

# Concatenation, Embedding and Sharding: Do HTTP/1 Performance Best Practices Make Sense in HTTP/2?

Robin Marx, Peter Quax, Axel Faes and Wim Lamotte

*UHasselt-tUL-imec, EDM, Hasselt, Belgium*  
*{first.last}@uhasselt.be*

Keywords: Web Performance, Best Practices, HTTP, Server Push, SpeedIndex, Networking, Measurements.

Abstract: Web page performance is becoming increasingly important for end users but also more difficult to provide by web developers, in part because of the limitations of the legacy HTTP/1 protocol. The new HTTP/2 protocol was designed with performance in mind, but existing work comparing its improvements to HTTP/1 often shows contradictory results. It is unclear for developers how to profit from HTTP/2 and whether current HTTP/1 best practices such as resource concatenation, resource embedding, and hostname sharding should still be used. In this work we introduce the Speeder framework, which uses established tools and software to easily and reproducibly test various setup permutations. We compare and discuss results over many parameters (e.g., network conditions, browsers, metrics), both from synthetic and realistic test cases. We find that in most non-extreme cases HTTP/2 is on a par with HTTP/1 and that most HTTP/1 best practices are applicable to HTTP/2. We show that situations in which HTTP/2 currently underperforms are mainly caused by inefficiencies in implementations, not due to shortcomings in the protocol itself.

## 1 INTRODUCTION

For a long time, version 1 of the HyperText Transfer Protocol (HTTP/1,  $h1$ ) has been the only way to request and transfer websites from servers to clients. Under the pressure of ever more complex websites and the need for better website load performance,  $h1$  and its practical usage have evolved significantly over the last two decades. Most of the changes help to combat the fundamental concept of  $h1$  to only request a single resource per underlying TCP connection at the same time (where slow resources can delay others, called “head-of-line (HOL) blocking”), by better (re-)use of these connections or by making use of parallel connections. The protocol specification now includes techniques such as request pipelining and persistent connections. In practice, further workarounds and tricks have become commonplace to help speed up  $h1$ : modern browsers will open several parallel connections (up to six per hostname and 30 in total in most browser implementations) and web developers apply techniques like resource concatenation, resource embedding and hostname sharding as best practices (Grigorik, 2013). However, these heavily parallelized setups induce large additional overheads while not providing extensive performance benefits in the face of ever more complex websites.

A redesign of the protocol was needed and starting with SPDY, Google led a movement back towards using just a single TCP connection, this time allowing multiple

resources to be multiplexed at the same time, alleviating the HOL blocking of  $h1$  and making better use of the TCP protocol. This effort culminated in the standardization of HTTP/2 ( $h2$ ) (Belshe et al., 2015). Advanced prioritization schemes are provided to help make optimal use of this multiplexing and the novel  $h2$  Push mechanism allows servers to send resources to a client without receiving a request for them first.

In theory,  $h2$  should solve most of the problems of  $h1$  and as such make its best practices and optimizations obsolete or replaceable (Grigorik, 2013). However, in practice the gains from  $h2$  are limited by other factors and implementation details. Firstly,  $h2$  eliminates application-layer HOL blocking but it could be much more sensitive to transport-layer HOL blocking (induced by TCP’s guarantee of in-order delivery combined with retransmits when packet loss is present) due to the individual underlying connection (Goel et al., 2016). Secondly, the multiplexing is highly dependent on correct resource prioritization and might introduce its own implementation overhead as chunks need to be aggregated. Finally, complex inter-dependencies between resources and late resource discovery might also lessen the gains from  $h2$  (Netravali et al., 2016). That  $h2$  is not a simple drop-in replacement with consistently better performance than  $h1$  is also clear from previous studies, which often find cases where  $h2$  is significantly slower than  $h1$ . Many of these studies also show contradictory results, poten-

tially because they use different experimental setups. We discuss related work in Section 2.

This leaves web developers and hosting companies with an unclear path forwards: they cannot just enable h2 because it could deteriorate performance, but they also do not know which concrete changes their websites need in order to make optimal use of the new protocol.

In this paper, we look at the most common h1 optimizations: resource concatenation, resource embedding and hostname sharding. We evaluate their performance over three versions of the HTTP protocol: the secure HTTPS/2 (h2s) and HTTPS/1.1 (h1s) and also the unencrypted HTTP/1.1 (h1c), because many websites still use this “cleartext” version. We do not include h2c, as modern browsers choose to only support h2s for security reasons. Note additionally that switching from h1c to a secure setup (either h1s or h2s) could have its own performance impact as TLS connections typically require additional network round-trips to setup. The next sections use h2 to refer to h2s and h1 to refer to both h1s and h1c at the same time.

Our main contributions are as follows:

- We introduce the **Speeder framework for web performance measurement**, which combines a large number of off-the-shelf software packages to provide various test setup permutations, leading to a broad basis for comparison and interpretation of experimental results.
- We show that **resource concatenation and hostname sharding are still best practices when using h2** and that HTTP/2 Push is a good replacement for resource embedding.
- We compare h2 to both h1s and h1c to find that **h2 rarely significantly improves performance over h1** (both secure and cleartext) and can severely slow down sites currently on h1c. However, in most cases bad network conditions do not seem to impact h2 much more than they impact h1.
- We use the **SpeedIndex** metric (Meenan, 2012) to show that **h2 is often later than h1 to start rendering the web page** and discover various browser quirks. Additionally, we show that implementation details can have a significant impact on observed performance.

We will first look at hand-crafted experiments on synthetic data (Section 4). These test cases are intended to make the underlying behavior of the protocols and their implementations clearer, and so are often not entirely realistic or involve extreme circumstances. Secondly, we look at more realistic data based on existing websites (Section 5). We expect that, compared to the experiments on synthetic pages, these test cases will show similar but more nuanced results and trends.

## 2 RELATED WORK

Various authors have published works comparing the performance of h2 and its predecessor SPDY to h1. Some also discuss h1 best practices and h2 Push. We highlight some of their findings and methods.

In “how speedy is SPDY?” (Wang et al., 2014) the authors employ isolated test cases to better assess the impact of various parameters (latency, bandwidth, loss rate, initial TCP window, number of objects and object sizes). They observe that “object size and packet loss rate are the most important factors in predicting SPDY performance”, in other words SPDY hurts when packet loss is high (mainly due to the single underlying TCP connection) but helps for many small objects. They also find it “helps for many large objects when the network is fast”. For real pages, they find that SPDY helps up to 80% of pages under low bandwidths, but only 55% of pages under high bandwidth.

“Towards a SPDY’ier Mobile Web?” (Erman et al., 2013) performs an analysis of SPDY over a variety of real networks and finds that underlying cellular protocols can have a profound impact on its performance. For 3G, SPDY performed on a par with h1, with LTE showing only some improvements over h1. A faster 802.11g network did yield improvements of 4% to 56%. They further conclude that using multiple TCP connections (~sharding) does not help SPDY.

“Is The Web HTTP/2 Yet?” (Varvello et al., 2016) periodically measures page load performance by loading real websites over real networks from their own origin servers. They observe that most websites using h2 also still use h1 best practices like embedding and sharding. They find that “these practices make h2 more resilient to packet loss and jitter” and that 80% of the observed pages perform better over h2 than over h1 and that h2’s advantage grows in mobile networks. On the other hand they also find that the remaining 20% of the pages suffer a loss of performance.

“Rethinking Sharding for Faster HTTP/2” (Goel et al., 2016) introduces a novel network emulation technique based on measurements from real cellular networks. They use this technique to assess the performance of hostname sharding optimization over h2. They find that h2 performs well for pages with large amounts of small and medium sized objects, but suffers from higher packet loss and larger file sizes. They demonstrate that h2 performance can be improved by sharding, though it will not always reach parity with h1.

“HTTP/1.1 pipelining vs HTTP2 in-the-clear: performance comparison” (Corbel et al., 2016) compares h1c to h2c (a mode of the protocol not currently supported by any of the main browsers). They disregard browser computational overhead while running experiments over

a network emulated by TC NETEM, and find that on average h2c is 15% faster than h1c and “h2c is more resilient to packet loss than h1c”.

Additional academic work found that for a packet loss of 2%, “h2s is completely defeated by h1s” and that even naive server push schemes can yield up to 26% improvements (Liu et al., 2016). Others conclude that h2 is mostly interesting for complex websites, showing up to a 48% decrease in page load time, 10% when using h2 Push, and that h2 is resilient to higher latencies but not to packet loss (de Saxcé et al., 2015). Further experiments indicate that h2 Push seems to improve page load times under almost all circumstances (de Oliveira et al., 2016). Finally, Carlucci et al. find that packet loss has a very high impact on SPDY, up to a 120% increase of page load time on a high bandwidth network (Carlucci et al., 2015).

Our review of related work clearly shows that the current state of the art is often contradictory in its conclusions regarding h2 performance. It is not clear if sharding still provides significant benefits, if h2 is resilient to poor network conditions or not and what degrees of improvement developers might expect when moving to h2.

We believe that one of the reasons for these contradictions is the way in which researchers construct, execute and measure their experiments. Additionally, most authors only use a single software tool for most parts of the process, e.g., just a single server package, one browser or client, one network setup and one metric. Without comparing different tools and metrics, some results could be attributed as being inherent to the tested protocol, while they are actually caused by implementation details in the tool being used. Moreover, developers often use alternative tools that provide more complex metrics to assess their site performance (e.g., Google Chrome devtools, webpagetest.org and “Real User Monitoring” tools) (Gooding and Garza, 2016).

Finally, in this fast moving field, even the protocols evolve very rapidly. Experiments run two years or even a couple of months ago might yield different results on newer versions of the used software.

All this makes that results and conclusions are often difficult to compare and reproduce. We aspire to help resolve this problem by introducing the Speeder framework for web performance measurements.

### 3 THE SPEEDER FRAMEWORK

Recognizing the fact that different implementations can influence experiment results and conclusions and that these are often difficult to compare, we introduce the Speeder framework for web performance measurement. Speeder allows users to run and compare experiments on

Table 1: Speeder software and metrics.

<b>Protocols</b>	HTTP/1.1 (cleartext), HTTPS/1.1, HTTPS/2
<b>Browsers</b>	Chrome (51 - 54), Firefox (45 - 49)
<b>Test drivers</b>	Sitespeed.io (3), Webpagetest (2.19)
<b>Servers</b>	Apache (2.4.20), NGINX (1.10), NodeJS (6.2.1)
<b>Network</b>	- DUMMYNET (cable and cellular) (Webpagetest) - fixed TC NETEM (cable and cellular) - dynamic TC NETEM (cellular) (Goel et al., 2016)
<b>Metrics</b>	All Navigation Timing values (Wang, 2012), SpeedIndex, firstPaint, visualComplete, other Webpagetest metrics (Meenan, 2016)

a variety of test setups using various software packages. It automates setting up and driving the various tools to make the overhead of maintaining multiple setups manageable. Users simply need to select the desired setup permutations and the framework collects and aggregates a multitude of key metrics. Users can then utilize various visualization tools to compare the results.

Speeder mainly aims to accomplish two different goals in the following ways:

- **Make it easier to differentiate between protocol- and implementation related behavior:** Speeder includes a number of different software packages for each setup component (see Table 1). Through mutual combination, these provide a large number of permutations for possible experiment setups, which leads to a large comparison basis for the results.
- **Make it easier to create reproducible results for both researchers and developers:** Speeder uses freely available off-the-shelf and open source tools and software. We deploy our setups using Docker containers, which can easily be updated with new software and older configurations can be re-used if needed. Docker images can also be distributed and shared with others.

Speeder focuses on the concept of a “full emulated setup” (both client and server), though it can conceivably also measure real web pages over real networks (only client) or serve experiments for testing with external tools (only server). This approach should apply to researchers and also developers during their development process.

Unless indicated otherwise, the results in this work are from an experimental setup using NGINX on the server, Google Chrome driven by Webpagetest and the dynamic network model (Goel et al., 2016).

Readers are encouraged to review our full dataset (including results not presented in this paper for Apache, sitespeed.io and the Fixed network model) and setup details and sourcecode via <https://speeder.edm.uhasselt.be>.

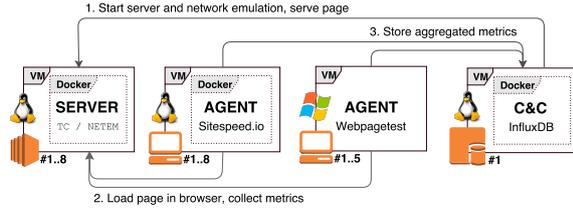


Figure 1: Conceptual schematic of the Speeder Framework.

**Setup:** As displayed in Figure 1, Speeder is deployed on eight backend linux Virtual Machines (VMs), eight sitespeed.io agent linux VMs, five Webpagetest agent Windows 10 VMs and one linux command-and-control (C&C) VM that includes an InfluxDB database to store aggregated test results. These are distributed across two physical Dell PowerEdge R420 machines with at least two dedicated logical cores and 2 GB RAM per VM. They are connected through 1 Gbit ethernet.

All linux software is deployed inside Docker containers, with at most one container running in each VM at the same time to prevent test results being influenced by other tests. As such, no more than 8 individual tests can be running at the same time. Webpagetest is deployed without Docker as there are VM-based distributions readily available and it is more difficult to Dockerize its Windows-only setup. Network emulation using `TC NETEM` is done in the server container.

While this type of highly virtualized setup can influence the measured load times, we believe it still allows accurate comparisons since all tests are equally influenced. Similar setups are used in related work (Goel et al., 2016; Corbel et al., 2016).

**Metrics:** Most related work uses `loadEventEnd` from the Navigation Timing API (Wang, 2012) as the main metric for page performance. However, this metric only indicates the total page load time and not how the visual rendering progresses over time: a page that stays empty for 5s and only renders content the last 0.6s (page A), will have a better observed performance than a page that only completely finishes loading at 7.5s, but that had its main content drawn by 2.5s (page B), while the latter can arguably have the better end-user experience.

Google’s SpeedIndex (Meenan, 2012) aims to provide a better indication of how progressively a page renders by recording a video during the page load and using image analysis to determine how much of a page was loaded at any given time. As such, it is more a metric of how early and often a page updates during load and not purely of how fast a page load completes. Perhaps counter-intuitively, this means page B would have a lower SpeedIndex than page A, even though it finishes loading later. SpeedIndex is expressed in milliseconds and lower values mean better performance (similar to `loadEventEnd`).

We find that the two metrics often show similar behavior (especially for synthetic test cases) and so, for easier comparison with related work, we present mainly `loadEventEnd` while comparing it to `SpeedIndex` in the case of significant divergence.

**Network emulation:** Because it is practically difficult to continuously test a large number of parameter permutations over real-life (cellular) networks, we aim to provide a number of different network emulation models so we can perform our tests in a locally controlled network. We have implemented two models so far: fixed and dynamic.

Table 2: Fixed network model.

preset	throughput (in kbit)	latency / jitter (in ms)	% loss
<b>wifi</b>	29000	75 / 5	0
<b>wifi loss</b>	29000	75 / 5	0.2
<b>4g</b>	4200	95 / 10	0
<b>4g loss</b>	4200	95 / 10	0.6
<b>3g loss</b>	750	170 / 20	1
<b>2g loss</b>	500	220 / 20	1.2

The fixed traffic model (see Table 2) was inspired by the Google Chrome devtools throttling settings<sup>1</sup>, with an added 75ms round-trip latency to simulate transatlantic traffic<sup>2</sup> and added loss based on Tyler Treat’s setup<sup>3</sup>. This model simply sets and keeps the parameters for `TC NETEM` constant for the duration of the test. This means there is a constant random packet loss.

The dynamic model uses previous work (Goel et al., 2016) which introduced a model based on real-life cellular network observations. The model has six levels of “user experience (UX)”: NoLoss, Good, Fair, Passable, Poor and VeryPoor. Each UX level contains a long list of values for bandwidth, latency and loss. The model changes these parameters in intervals of 70ms by picking the next value from the list to simulate a real network. This means the packet loss is more bursty than with the fixed model. For details, please see their paper or the original source code<sup>4</sup>.

We mainly report results using the dynamic model because, despite the fact that it only emulates cellular networks, we feel it is most representative of a realistic network and makes it easier for others to compare our results to related work.

<sup>1</sup><https://goo.gl/IBMtmV>

<sup>2</sup><http://www.verizonenterprise.com/about/network/latency/>

<sup>3</sup><https://github.com/tylertreat/comcast>

<sup>4</sup><https://github.com/akamai/cell-emulation-util>

## 4 HTTPS/2 IMPACT ON HTTP/1 BEST PRACTICES

In this section we study the impact of applying `h2` on three well-known `h1` performance best practices: resource concatenation, resource embedding and hostname sharding. We create a number of test cases for each best practice to assess its performance in isolation of other factors. To be able to compare our results using the SpeedIndex metric, we make sure our loaded resources have a strong visual impact on the visible “above the fold” part of the website. All images are included as `<img>` and all CSS and JavaScript (JS) resources use code to style a `<div>` element. Inconsistencies between `loadEventEnd` and SpeedIndex results can indicate that a resource was fast to load but slow to have visual impact.

Most of our graphs show `loadEventEnd` on the y-axis. Individual data points are aggregates of 10 to 100 page loads. Each experiment was run at least five times. Unexpected datapoints and anomalies across all runs were further confirmed by manually checking the collected output of individual page loads (e.g., screenshots/videos, .har files, waterfall charts). The line plots show the median values under Good network conditions. The box plots show the median as a horizontal bar and the average as a black square dot, along with the 25th and 75th percentiles and min and max values as the whiskers. Some box plots use a logarithmic scale on the y-axis to allow for large values.

### 4.1 Concatenation

`h1` is slow in loading a large amount of files at the same time because it can only fetch a single resource at a time per connection and the browser often limits `h1` to six parallel connections per hostname. This means requests can be stalled, waiting for the completion of previously issued requests. The best practice of concatenation helps by merging multiple sub-resources together into a single, larger file. This lowers the number of individual requests but at the expense of reduced cacheability: if a single sub-resource is updated, the whole concatenated file needs to be re-fetched as well. Note that image concatenation requires additional CSS code as well, to display only one specific area of the bigger image at every smaller image location. Because `h2` can multiplex many requests per connection, this optimization should not be needed, and we can request many small files and keep fine-grained cacheability.

#### 4.1.1 Concatenation for Images (Spriting)

We observe three experiments: (a) a large number (i.e., 380) of small files, (b) a medium number (i.e., 42) of medium sized files and (c) a medium number (i.e., 30) of

large files. In Figure 2 we compare the concatenated versions of the images (left) to loading individual files (right).

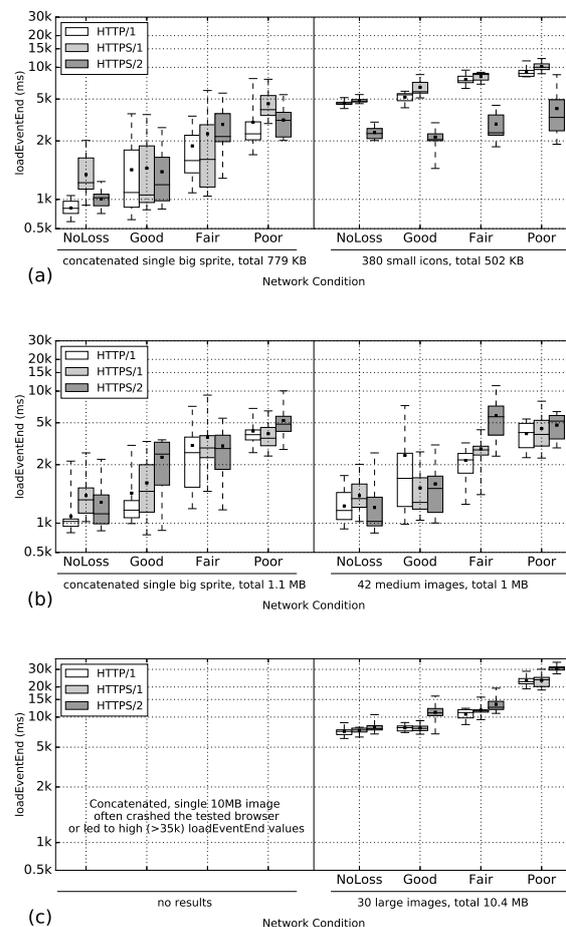


Figure 2: Synthetic test cases for image concatenation. `h2` performs well for many small files but deteriorates for less or larger files.

For Figure 2(a) we observe that `h2` significantly outperforms `h1` when there is no concatenation, but that a single spritesheet largely reduces `h2`'s benefit and brings it somewhat on a par with `h1`. This is expected as `h1` is limited to requesting six images in parallel and keep the others waiting, while the single `h2` connection can efficiently multiplex the many small files. It is of note that the concatenated version is two to five times faster, even though (in a rare compression fluke) its file size is much higher than the sum of the individual file sizes.

Figure 2(b) shows relatively little differences and no clear consistent winners between the concatenated and separate files. This is expected for `h2`, as in both cases it sends the same amount of data over the same connection, but not for `h1`. We would expect the six parallel connections to have more impact, but it seems they can actually hinder on good network conditions. This is probably because of the limited bandwidth in our emulated network,

where the six connections contend with each other, while a single connection can consume the full bandwidth by itself. Comparing this to (a), we see that here  $h_2$  does not get significantly faster for the concatenated version. This indicates that the higher measurements in (a)(right) are in large part due to the overhead of handling the many individual requests.

Lastly, in Figure 2(c) we see that  $h_2$  struggles to keep up with  $h_1$  for the larger files and performs significantly worse under bad network conditions (note the y-axis' log scale). Due to the much larger amount of data, the six parallel connections do help here, packet loss impacts the single  $h_2$  connection more.

The SpeedIndex measurements (not included here) show very similar trends.

### 4.1.2 Concatenation for CSS and JavaScript

We observe two experiments: 500 `<div>`-elements are styled using simple CSS files (single CSS rule per `<div>`) (left) and complex JS files (multiple statements per `<div>`) (right). We split the code over multiple files, from one file (full concatenation) to 500 files (no concatenation). Figure 3 shows full results in (a) and shows more detail for one to 30 files in (b).

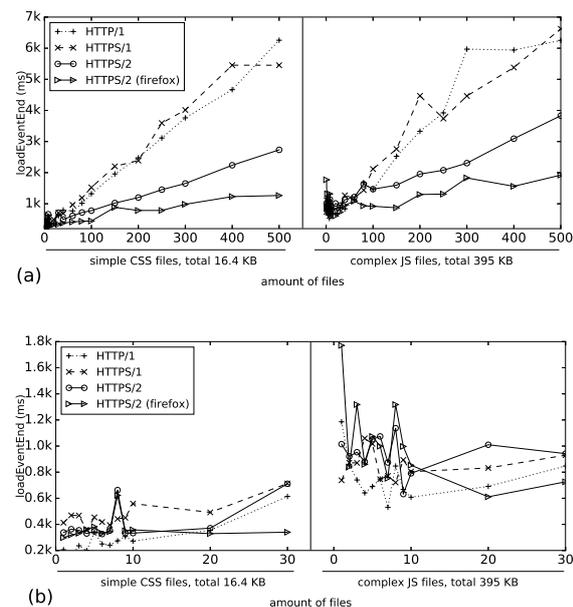


Figure 3: Synthetic test cases for CSS/JS concatenation.  $h_2$  performs well for many files but there is no clear winner for the more concatenated cases.

The big-picture trends in (a) look very similar to Figure 2(a):  $h_2$  again clearly outperforms  $h_1$  as the number of files rises and shows a much better progression towards larger file quantities than the quasi linear growth of  $h_1$ . Interesting is also the performance of Firefox:

while its  $h_1$  results (not shown in Figure 3) look almost identical to Chrome, the  $h_2$  values are much lower, indicating that it has a more efficient implementation that scales better to numerous files.

Looking at the zoomed-in data in (b), we do see somewhat different patterns. For the simple CSS files the trends are relatively stable, with  $h_1c$  outperforming  $h_2$  and  $h_2$  beating  $h_1s$ . This changes at about 30-40 files, where  $h_2$  finally takes the lead. For the more complex JS files (right), this tipping point comes much later around 100 files. The measurements for one to ten JS files are also much more irregular when compared to CSS. Because  $h_1$  shows the same incongruous data as  $h_2$ , we can assume this is due to how the browser handles the computation of the larger incoming files. A multithreaded or otherwise optimized handling of multiple files can depend on how many files are being handled at the same time. This would also explain the very high measurements of a single JS file in Firefox (consistent over multiple runs of the experiment). In additional tests, smaller JS files and larger CSS files also showed much more stable trends, indicating that especially large JS files incur a large computational overhead. Note as well that the timings for a smaller amount of JS files are sometimes higher than those for the larger amounts, indicating that concatenation might not always be optimal here (for none of the protocols).

Poor network conditions (not shown here) indicate similar trends to Good networks, but the  $h_2$  tipping points are later: 40-50 files for simple CSS, 150 for complex JS.

### 4.1.3 Concatenation for CSS and JavaScript With SpeedIndex

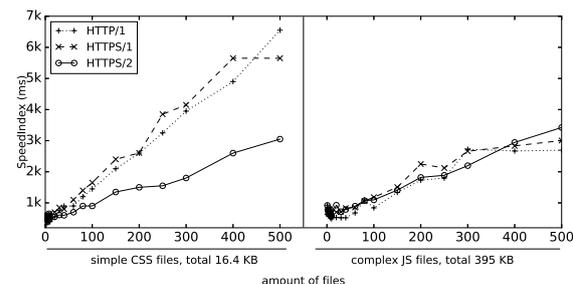


Figure 4: Synthetic test cases for CSS/JS concatenation (SpeedIndex).  $h_2$  SpeedIndex for JavaScript indicates that it is much slower to start rendering than  $h_1$ .

For the tests in the previous section, the SpeedIndex results were significantly different and merit separate discussion. Figure 4 shows the same experiment but depicts SpeedIndex for Google Chrome. We notice that the data for the simple CSS files (left) looks very similar to Figure 3, but the results for the complex JS files (right) do not. Since the SpeedIndex metric gives an indication of how

Table 3: Observed browser render-blocking behavior. Chrome blocks on too much, while Firefox doesn't seem to block on anything.

	Expected <head>	Chrome <head>	Firefox <head>
<b>CSS</b>	blocking	blocking	<i>progressive</i>
<b>JavaScript</b>	blocking	<i>progressive</i>	<i>progressive</i>

	Expected bottom	Chrome bottom	Firefox bottom
<b>CSS</b>	progressive	<i>blocking</i>	progressive
<b>JavaScript</b>	progressive	progressive	progressive

progressively a page renders (Section 3) and because we know from Figure 3 that  $h_1$  takes much longer than  $h_2$  to load large amounts of files, we can only conclude that under  $h_2$  the JS files take much longer to have an effect on the page rendering, to skew the SpeedIndex in this way.

We manually checked this assumption using screenshots and found that for  $h_1$  the JS was indeed progressively executed as soon as a file was downloaded, but with  $h_2$  the JS took effect in “chunks”: in larger groups of 50 to 300 files at a time and mostly towards the end of the page load. We first assumed this was because of erroneous multiplexing: if all the files are given the same priority and weight, their data will be interleaved, delaying all files. Captures of  $h_2$  frame data however showed each file  $i$  was requested as dependent on file  $i - 1$ , ensuring that files were fully delivered in request order. We can once more only conclude that the browser implementation somehow delays the processing of the files, either because of their JS complexity or because the handling of many concurrent  $h_2$  streams is not optimized yet. This argument is supported by the SpeedIndex results for Firefox (not shown here), as its  $h_2$  values are much lower than those of  $h_1$ , indicating that Firefox has a more efficient implementation.

This does not explain why the  $h_1$  SpeedIndex results for the simple CSS files are so different compared to those of JavaScript: if they would also be applied individually as soon as they were downloaded, the  $h_1$  SpeedIndex values would be much lower. Manual investigation revealed that the browser waits for *all* the CSS files to be downloaded before applying them all at once for both  $h_1$  and  $h_2$ . While there does exist the concept of “render-blocking” CSS (and JS), where this behavior is actually wanted for all files in the <head> of a page, we purposefully hoped to avoid this issue by loading the CSS and JS files on the bottom of the HTML document. It seems Chrome always *fully* blocks rendering on all CSS files included anywhere in the page, making SpeedIndex indeed almost completely identical to `loadEventEnd`. Comparison with Firefox shows different conventions: here even CSS files that *should* be render-blocking (i.e., in the <head>) were just applied progressively instead.

Table 3 shows the observed behaviors from our synthetic tests and *highlights* where we would expect different implementations. We leave a deeper investigation into the reasons for this behavior and how well it generalizes to other cases for future work. Note that progressive for  $h_2$  still means the files are applied in larger chunks instead of individually.

## 4.2 Embedding and HTTP/2 Push

When loading a web page, the browser first requests the HTML file and only discovers it needs additional CSS/JS files when parsing the HTML. It then waits for any render-blocking files (see Section 4.1.3) to be fully downloaded before starting to render the HTML. This means a minimum of two round-trip times (RTTs) between the initial HTML request and “first paint”. It is however also possible to embed (or “inline”) CSS and JS code directly in the HTML document (e.g., through <style> and <script> tags). That way, the code is received after one RTT and rendering can start sooner. The main downside is that the embedded code cannot be cached separately.

The HTTP/2 specification also recognizes the need to eliminate this second RTT and includes a mechanism called  $h_2$  (Server) Push (Belshe et al., 2015). The server can send along additional files with the first HTML response (or indeed, any response) without having to embed their contents in the HTML, allowing the files to be cached. Unlike embedding, Push can also properly handle binary resources (e.g., images, fonts). As such, Push should be a drop-in replacement for embedding.

However, while this all works well theoretically, in practice these approaches are hindered by TCP’s “slow start” congestion control algorithm. TCP sends only a small amount of data at the start of the connection and then exponentially ramps up its speed if no packet loss or delays are present. In practice, the TCP data window at the start is about 14 KB for modern Linux kernels (used in our experiments) (Marx, 2016). Thus if the HTML file (including the embedded CSS/JS) is larger than 14 KB, the remainder has to wait for the second “send burst”, arriving only after two RTTs. The best practice is thus to embed only a limited amount of so-called “critical CSS” that renders a good first impression of the page (e.g., general layout, building blocks, background colors) and load the other CSS using <link> references. Push has a similar problem: if the HTML fills up the initial 14 KB, push will have no benefit (Bergan et al., 2016).

Rather than create our own test case we use the existing Push demo by Bradley Fazon<sup>5</sup>. This case uses the [www.eff.org](http://www.eff.org) frontpage as the reference point which we manually adjust to include the discussed optimizations.

<sup>5</sup><https://github.com/bradleyfazon/h2push-demo>

This page has a single “critical CSS” file and a good mix of additional CSS, JS and image files without being too complex. We verify our observations using other synthetic test cases. We show the results from tests using the Apache webserver because NGINX does not yet support h2 Push. We show the SpeedIndex results because these should be most affected.

### 4.2.1 Embedding

In Figure 5 we observe a single experiment: we embed the “critical CSS” file in the <head> and move the other CSS <link> and JS <script> URLs to the bottom of the page, so they should not be render-blocking. We compare this optimization (left) to the original page (right).

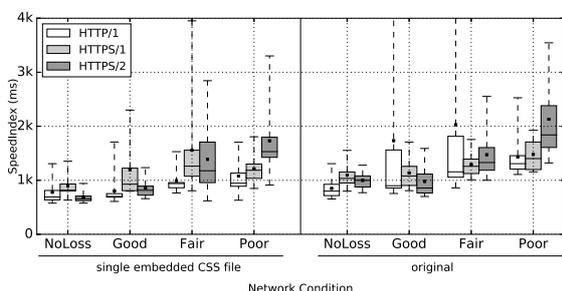


Figure 5: Realistic test case for embedding. The technique has a low impact and is similar across protocols.

As we can see, embedding seems only to lead to very limited SpeedIndex gains. This is unexpected, since manual confirmation of the results clearly shows that the embedded CSS does take effect early in the page and that it is not limited by the render-blocking behavior of Chrome (see Section 4.1.3). This reduced impact on SpeedIndex has two reasons:

Firstly, the embedded CSS content is larger than the 14 KB TCP first transmission limit. Consequently the bottom portion of the HTML containing the remaining CSS/JS files is now only received after the second RTT. Since the browser needs to parse the HTML to discover these additional dependencies and issue requests for them, the fetching of the other files is delayed, which in turn postpones the total page load and render. This explains why we often see higher `loadEventEnd` values for pages that use embedding, even if the SpeedIndex drops.

Secondly, this optimization will primarily work well when the network is the bottleneck and not the CPU speed of the device. As parsing CSS and rendering both cost CPU resources, fast devices are more likely to have more CPU idle time available for partial rendering in between receiving the CSS data, while slow devices will have no such budget and spend all their time parsing CSS; the observed end result is similar to the normal render-blocking behavior. We can somewhat see the higher

impact on slower networks in Figure 5 and a little more clearly in Figure 6.

We can conclude that embedding is more of a micro-optimization and that it requires careful fine-tuning to lead to good results.

### 4.2.2 HTTP/2 Push

With h2 Push, the HTML is always fully sent before the pushed data. As such, we need to make sure the HTML code is smaller than 14 KB so the window can also include the pushed CSS (Bergan et al., 2016) (note that this also means Push does not suffer from the “late resource discovery” problem seen when embedding). We manually remove some metadata from the eff.org HTML and enable gzip compression, reducing the on-network HTML size from 42 KB to 9 KB.

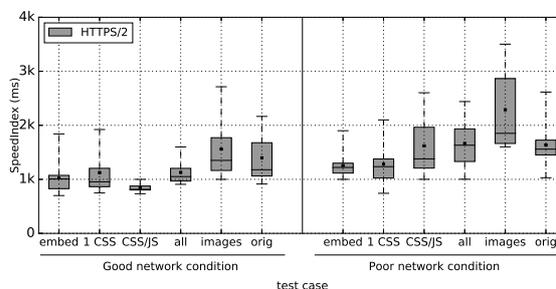


Figure 6: Realistic test case for HTTP/2 Push. Pushing is similar to embedding. Pushing the wrong assets or in the wrong order can deteriorate performance.

In Figure 6 we observe six different experiments based on the adjusted eff.org test case: (1) embed a single CSS file (no push, similar to Section 4.2.1), (2) push the single CSS file, (3) push all the CSS/JS files (10 files), (4) push all (images + CSS/JS + one font), (5) push all images (18 files) and (6) the reference measurement (original, similar to Section 4.2.1). We see that pushing the “critical CSS” file is indeed very similar to embedding it. It is unexpected however that pushing all CSS/JS performs a little better than just the “critical CSS” in the Good network condition. We found that in practice the initial data window is often a bit larger than 14 KB, so it can accommodate more than just the single CSS file. However, this is not always the case and other runs of the same experiment show less optimal results (which can also be seen in the Poor network condition in Figure 6 (right)). Given a larger data window, the “Push all” test case should perform similarly, but it is consistently a bit higher. It turned out that we pushed the single font file at the very end, after all the images. The font data should have been given a higher h2 priority than the images, but due to a recently discovered Apache bug<sup>6</sup> this was not the

<sup>6</sup>[https://icing.github.io/mod\\_h2/nimble.html](https://icing.github.io/mod_h2/nimble.html)

case and the font data had to wait, delaying the final page load and render. This also explains why pushing just the images performs worse than the reference: the much more important CSS and JS is delayed behind the image data.

These experiments clearly show that, similarly to embedding, Push is hard to fine-tune and limited in the benefit it can deliver. We had to make several manual changes to the original website to get any measurable benefit at all, at least in the context of the initial page load and pushing along with the first HTML request.

However, the true power of Push might be that it can also send data along with non-HTML files. In a separate synthetic experiment we used JavaScript to fetch a .json file that contains a list of image URLs to then add them to the page as `<img>` elements. This emulates how a REST API can be used in typical modern “Single Page App” frameworks. We make sure the initial HTML is large to “warm up” the TCP connection (Bergan et al., 2016). Along with the .json response, the server then also Pushes the images that are referenced within. This did considerably speed up the rendering process, especially on bad networks. This illustrates that Push can have many other applications than just as a replacement for embedding during the initial page load.

### 4.3 Sharding

Browsers set a maximum of six parallel connections per hostname but this is not enough for loading large amounts of files and thus modern, complex websites over h1 (see Section 4.1). Browsers however also observe a higher total limit of 17 to 60 open connections<sup>7</sup> and so it has become common practice to distribute files over multiple hostnames/servers (called sharding), since each can have its own group of six connections. This can for example be done using Content Delivery Networks (CDNs) to host “static” content. The main downside of sharding is the increased overhead: the setup becomes more complex and additional connections require extra computational resources and hardware.

On the other side, h2 wants to make optimal use of just a single connection and actively discourages parallel channels. The h2 specification even includes a mechanism for coalescing requested HTTP connections to separate hostnames onto a single TCP connection if the hosts use the same HTTPS certificate and resolve to the same IP address (Belshe et al., 2015). h2 Push can also only be used for resources on the same domain.

#### 4.3.1 Sharding for Images

We observe three experiments, identical to the unconcatenated setup in Section 4.1.1: (a) 380 small files, (b) 42

<sup>7</sup><http://www.browserscope.org/>

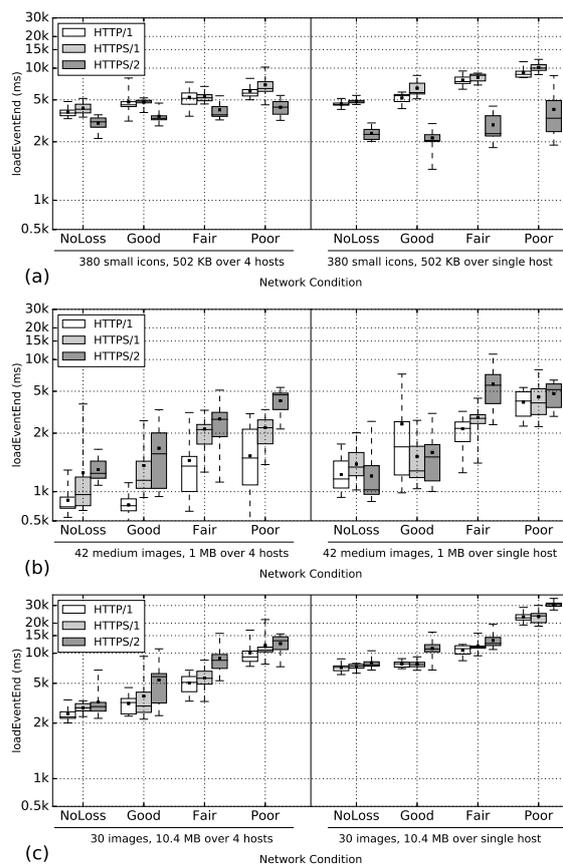


Figure 7: Synthetic test cases for image sharding. h2 benefits for larger files but deteriorates for many smaller files. h1 always improves.

medium sized files and (c) 30 large files. Figure 7 compares a sharded version over four hostnames (left) with the unsharded version (right). In practice, over h1 the browser will open the maximum amount of connections (24, six per hostname) and a single connection per hostname for h2 (four in our case). The observed trends are similar for CSS/JS files.

Firstly, in Figure 7 (a) we observe that sharding deteriorates h2 performance, while only marginally benefiting h1. Because the files are that small, h2’s multiplexing was at its best in the single host case and maximized the single connection’s throughput, while it now has less data to multiplex per connection. Conversely, h1 now has more connections but still suffers from HOL blocking on the small files.

In contrast, (b) shows inconsistent behavior when sharding: sometimes it helps and sometimes it hurts h2; it shows good benefits for h1c but less impressive improvements for h1s. We posit that the additional overhead of setting up secured HTTPS connections (both for h1s and h2s) limits the effectiveness of the higher parallel throughput.

Lastly, (c) clearly shows why sharding is considered an `h1` best practice: it can improve performance by over 50%, especially in bad network conditions. `h2` also profits significantly from the multi-host setup. For these larger files, multiple connections provide the much-needed higher throughput. They also help mitigate HOL blocking for `h1` and lessen the impact of loss when compared to a single `h2` connection.

Overall we observe similar results to those of Goel et al. (Goel et al., 2016): for many, smaller objects, sharding can hurt `h2` performance, but not considerably. For medium-sized websites, sharding usually helps but not always substantially. The optimization has the most impact on websites with large objects, for both protocols. We also performed experiments with two and three hosts and found that *if* sharding helps for `h2`, sharding over more hosts helps more, but there are diminishing returns with each increase in the amount of hosts.

Additionally, `h2` has another important feature that is impacted heavily by sharding: HPACK header compression (Belshe et al., 2015). HTTP headers often contain duplicate information and can be efficiently compressed. Because HPACK partly uses a shared compression dictionary per connection that is built up at runtime, we see its effectiveness decrease in the case of sharding, as the algorithm has less data to learn from/to re-use. Table 4 shows how the total bytes sent by Google Chrome (composed mainly of HTTP headers) is different with and without sharding. `h2s` clearly outperforms `h1s`, but sharding leads to a decrease of its effectiveness by 25% to 50%. Note that `h1` does not employ any header compression.

Table 4: Total bytes sent by Google Chrome (~ HTTP headers) and ratio to total page size. For many small files, the HTTP header overhead is significant.

File count	Protocol	1 host BytesOut	4 hosts BytesOut	Total page size	4 hosts % of total page size
<b>42 files</b>	<code>h2s</code>	649	1362	1075000	0.1%
	<code>h1s</code>	2786	3346	1075000	0.3%
<b>400 files</b>	<code>h2s</code>	29580	38680	610000	6%
	<code>h1s</code>	165300	177600	610000	19%

## 5 INTERPRETING RESULTS FROM REALISTIC WEBSITES

Synthetic test cases are useful to assess individual techniques in isolation but they are often not very representative for real websites. We now look at some more realistic test cases. Our goal here is not to come to definitive con-

clusions about `h2` or `h1` performance but rather to show the difficulties involved in interpreting measurements.

We present results for nine different websites (1: `barco.com`, 2: `bbc.com`, 3: `demo.cards`, 4: `derelectie.be`, 5: `hbvl.be`, 6: `healthcare.gov`, 7: `standaard.be`, 8: `uhas-selt.be`, 9: `yappa.be`). To make them easier to compare to the clearest trends in the synthetic experiments (Section 4.1.1), we select image-heavy websites in two categories: (A) media/news sites with typically large HTML content and many smaller images (nr. 2, 4, 5 and 7) and (B) company/product landing pages with “hero image(s)” (large images taking up most of the “above the fold” space) (nr. 1, 3, 6, 8 and 9). These websites present a good mix: we have both optimized (using concatenation and embedding) and unoptimized pages, complex and relatively simple sites. For more details we refer to our website.

We simulate what would happen if a developer would switch their `h1` site to `h2` by naively moving all their own assets over to a single server (disabling sharding) but still downloading some external assets from third party servers (e.g., Google analytics, some JS libraries). This approach is similar to (Wang et al., 2014). We download the websites to our local webserver using a custom `wget` tool that rewrites the main assets to a single hostname, and serve them using Speeder.

### 5.1 Results

In figure 8 we show the median `loadEventEnd` and `SpeedIndex` measurements for the nine websites over Good and Poor networks, loaded in Chrome and Firefox. Globally, we can state that `loadEventEnd` and `SpeedIndex` are often similar for the Good network, indicating that our sites are mostly network-dependent, as the rendering waits for assets to come in. Poor network conditions can have a very large impact. In various cases `h2`'s `SpeedIndex` is far above that of `h1` even if their `loadEventEnd` values are similar, indicating that `h2` is slower to start rendering, consistent with our observations in Section 4.1.3. `h1c` is faster than `h2` in almost all of the cases and `h2` is almost never much faster than `h1s`. Note that this is against our expectations, as `h1` has to make due without the benefits of sharding.

We now highlight how important it is to compare different metrics and setups by looking more closely at a few of the individual sites. For example, if we were developing site 8 and we would only look at Figure 8 (a) and (b), we might conclude that `h2` can give a huge speedup on Good networks, which is then possibly reversed on Poor networks. However, comparing this to Figure 8 (c) and (d) shows that the `SpeedIndex` values do not exhibit these anomalies. We indeed found that one of the externally loaded (non render-blocking) JavaScript files sometimes took a very long time to download and

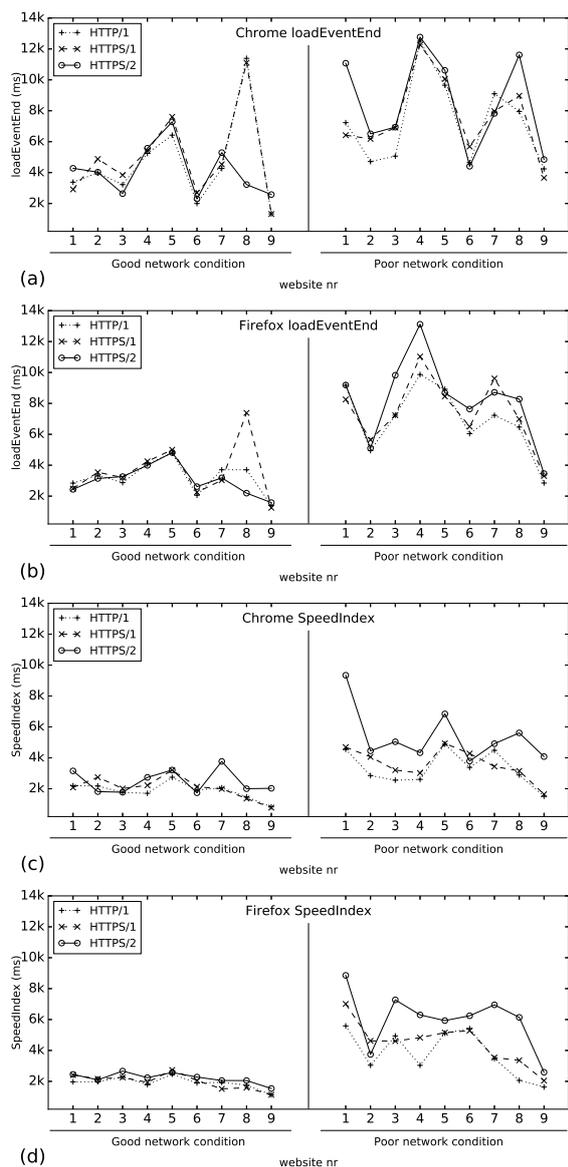


Figure 8: Nine realistic websites on dynamic Good and dynamic Poor network models. There is very similar performance under Good network conditions, but h2 clearly suffers from Poor conditions.

replaced it with a locally hosted version. This completely removed the anomalies for the Good network, but did not significantly affect the trends for the Poor network. As it turned out, the bottleneck was in downloading the site’s many large assets. As the network experienced more loss and less bandwidth, the h2 connection suffered and the limited number of six parallel h1 connections also could no longer keep up. Not comparing loadEventEnd to SpeedIndex, or Poor to Good networks might have led us to miss this issue and possibly draw the wrong conclusions for this datapoint.

As developers of site 6 we would be quite happy, since this is one of the faster websites with very little difference between h1 and h2 for the Good network and inconsistent but similar results on the Poor network. Looking more closely we however noticed that the very large hero image was taking up more than half of the total load time. The image URL was included halfway down the HTML page, behind CSS/JS files and other images. By the time the browser discovered this resource, the six parallel h1 connections were already taken and because browsers currently assign the same h2 priority to all images, the hero image had to wait behind the other images. Simply concatenating some of the JS files ensured that there was an h1 connection available by the time the hero image was discovered and the SpeedIndex value was cut in half for h1. However h2 was still just naively prioritizing the hero image behind the other assets. Moving the hero image URL to before the other images was the solution. Sharding the hero image to a different hostname would likely have had a similar impact. This problem was not evident from the presented graphs, only from looking at the waterfall charts. Even when comparing many different test setups, some problems will still remain hidden.

## 6 DISCUSSION

Conceptually, the ideal h2 setup will use a single TCP connection to multiplex a large amount of small and individually cacheable site resources. This alleviates the h1 application-layer HOL blocking and helps to reduce the overhead of many parallel connections, while also maximizing the efficiency of the underlying TCP protocol. Together with advanced resource priorities and h2 Push this can lead to (much) faster load times than are possible today over h1, with much less overhead.

However, as our experiments have shown, this ideal setup is not yet viable. While h2 is indeed faster than h1, when loading many files (see Figures 2 and 3), it is still often slower than loading concatenated versions of those files (see Section 4.1). Looking at the SpeedIndex values (see Figures 4 and 8) also shows that h2 is frequently later to start rendering the page than h1. h2 also struggles when downloading large files (see Figures 2 and 7) and can quickly deteriorate when used in bad network conditions. In our observations, h2 is in most cases currently either a little slower than or on a par with h1 and shows both the most improvement and worst deterioration in more extreme circumstances.

The good news is that almost all of the encountered problems limiting h2’s performance are due to inefficient implementations in the used server and browser software. Firstly, while loading many smaller files incurs its own considerable overhead, comparing Chrome and Firefox

in Figure 3 we can see that this overhead can be limited extensively, lessening the need for concatenation (though possibly never completely removing it). Secondly, the fact that `h2` is later to start rendering than `h1` is also due to ineffective processing of the `h2` data, since we have confirmed that resources are received well on-time to enable faster first paints, see Section 4.1.3. It is also interesting to note that Firefox seems to have especially optimized its pipeline for large amounts of files, since it outshines Chrome for synthetic pages in Figure 3 but falls behind for more realistic content in Figure 8. Thirdly, cases in which `h2` underperformed while using `h2 Push` in Section 4.2.2 or loading realistic sites in Section 5.1, could be attributed to the server implementation not correctly (re-)prioritizing individual assets. As these implementations mature, we can expect many of these issues to be resolved.

However, `h2` still retains some core limitations, mostly due to its single underlying TCP connection, which seems to simultaneously be its greatest strength and weakness. TCP’s congestion control algorithms can lead it to suffer significantly from packet loss on poor networks (most obvious when downloading multiple large files, see Figures 2 and 7) and can heavily impact the effectiveness of `h2` and resource embedding on newly established connections (see Section 4.2). We have to nuance these statements however, as in practice `h2` actually performs quite admirably and usually does not suffer more from bad networks than `h1`, despite using fewer connections.

Recognizing that these underlying `h2` performance problems stem primarily from the use of TCP, in the new QUIC protocol (Carlucci et al., 2015) Google and its partners implement their own application-layer reliability and congestion control logic on top of UDP. They remove the transport-layer HOL blocking by allowing out-of-order delivery of packets, differently handle re-transmits in the case of loss, reduce the amount of round-trips needed to establish a new connection and allow larger initial data transmissions. Running `h2` on top of QUIC can greatly benefit `h2`’s multiplexing setup.

Until the `h2` implementations mature and/or the QUIC protocol is finalized however, fully switching to the ideal `h2` approach could severely reduce the observed performance, especially when looking at the SpeedIndex measurements for poor networks in Section 5.1. Luckily, the discussed `h1` best practices (resource concatenation, resource embedding and hostname sharding) have a similar impact on both `h1` and `h2` in non-extreme cases (see Section 4). This means that most sites that are currently optimized for `h1` can quickly and safely transition to `h2` (or offer users both protocols in tandem) with a minimum of changes and without suffering large performance penalties. More work may however be needed for sites who’s users are mostly on bad networks or sites that are using the unencrypted `h1c`, which is almost always faster

than `h2`. The new `h2 Push` mechanism looks especially promising on “warm” TCP connections but seems difficult to fine-tune when pushing files along with the initial HTML file (see Section 4.2.2).

Finally, using the Speeder framework to run our experiments on a large number of emulated test setup permutations has shown to be a useful approach. Many implementation inefficiencies were discovered by comparing different metrics, browsers and network conditions and looking for inconsistencies. Analyzing and comparing both synthetic and realistic test data was also effective, with the more realistic results indeed somewhat dampening the more extreme synthetic results but largely showing similar trends. Furthermore, the two concrete website examples in Section 5.1 show that individual datapoints can have subtle underlying reasons for their observed values, some having little to do with the underlying protocol or implementations but originating in the HTML structure itself. They also show that even a deep comparison of different setups is not always enough to find important problems and that tools should also support manual confirmation of results through a variety of visualizations. We can conclude that the Speeder framework is a versatile platform usable not only by researchers but also developers to assess both global trends for comparisons, and local optimizations for individual websites.

## 7 CONCLUSION

In this work we have used the Speeder framework to run experiments for both synthetic and realistic test cases over a variety of different setups, allowing us to compare `h2s` to `h1s` and `h1c`, Chrome to Firefox, `loadEventEnd` to `SpeedIndex` and good to bad network conditions.

Our results have shown that most of the cases in which `h2` currently underperforms are caused by unoptimized implementations and that most of the real inherent `h2` problems are caused by the use of a single underlying TCP connection. This can lead `h2` performance to deteriorate on poor networks with high packet loss, but in practice we have seen that the difference with `h1` under these conditions is usually not that large. Globally speaking, we find that `h2` is often on a par with `h1s` and a little slower than `h1c`.

We have found that all three discussed `h1` best practices of resource concatenation, resource embedding and hostname sharding perform similarly over `h1` and `h2` in non-extreme circumstances. Especially concatenation and sharding can have a large impact on performance, while embedding and its `h2 Push` alternative are observed to be micro-optimizations that are difficult to fine-tune (at least for the initial page load). These findings lead us to recommend to developers that they often do

not have to significantly alter their current setups when deciding to migrate from h1 to h2 or to support both versions in parallel.

We argue that, in time, the envisioned ideal h2 model of using many small, individually cacheable files over a single, well filled TCP connection will become viable with improving browser/server implementations and the QUIC protocol.

We will keep expanding and sharing the Speeder framework (e.g., with the h2o server, Google Lighthouse, sitespeed.io v4), using it to follow browser implementation changes, as well as more deeply investigate the possibilities of h2 Push and h2 priorities in various settings.

## ACKNOWLEDGEMENTS

This work is part of the imec ICON PRO-FLOW project. The project partners are among others Nokia Bell Labs, Androme, Barco and VRT. Robin Marx is a SB PhD fellow at FWO, Research Foundation - Flanders, project number 1S02717N. Thanks to messrs Goel, Wijnants, Michiels, Robyns, Menten, Bonné and our anonymous reviewers for their help.

## REFERENCES

- Belshe, M., Peon, R., and Thomson, M. (2015). Hyper-text transfer protocol version 2. <https://tools.ietf.org/html/rfc7540>. Last visited: 2017-03-01.
- Bergan, T., Pelchat, S., and Buettner, M. (2016). Rules of thumb for http2 push. <https://docs.google.com/document/d/1K0NykTXBbbbTlv60t5MyJvXjqRGsCVNYHyLEXIXYMv0>. Last visited: 2017-03-01.
- Carlucci, G., De Cicco, L., and Mascolo, S. (2015). Http over udp: an experimental investigation of quic. In *Proceedings of the 30th Annual ACM Symposium on Applied Computing*, pages 609–614. ACM.
- Corbel, R., Stephan, E., and Omnes, N. (2016). Http/1.1 pipelining vs http2 in-the-clear: Performance comparison. In *2016 13th International Conference on New Technologies for Distributed Systems (NOTERE)*, pages 1–6.
- de Oliveira, I. N., Endo, P. T., Melo, W., Sadok, D., and Kelner, J. (2016). Should i wait or should i push? a performance analysis of push feature in http2 connections. In *Proceedings of the 2016 workshop on Fostering Latin-American Research in Data Communication Networks*, pages 7–9. ACM.
- de Saxcé, H., Oprescu, I., and Chen, Y. (2015). Is http2 really faster than http/1.1? In *Computer Communications Workshops (INFOCOM WKSHPS), 2015 IEEE Conference on*, pages 293–299. IEEE.
- Erman, J., Gopalakrishnan, V., Jana, R., and Ramakrishnan, K. K. (2013). Towards a spdy’ier mobile web? In *Proceedings of the Ninth ACM Conference on Emerging Networking Experiments and Technologies, CoNEXT ’13*, pages 303–314, New York, NY, USA. ACM.
- Goel, U., Steiner, M., Wittie, M. P., Flack, M., and Ludin, S. (2016). Http2 performance in cellular networks: Poster. In *Proceedings of the 22Nd Annual International Conference on Mobile Computing and Networking, MobiCom ’16*, pages 433–434, New York, NY, USA. ACM.
- Gooding, M. and Garza, J. (2016). Real world experiences with http2. <https://www.slideshare.net/JavierGarza18/real-world-experiences-with-http2-michael-gooding-javier-garza-from-akamai>. Last visited: 2017-03-01.
- Grigorik, I. (2013). *High Performance Browser Networking*. O’Reilly Media, Inc.
- Liu, Y., Ma, Y., Liu, X., and Huang, G. (2016). Can http2 really help web performance on smartphones? In *Services Computing (SCC), 2016 IEEE International Conference on*, pages 219–226. IEEE.
- Marx, R. (2016). Http2 push : the details. <http://calendar.perfplanet.com/2016/http2-push-the-details/>. Last visited: 2017-03-01.
- Meenan, P. (2012). Speed index. <https://sites.google.com/a/webpagetest.org/docs/using-webpagetest/metrics/speed-index>. Last visited: 2017-03-01.
- Meenan, P. (2016). Webpagetest. <https://webpagetest.org>. Last visited: 2017-03-01.
- Netravali, R., Goyal, A., Mickens, J., and Balakrishnan, H. (2016). Polaris: faster page loads using fine-grained dependency tracking. In *13th USENIX Symposium on Networked Systems Design and Implementation (NSDI 16)*.
- Varvello, M., Schomp, K., Naylor, D., Blackburn, J., Finamore, A., and Papagiannaki, K. (2016). Is the web http2 yet? In *International Conference on Passive and Active Network Measurement*, pages 218–232. Springer.
- Wang, X. S., Balasubramanian, A., Krishnamurthy, A., and Wetherall, D. (2014). How speedy is spdy? In *NSDI*, pages 387–399.
- Wang, Z. (2012). Navigation timing api. <https://www.w3.org/TR/navigation-timing>. Last visited: 2017-03-01.