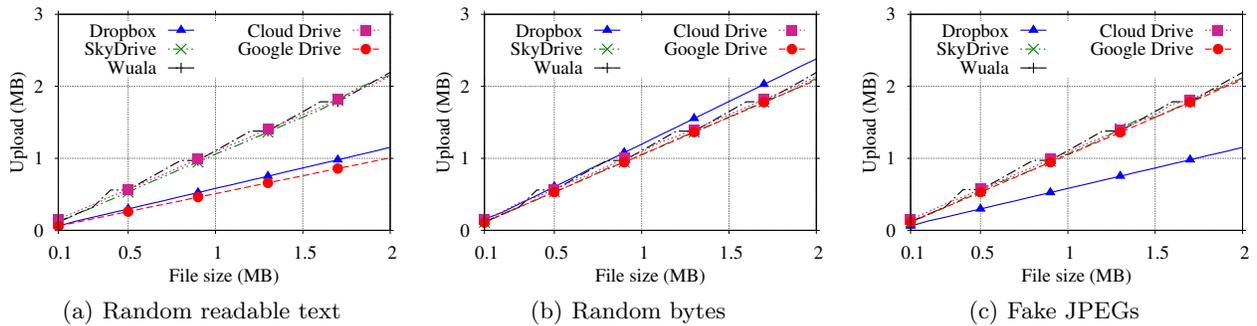


Figure 5: Bytes uploaded during the compression test.

Wuala does not implement delta encoding. However, deduplication prevents the client from uploading those chunks not affected by the change. This can be seen in Fig. 4, when data is added at a random offset, forming a 10 MB file. In this case, only two chunks (among 3) are modified, and thus uploaded.

#### 4.5 Data Compression

We next verify whether data is compressed before a transfer. Compression could, in general, reduce traffic and storage requirements at the expense of processing time. We benchmark the compression capability with two distinct file sets. The first set (Fig. 5(a)) is made of highly compressible text files (sizes from 100 kB to 2 MB). Files in the second set (Fig. 5(b)) contain pure random bytes so that no compression is possible. Fig. 5(a) reveals that Dropbox and Google Drive compress data before transmission, with the latter implementing a more efficient scheme. Fig. 5(b) confirms that Dropbox has the highest overhead in this scenario.

Naturally, compression is advantageous only for some file types. Compression will have a negligible or negative impact when already compressed files are going to be transmitted. A possible approach would be to verify the file format before trying to compress it (e.g., using *magic numbers*). We checked whether Google Drive and Dropbox implement smart policies by creating fake JPEGs – i.e., files with JPEG extension and JPEG headers, but actually filled with text. Fig. 5(c) shows that Google Drive identifies JPEG content and avoids compression. Dropbox instead compresses all files independently of their content. In case of an ordinary JPEG file, resources would therefore be wasted.

#### 4.6 Summary

Tab. 1 summarizes the capabilities of each service. It shows that Dropbox has the most sophisticated client from the point of view of features to enhance synchronization speed. Wuala, Google Drive and SkyDrive come next, implementing some capabilities. Finally, Cloud Drive has the most simplistic client, as none of the checked capabilities have been implemented.

## 5. CLIENT PERFORMANCE

After documenting the architectures and capabilities, we check their impact on performance. Passive measurements [3] show that up to 90% of Dropbox users’ upload batches carry less than 1 MB, with a significant portion involving at least 2 chunks. Based on this information, we design 8 benchmarks varying i) number of files; ii) file sizes and iii) file types. For the sake of space, we do not show results with files that are constantly changed or file replicas. These results are, however, identical for services that do not implement specific capabilities. Synchronization startup, upload time and protocol overhead are discussed in the following.

### 5.1 Synchronization Startup

We first evaluate how much time each service needs before synchronization starts. The metric is computed from the moment files start being modified until the first storage flow is observed.<sup>5</sup> Fig. 6(a) shows average delays over 24 repetitions. Only 4 scenarios using binary files are shown, since similar conclusions are obtained with other file types. Dropbox is the fastest service to start synchronizing single files. Its bundling strategy, however, slightly delays start up with multiple files. As we will show next, such strategy pays back in total upload time. SkyDrive is by far the slowest, waiting at least 9 s before starting submitting files. Moreover, it gets slower as batches increase, taking more than 20 s to start sending 100 files of 10 kB. Wuala also doubles the startup time in this latter case.

### 5.2 Completion Time

Next, we test how long each service takes to complete upload tasks. This is measured as the difference between the first and the last packet with payload seen in any storage flow. We ignore TCP tear-down delays, and control messages sent after the upload is complete.

<sup>5</sup>The metric includes delays of our testing application to send files to the test computer. This artifact, however, does not affect our conclusions, since all experiments are equally affected.

	Dropbox	SkyDrive	Wuala	Google Drive	Cloud Drive
Chunking	4 MB	var.	var.	8 MB	no
Bundling	yes	no	no	no	no
Compression	always	no	no	<b>smart</b>	no
Deduplication	yes	no	<b>yes</b>	no	no
Delta-encoding	yes	no	no	no	no

Table 1: Summary of the capabilities implemented in each service.

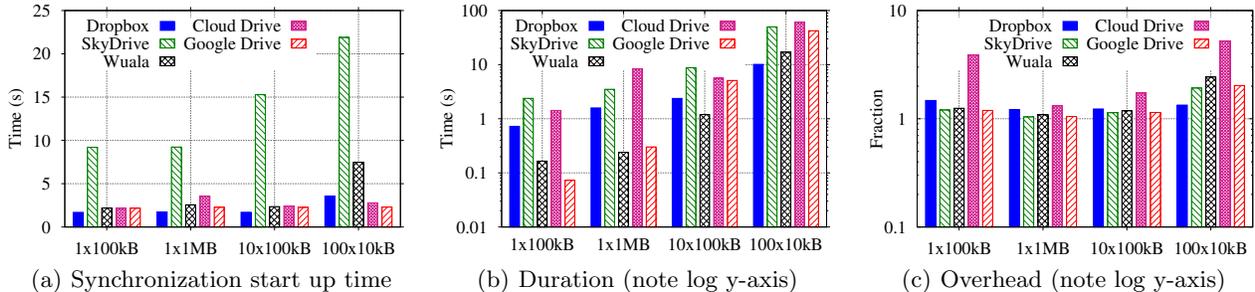


Figure 6: Average benchmarking results when uploading binary files.

Fig. 6(b) summarizes our results (note the log scale on the y-axis). A mixed figure emerges. When synchronizing single files of 100 kB or 1 MB, the distance between our testbed and the data centers dominates the metric. Google Drive (26,49 Mb/s) and Wuala (33,34 Mb/s) are the fastest, since each TCP connection is terminated to data centers nearby our testbed. Dropbox and SkyDrive, on the other hand, are the most impacted services. SkyDrive (160 ms of RTT), for instance, needs almost 4 s to upload a 1 MB file, whereas Google Drive requires only 300 ms (15 ms of RTT).

When multiple files are stored, the client capabilities become central. The rightmost bars on Fig. 6(b) shows a striking difference on completion time when 100 files of 10 kB are used. Dropbox wins by a factor of 4 because of bundling, topping to 0,8 Mb/s of upload rate. Interestingly, Google Drive’s advantage due to its distributed topology is completely canceled by the usage of separate TCP/SSL connections per file. It takes 42 s on average, i.e., 189 kb/s. Other services are also penalized by their lack of bundling, with Cloud Drive taking about 60 s (132 kb/s) to complete some tests.

### 5.3 Protocol Overhead

Finally, we evaluate protocol overhead as the total storage and control traffic over the benchmarking size. Fig. 6(c) shows that all services have a moderate to high overhead when small files are synchronized. Cloud Drive presents a very high overhead because of its high number of control flows opened for every file transfer (see Fig. 1). Dropbox exhibits the highest overhead among the remaining services (47% for 100 kB files and 22% for 1 MB files), possibly owing to the signaling cost of implementing its advanced capabilities.

The lack of bundling dramatically increases overhead when multiple small files are sent. Google Drive, for instance, exchanges twice as much traffic as the actual data size when sending 100 files of 10 kB. Cloud Drive shows even more overhead, i.e., more than 5 MB of data are exchanged to commit 1 MB of content.

## 6. CONCLUSIONS

In this paper we presented a methodology to check both capabilities and system design of personal cloud storage services. We then evaluated the implications of design choices on performance by analyzing 5 services.

Our benchmarks show that Dropbox is the most advanced service considering capabilities. The maturity of its design is reflected on the system performance, although some protocol tweaks seem possible to reduce network overhead. Cloud Drive exemplifies the relevance of protocol design: its bandwidth wastage is an order of magnitude higher than other offerings, and its performance is disappointing. SkyDrive shows simple design choices that limit performance, while Wuala offers a good alternative. Importantly, client side encryption does not seem to affect Wuala’s performance. In all 4 examples, we confirm the role played by data center placement in a centralized approach: taking the perspective of European users, this is still an important limitation for U.S. centric services, such as Dropbox. Services deploying data centers nearby our test location, such as Wuala, have therefore an advantage.

Google Drive follows a different approach resulting in a mixed picture: it enjoys the benefits of using Google’s capillary infrastructure and private backbone. However, protocols and features limit performance, especially when multiple files are considered.

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