



Universität Hamburg

DER FORSCHUNG | DER LEHRE | DER BILDUNG

Master's Thesis

Performance-optimized A/B-Testing for E-Commerce-Websites

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A distributed system is one where the failure of some
computer I've never heard of can keep me from getting my work done.
– *Leslie Lamport*

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1 Introduction and Background

[tbd]

- Explain structure and main goal of this thesis
- Describe shortly all sections from this chapter and what the reader can expect
- Give short outlook to following chapter

1.1 E-Commerce

This chapter gives an introduction to e-commerce. Before going into the details, the emergence of e-commerce is described, starting with the Internet in section 1.1.1. In the following, I will briefly discuss the history of e-commerce and its types in section 1.1.2. The relationship between user satisfaction and the website performance is covered in section 1.1.3, which then leads to the chapter 1.2 which is about web analytics.

1.1.1 The Internet

In the last 50 years, a new technology emerged, spread over the entire world and influenced many aspects of most peoples life. Within the turmoil of the cold war, the United State's *Advanced Research Projects Agency* (ARPA) established in 1957 a communication network to bring together universities and their researches all around the country in order to be able compete against the USSR [CA11]. What started as a tool for scientific collaboration evolved half a century later into the *Internet*, a global network and phenomenon, to which every user with a dedicated device has access and can contribute to. The internet is an integral part, if not the backbone of today's everyday life. Users of the internet use it for almost everything, from sending emails, watching television, chatting with friends, order lunch, checking the weather for the next day or renting motorized scooters.

In 2021, the internet has 4.66 billion users, which is around 60% of the world population.¹ Compared to 2020, the number of internet users increased by 7.3%. In Europe, more than 90% of the population are internet users. For a developed country like Germany, the numbers are even more impressive: 94% of the German population are using the internet with an average daily time of over five hours.

¹Following statistics are taken from <https://datareportal.com/reports/digital-2021-germany> [14.05.2021]

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Those numbers demonstrate impressively that the internet is an integral part of our daily life. Along the rise of the internet, transactions and processes falling under the term of e-commerce are climbing as well. Before discussing the term "e-commerce" and take a grasp at its history and types, some statistics are presented to demonstrate the importance of e-commerce.

1.1.2 E-Commerce

Introduction

From the global data report², one can read out that over 90% of the world population visited an online retail site and over 76% of the world population purchased a product online. As usual, for or a western country like Germany, the figures are higher: 92.5% of the German population visited an online retail site and over 80% purchased a product online. And the usage is expanding: the growth of the amount spent within the category food and personal care is 28.6%, and 17.6% for the category fashion and beauty.

E-commerce sales have grown steadily over the past 20 years, topping to 57.8 billion in 2019.³

The COVID-19 pandemic with its implications had and still has an not negligible impact on the growth of e-commerce. Several measures were taken to stop the spread of the virus and the number of deaths, one of which was to minimize physical interaction between people. This leads consequently to a shift of human interactions to the internet. Along this, e-commerce benefits. Bhatti et al. [BAB⁺20] conclude that "e-commerce enhanced by COVID-19".

Brief History

E-Commerce, or electronic commerce, is according to the *Encyclopædia Britannica* about "maintaining relationships and conducting business transactions that include selling information, services, and goods by means of computer telecommunications networks."⁴ In short, e-commerce is about buying and selling products and services via the internet.

The success of e-commerce is closely linked to the tremendous advances in Internet technology in recent years: The development of the *Electronic Data Interchange* (EDI) starting in the 1960s standardised the communication between two machines. Personal computers were introduced in the 1980s, and one of the first examples of an online shop is the *Electronic Mall* opened by CompuServe in 1984. Another crucial milestone is the launch of the *World Wide Web* (WWW) in 1990, which made the internet accessible to everyone. With social media visible on the horizon from the 2000s, new possibilities for

²<https://datareportal.com/reports/digital-2021-germany> [14.05.2021]

³<https://einzelhandel.de/presse/zahlenfaktengrafiken/861-online-handel/1889-e-commerce-umsaetze> [14.05.2021]

⁴<https://www.britannica.com/technology/e-commerce> [19.05.2021]

businesses and consumers alike to participate in e-commerce arise, for example, by enabling new marketing strategies or providing new sales channels. New devices such as smart phones and tablets lowered the barrier to participate in e-commerce. While e-commerce was available at any time, the new devices brought flexibility and mobility, making e-commerce available everywhere [Her19].

With the continued advancement in technology, e-commerce can expect a bright future with trends such as AI recommendation systems, outstanding UX thanks to virtual reality, or even more simpler payment methods through cryptocurrencies.⁵

Types

There are several types in e-commerce and they emerge from the possible combinations between the actors *business*, *consumer* and *government* [SSMG17].

| | Business | Consumer | Government |
|------------|----------|----------|------------|
| Business | B2B | B2C | B2G |
| Consumer | | C2C | C2G |
| Government | | | G2G |

Table 1.1: Types of e-commerce.

B2C Business to Consumer in e-commerce describes basically online shopping, by means of a business offering its services and products to the consumer over the WWW. The consumer can browse through the products and services presented within an online shop and order them directly via the website. A variety of payment and delivery options conclude the B2C type [Hei20].

For an aspiring business, there are several ready-made software solutions for setting up an online store, as for example. *Shopify*, *ePages*, *Magento* or *WooCommerce* [SBR⁺19].

A famous example of a B2C company is *Amazon*. On the 16th of July in 1995, Amazon launched as a website and entered the stock market on the 15th of May 1997 [SB19]. Amazon has been successful, with the stock starting at \$1.5, which is at around \$3200 as of this writing.⁶ Today, Amazon employs over 1 million people⁷ and serves the desires of 200 million paying prime members.⁸

By taking a quick look at the pros and cons of an online store, it becomes clear that some of the advantages are that: there is no need of a real, physical store to showcase and sell the products; the virtual shop is available to the consumer at any time and has no closing

⁵<https://www.spiralytics.com/blog/past-present-future-ecommerce/> [19.05.2021]

⁶<https://finance.yahoo.com/quote/AMZN?p=AMZN> [19.05.2021]

⁷<https://www.statista.com/statistics/234488/number-of-amazon-employees/> [19.05.2021]

⁸<https://www.statista.com/statistics/829113/number-of-paying-amazon-prime-members/> [20.05.2021]

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hours; there is a high potential for the online shop as it is part of growing market; online business is scalable; due to tracking algorithms, precise targeting as well as data analysis is possible; to start an online business, there is not so much floating required and there are generally lower costs; it is possible to provide a personalized customer experience.

Some disadvantages are that the speed of market is rapid, competitors arise everyday everywhere and technology evolves quickly while consumers expectations go high [Her19], [LO20].

Another disadvantage is that there is no direct or physical connection with the consumer. As described above, online shopping takes place on the virtual WWW, i.e. personal interaction between buyer and seller is not possible and the shopping experience takes place on a website, from which it follows that the overall virtual user experience must be excellent in order to compete.

In the next section, I will describe the findings between the correlation between user satisfaction and the performance of the retailers web presence.

1.1.3 User Satisfaction and Performance

The aim of this thesis is not to deep dive into terms and concepts or the non-trivial problem of defining user satisfaction, usability or the like. Therefore the term user satisfaction is in this context loosely defined as how happy the user is with the website he or she interacts with.⁹

Performance can be understood as the speed of an online shop, e.g. how long it takes the page to load, how quickly the user can interact with the page, and how the user perceives the performance of the website. In chapter X I will discuss that measuring performance is not so trivial and there are a lot of ideas and metrics to measure it.

SpeedHub

A plethora of information and studies about the phenomenon of user satisfaction and web site performance is collected at *SpeedHub.org*, a portal by *Baqend* in cooperation with *Google* which provides "the largest systematic study of Mobile Site Speed and the Impact on E-Commerce."¹⁰ Not only are studies and reports available on the hub, but also collections of videos and blog posts.

In his talk at code.talks 2019, Felix Gessert summarizes the results and provides insights into the most important aspects and questions of the study so far [Ges21]:

The first observation when asking for a correlation between the performance of a system and user satisfaction is that users need to be differentiated, which leads to the concept of a *User Profile*: In terms of gender, young women are the most demanding consumers

⁹For a discussion cf. "User satisfaction measurement" in [IKOK10]

¹⁰<https://www.speedhub.org/> [21.05.2021]

and are less likely to buy from slow sites. In general, people between the ages of 18 and 24 have higher expectations of a site's speed than their older counterparts.

There are also differences between nations and regions, for example people from Japan have the highest expectations, which is almost certainly related to technological advancements in that country. Not only the expectations themselves differ geographically, but also how speed influences the users, for example "speed influences New Yorkers more than Californians." [Unb], [GA]

What all users have in common is their human psychology. In terms of performance, researchers generally suggest keeping wait times below one second to keep users' attention. (cf. "Performance perception" in 1.2.5).

After considering the user himself, the next step is to examine the influence of the device used: Studies show that mobile users are more likely to buy products and services than their colleagues using a desktop computer, where iOS users have generally more expectations regarding site speed [Dev].

Last but not least, the context and state of the user is important, with naturally relaxed and calm users perceiving pages faster than stressed or hurried users. Also users experience websites more slowly while on the go [Akab].

There are many real world examples and studies that prove and demonstrate the importance of website speed in terms of user satisfaction and ultimately sales: *Amazon* found out that a decrease of 100 ms in page loading leads to -1% conversion rates. If the site loads 100 ms faster, *Walmart* observed that the revenue increases by 1%. For *Zalando*, increasing site speed by 100 ms has led to an uplift of 0.7% revenue per session [Lin], [SKG⁺], [CKR].

Search engine optimization is heavily impacted by load speed: For *Google*, 500 ms slower sites led to a decrease of 20% in traffic. *GQs* traffic increased by 80% after the page load went down from 7 s to 2 s. And for *Pinterest*, 40% faster loads led to 15% more SEO traffic [Mos], [May], [MAC].

User engagement and satisfaction also depend heavily on loading times: *Forrester* noted an increase of 60% for the session length while brining down the load time by 80%. *Akamai* monitored that the bounce rate climbed up incredible 103% when the load time increased by 2 seconds. And for the *AberdeedGroup*, the customer satisfaction dropped by 16% at one more second delay in response times [For], [Akaa], [Abe].

In summary, it can be said that many studies and practical examples prove and demonstrate that faster websites and online stores lead to a better user experience and usually to happier customers. In commercial terms, one can conclude that page speed equals money.

In order to properly test the effects of performance on users, a scientific method is required. A/B testing as a controlled experiment is one of them and will be explained in

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the next section. After discussing A/B testing, I will move on to examining *Web Analytics*, a term that encompasses methods, tools, and instruments for companies to better understand their business and customers.

A/B Testing

Controlled experiments like A/B testing are not a new tool for scientists and researchers and were used as early as the 1920s [KL17]. With the advent of the Internet in the 1990s, the concept was adopted into the online domain and is now used by large companies such as Amazon, Facebook or Google to test ideas and hypotheses directly on a live system. Controlled experiments such as A/B testing are used to aid decision making and provide a "causal relationship with high probability" [KL17]. They enable a data-driven and quantitative validation of the hypothesis [Mor18].

Controlled experiments help to test hypothesis and questions of form: "If I change feature X, will it help to improve the key performance indicator Y?"

To answer this question, two systems are needed: *Version A*, the control variant or default version, and a slightly different *Version B*, called the treatment. If more than two versions or one treatment should be evaluated at the same time, an A/B/n split test has to be implemented. With a univariable setup, only one variable differs between the systems; with a multivariable structure, several variables are changed at the same time.

Usually, the users of the system are randomly split into two groups and testing is directly performed with real users on a production system. It is advantageous, also compared to other experimental set-ups, that the users and participants are not aware that they are part of an experiment, which leads to fewer biases and side effects. In order to measure the differences and the user behaviour, web analytics has to be integrated within the system [KL17].

A brief and general discussion of controlled experiments in computer science can be found in chapter X.

To continue with the question of performance and user satisfaction, A/B testing allows two different versions of the same site to be served to two groups at the same time, one site being slow and the other being fast, without users knowing.

An implemented web analytics system makes it possible to measure how the various systems and user groups behave. What web analytics exactly is, what tools are available and what a web analytics process looks like, is discussed in the next section.

1.2 Web Analytics

This chapter is about web analytics. I will first discuss definitions and give a short introduction to web analytics in section 1.2.1. Then, a brief history of web analytics will be given in section 1.2.2 to help contextualize. After characterizing two web analytics

process descriptions in section 1.2.3, data collection methods will be discussed in section 1.2.4. Finally, web performance will be explained in 1.2.5, which leads the way to the research questions.

1.2.1 Introduction

What is *Web Analytics*? Reviewing the literature, it is clear that there are several definitions:

Nakatani et al. state that "Web analytics is used to understand online customers and their behaviors, design actions influential to them, and ultimately foster behaviors beneficial to the business and achieve the organization's goal." [NC11] According to this definition, web analytics is about getting insights of the users using the system, not only who or what they are, but also how they interact with the system. Additionally, the definition emphasizes that the underlying motivation of web analytics is to achieve business goals.

Singal et al. provide a more technical definition by pointing out that "Web Analytics is the objective tracking, collection, measurement, reporting and analysis of quantitative internet data to optimize websites and web marketing initiatives." [SKS14] Again, the ultimate goal is to drive business, but supported by data science methods and tools such as tracking, collecting and analysing massive amounts of data.

Bekavac et al. provide a similar definition by pointing out that web analytics is "the analysis of qualitative and quantitative data on the website in order to continuously improve the online experience of visitors, which leads to more efficient and effective realization of the company's planned goals." [BGP15]

Summarizing the above definitions, it is noticeable that web analytics consists of two important elements: a data-driven, information-oriented and technical element of collecting and analysing data about users and a commercial and business-driven element that provides the main motivation for collecting the data primarily by setting business goals.

Moving from definitions to the practical realm, Zheng et al. describe four main use cases for web analytics [ZP15]:

- Improving the overall design and usability, for example of the navigation or layout of the website.
- Optimize for your business goals: Whatever goals the business is trying to achieve, generating conversions is the goal.
- Monitor campaigns: Understand and measure the success of advertising campaigns.
- Improve performance by examining metrics such as page load time. This is discussed further in chapter 1.2.5.

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Web analytics is also difficult and there are some obstacles and challenges to overcome. Kumar et al. describe some of the hurdles as follows [KO20]: The analysis and interpretation of the data and the goals and measures derived from it are reactive rather than anticipatory, since "predictive modelling applications" for web analytics are not yet on the market.

Big data, that is the volume, variety and velocity of data collected, can be challenging to manage, for example, important insights can be lost or overlooked.

Privacy and the information collected from visitors and customers can be another challenge in terms of inappropriate use of data and GDPR compliance.

1.2.2 Brief History

The history of web analytics can be described as a transformation from an IT domain and a technical log file analysis tool to a sophisticated, polymorphic tool for marketers.

Each time a user requests an HTML file or other resource from a web server, the server makes an entry in a special log file [SKS14]. The first log entries followed the *Common Log Format* (CLF) which provides rudimentary information such as the date, the HTTP status code or the number of bytes transmitted. In 1996, the *Extended Log Format* (ELF) was introduced with more flexibility and information in mind. Thanks to the standardized format of the log files, it was possible to create software that evaluates the log files and presents them to users in a readable form. *GetStats* was one of the first tools which generated statistics and user friendly output for analysts [CP09]. In 1995, Dr. Stephen Turner developed *Analog*, the first free software for analysing log files [ZP15]. Log file analysis will be further discussed in chapter 1.2.4.

What was initially mainly interesting for maintenance and IT staff, who for example answered the question of how many 404s occurred on the server, developed into an interesting website information pool for marketers.

As the available information increased, it became clear that the data could be used for more than just analyzing server behavior. But log file analysis was not enough to provide details about how users interact with the site. Web analytics underwent a transformation from log analysis to user data tracking, analysis, and reporting.

Croll describes the move of analytics from IT to marketing with three steps: [CP09]

1. JavaScript eliminated the need for log files and enabled marketers to maintain and deploy their analytics solutions themselves, making them less dependent on IT.
2. The introduced advertising economy of search engines like Google led to a new focus of analysts on user attraction and conversion rates.
3. New cost models allowed marketers to pay for the analytics service based on website traffic, rather than paying upfront for hardware and software. Analytics spend was thus linked to website traffic and, ideally, revenue.

In 1990 the WWW started and in 1993 one of the first widely used browsers *Mosaic* was launched. At the same time *WebTrends* developed and released one of the first analytics software. A lot more services followed, such as *WebSideStory* in 1996 [CP09] or *Quantified* by Urchin in the same year [CP09].

Page tagging made it possible to collect not only technical data, but also business-relevant information. Visitors and their behaviour were the focus, shaping questions like: How is this user behaviour related to a purchase? If a user buys shoes, will he also buy socks? The development and implementation of cookies enabled the identification of unique users. Not only business-relevant questions were asked and answered, but also studies on performance and usability [CP09]. More details about page tagging can be found in chapter 1.2.4.

In 2003, Edwards, Eisenberg and Sterne founded the *Web Analytics Association* (WAA). The WAA brings together and supports all the players in web analytics such as users, marketers and IT specialists on an international stage. Due to digitalization and its all-encompassing effects, the WAA has renamed itself *Digital Analytics Association* (DAA) in 2012 because the web is not the only area where users leave their digital footprint [SKS14].

As described in the section above, participant and user numbers on the Internet continue to rise and now all Fortune 500 companies operate websites, with web analytics a key marketing tool [KO20].

Some of the most established tools today are *Google Analytics*, *Adobe SiteCatalyst*, *Webtrekk* and *Piwik* [Hei20]. Google Analytics will be further discussed in chapter ??.

Looking ahead, Zheng et al. identify several trends for web analytics, such as mobile web and application-specific analytics like video, search, learning, or social media analytics [ZP15].

1.2.3 Web Analytics Process

Web analytics can be described as a process in which the main goal is usually to increase sales. The literature cites two main ideas and processes, the first from the Web Analytics Association and the second from industry best practices. They are briefly described in this section.

Both processes have in common that they are aimed at improving the website and thus increasing business revenue.

Key Performance Indicators (KPIs) are the ideal tool for the instrumentation of web analytics and help to identify areas and potential for improvement. They are an integral part and play an important role in any web analytics process as they provide a "in-depth picture of visitor behavior on a site" [Jan09].

KPIs can differ depending on the business in which they operate. For commercial domains, common KPIs are conversion rates, average order or visit value, customer loyalty, bounce rate, etc. [SKS14].

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Defining the right KPIs and aligning them with business goals is a critical step in any web analytics process.

WAA Process Guide

The Web Analytics Association offers a web analytics guide that consists of nine steps. They are: [Jan09]

1. Identify key stake holders
2. Define primary goals of website and prioritize them
3. Identify most important site visitors
4. Determine key performance indicators
5. Identify and implement the right solution
6. Use multiple technologies and methods
7. Make improvements iteratively
8. Hire and empower a full-time analyst
9. Establish a process of continuous improvement

Industries Best Practices

On the contrary, Waisberg and Kaushik derive a five-step process from industry best practices with the main goal of improving the website and increasing sales [WK09]:

- Define Goals
- Build KPIs
- Collect Data
- Analyse Data
- Implement Changes
- Repeat last two steps

When comparing the two proposed processes, it becomes clear that both focus on identifying and being aware of the most important business goals. The WAA process is a finer-grained and more practical approach, with Waisberg and Kaushik abstracting the main activities.

1.2.4 Log File Analysis and Page Tagging

There are four main methods of collecting data for web analytics: through log file analysis, JavaScript page tagging, web beacons, and packet sniffing [WK09].

As already mentioned in chapter 1.2.2, the two most important methods of data collection are log file analysis and page tagging. In this section I will briefly describe and compare both mechanisms.

Log File Analysis

As already described, the log file analysis is about gaining knowledge from the log file records of the web server. Log file analysis is considered to be the traditional and original approach to web analytics [Mar15], [ZP15]. As soon as the user types a URL into the browser and presses the enter key, the request arrives at a web server. The server then creates an entry in a log file and sends the requested page or resource back to the client in response [WK09]. The information within the log entry can vary depending on the log format, usually IP, browser, time stamp, time required, transferred bytes, whether a cache hit occurs and the referrer is specified [WK09]. The standardized Common Log Format provides host, ident, authuser, date, request, status, bytes, as can be seen in listing 1.1.¹¹

Listing 1.1: CLF

```
127.0.0.1 user-identifier frank [10/Oct/2000:13:55:36 -0700] "GET_/apache_pb.gif_HTTP/1.0" 200 2326
```

Standard formats of log files and entries enable log file analysis software to process, evaluate and report valuable statistics such as *Analog*, *Webalizer* or *AWStats* to users [ZP15].

Below are a few points that describe the pros and cons of log file analysis. The advantages of log file analysis are ([WK09], [NC11], [SKS14], [ZP15]):

- JavaScript and cookies are not required on the client side
- Maintainer of the website and server owns the data
- Bots and web crawler requests are also logged
- History of data is available
- Log entries are reliable
- The standard format of log files enables easy switching of analysis tools
- The web server also logs failed requests

¹¹<https://www.w3.org/Daemon/User/Config/Logging.html#common-logfile-format> [03.06.2021]

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- No modification on the web page needed
- Does not demand more bandwidth

Some disadvantages of log file analysis are ([Mar15], [ZP15]):

- Log entries provide mainly technical information, which may not be very useful for user behaviour analysis. Business related metrics such as bounce rates are not available.
- Only direct requests from the client to the web server are logged: Any user interaction in the web browser that does not trigger a request is not logged. Responses from caches and proxies are also not visible in the web server's log file. Only interactions with the web server are logged.

Page Tagging

In a nutshell, page tagging describes the analysis method used to incorporate JavaScript into the website, which collects data and sends it to an analysis server [Mar15]. To do this, JavaScript must be integrated on every page to be analysed [WK09]. Page tagging is the most important method in web analytics today [ZP15].

Croll provides an illustration (figure 1.1) of the page tagging process which is explained below [CP09].



Figure 1.1: Page Tagging

The client (browser) requests a page from the web server (1, 2). Within the HTML file an external JavaScript resource, the analytics code, is linked and received from the analytics server (3, 4). The analytics script tracks and measures the user behaviour and eventually sends the data back to the analytics server (5, 6, 7).

The data collected can also be stored in cookies, which contain data beyond a session and enable the user to be identified, e.g. the next time he visits the page [KO20].

The advantages and disadvantages of page tagging are as follows, starting with the pros ([WK09], [NC11], [Mar15], [SKS14], [ZP15]):

- Every page visit is counted
- The analytics service is outsourced, which includes the storage of the data, but also the data analysis and reporting
- Page tagging is rather easy to implement and favourable when the analyst does not have access to the web server
- Highly customizable: Everything that JavaScript enables to measure, collect, and track is available. This also includes information about the client such as screen size, device used or color depth.
- Ability to track events and actions such as mouse clicks that do not send requests to the web server. This is especially important for single-page or progressive web applications that do not generate requests as often.
- Mechanics of cookies provide identification of unique and repeat visitors
- Real time reporting is possible

Some drawbacks are mainly privacy concerns and the permission to collect data by the user, that the analysis process relies on the use of JavaScript and cookies that can be disabled by the user [Mar15], that every page that is supposed to collect data must contain the analytics script and due to the use of a third party analytics service it is pretty difficult to switch tools [SKS14].

1.2.5 Web Performance

This chapter gives only a brief overview of the various aspects of web performance. Reference is made below to the appropriate sections that cover the topics in more detail.

As already described in chapter 1.1.3, web performance plays a role that cannot be neglected for user satisfaction and business success. The above studies show that increasing website performance also increases sales, or as Google states it: "Performance plays a major role in the success of any online venture".¹²

The MDN Web Docs identify multiple areas of web performance:¹³

- Reducing overall load time

¹²<https://web.dev/why-speed-matters/> [03.06.2021]

¹³https://developer.mozilla.org/en-US/docs/Learn/Performance/What_is_web_performance [03.06.2021]

1 Introduction and Background

- Making the site usable as soon as possible
- Smoothness and interactivity
- Perceived performance
- Performance measurements

Reducing load time The question of what makes websites slow is covered in chapter X.

Usability and interactivity As I will describe in chapter X, there are several metrics available that attempt to reflect areas of performance such as load time, smoothness, and interactivity, and specific metrics are available as well as for differentiating between technical and user-perceived performance.

Performance perception The perception of performance is generally subjective. As already seen in chapter 1.1.3, there are some quantifiable time intervals that correlate with human psychology regarding the received performance. Table 1.2.5 contains "unofficial rule of thumb" for delay thresholds [Gri13].

| Delay | User Perception |
|-------------|------------------------------|
| 0-100 ms | Instant |
| 100-300 ms | Small perceptible delay |
| 300-1000 ms | Machine is working |
| > 1 s | Likely mental context switch |
| > 10 s | Task is abandoned |

Table 1.2: Rule of thumbs for delay

If one interprets the numbers from the table, one can make the statement that it is desirable to keep loading times below one second. Thresholds for certain performance metrics and the psychological rationale for setting them are discussed in chapter X.

Performance measurements There are several methods of measuring performance. *Synthetic monitoring* is discussed in chapter X. *Real User Monitoring* (RUM) is covered in chapter X.

1.3 Research Question

The e-commerce industry is booming and there are no signs that this trend is reversing; on the other hand. Performance plays an important role in terms of customer satisfaction and how this directly affects business revenue. To better understand e-commerce website visitors, page tagging is widely used and implemented.

Several questions and issues can arise in this area and context, such as: Does page tagging affect the website's performance? Intuitively, it can be said that loading additional JavaScript will reduce the performance of the website, depending on parameters such as the script size and network condition. But are there more unpredictable side effects? Do the various techniques of embedding a tracking script affect the data collected and measured? Will the various tracking scripts supplied interfere with each other?

A hypothesis of this work is that tracking tools slow down the monitored websites, reduce the speed and performance of the website and thus have an unfavourable effect on the user experience.

These questions are to be investigated within the scope of this thesis.

1.3.1 Goal

This thesis has several goals:

The Internet and websites in general are complicated, complex, and tangled. Although basic HTML structures are standardized, each website follows its own form and is unique and sui generis. In order to conduct a controlled experiment and test hypotheses, one goal is to approximate real websites with an artificial, laboratory-generated website that is completely controlled and manipulated by the researcher.

The aim is to create a reliable, but also convincing test environment in order to model and reproduce real behaviour.

Once the test environment is up and running, performance measurement issues need to be addressed. The aim is to measure, collect, visualize and analyse performance data.

As we will see in chapter X, there are many metrics for measuring performance. Another goal of this work is to establish something like a taxonomy of performance metrics.

1.3.2 Chapter Outline

[tbd]

Chapter 1 was about... In Chapter 2 we see, Chapter 3...

2 Metrics and Measurement Methods

[tbd]

[Last chapter]

[This chapter]

[Relevance of this chapter for research question]

[Next chapter]

[Outline of this chapter]

2.1 Technical Background of the Website Loading Process

In order to understand web performance metrics and the methods to measure them, it is crucial to have a basic understanding of the technical aspect of the loading of a website into the browser. This process includes establishing a connection between a client and a server, which will be discussed in section X, and the task of the browser to transform the received data from the server into a readable ready-to-use website, which will be discussed in section X.

It is possible to divide the website loading process into three entities. In his code talk 2016, Witt identifies three main areas of the website loading process: The Front End, the Back End, and the Network. The Front End is everything the user sees on the screen, client, UI, browser, sends requests to a back end, etc. The Back End is the logic, server, also data base, handles requests and sends responses to a front end Network is what connects clients and servers, FE and BE, infrastructure element composed of routers, cables, wireless connections etc.

The main steps can be divided into networking, that is, establishing a connection with DNS etc., backend processing, e.g. data base queries etc., and the rendering in the front end, as seen in image X. The last part of this process is when browser receives finally the HTML / Document. How the browser transfers the HTML into an interactive website is part of the next section.

- BE is not discussed (server time, data base, etc.) - Section X is about Network - Section X is about Front end: how browser works, crp, - How to optimise websites is not part of this thesis

Focus and perspective is performance, like in overall thesis. Also when explaining the technical background, I will keep the aspect of performance in mind.

Once I discussed the processes in the network and the front end, I will move on to the question of how to measure the performance of those processes, and which metrics are



Figure 2.1: Timing Overview

available to quantify the performance.

2.1.1 The Website Loading Process in the Network

[tbd]

The network is... Starting from hardware, ISP, routers, switches etc and the cables connecting them. But also communication protocols such as the Internet protocol suite.

Regarding performance, latency and bandwidth come into mind, and we will see that latency has a bigger impact on performance than bandwidth in section X.

After discussing this issue, i will continue by describing the process or navigation steps which happen once the user enters a URL into the browser, up until he sees pixels on his screen and can use the website.

Latency and Bandwidth

There are two important attributes when discussing network performance: Latency and Bandwidth. The important thing to say here is that Latency is bottleneck for performance, and not bandwidth.

Bandwidth is the "maximum throughput of a logical or physical communication path". In other words, bandwidth describes the amount of data which can be sent in parallel from one node in a network to another. Physical communication paths are most likely cables such as metal wires or fiber-optic cables, where fiber-optic cables have less signal loss, and lower lifetime maintenance costs. With methods such as wavelength-division multiplexing (WDM), it is possible to transmit up to 70 Tbit/s over a fiber-optic connection. This high technology stuff is only used in the backbone infrastructure, e.g. for connecting Europe with America. For the end user, bandwidth is much lower, and the average was in late 2015 just 5.1 Mbps A high bandwidth is useful for bulk or large data transfer such as streaming of video or audio. But for loading a website, or any browser activity that depends on many requests that fetch data from many different locations around the globe, the performance bottleneck is latency.

Latency is "the time from the source sending a packet to the destination receiving it". Latency is measured in seconds and can be the time spent for one-way, or more common, how long it takes for the transmitted data package for the round-trip time (RTT), from

2.1 Technical Background of the Website Loading Process

source to destination and back. In other words, latency "describes the amount of delay on a network or Internet connection". For the very first request when establishing a connection, latency is longer due to protocols such as DNS lookup, TCP and TLS handshakes. Those will be discussed in section X.

To get an idea about how the two aspects, bandwidth and latency, impact web performance, Mike Belshe launched a study. Once setup has a fixed latency and bandwidth is variable, and vice versa. He and compared the performance of the two experiments using the Page Load Time metric. (cf. X for this metric)



Figure 2.2: Latency vs Bandwidth

We can see that the impact of bandwidth is trivial: if the available bandwidth is doubled, e.g. from 5 to 10 Mbps, there is no change in performance load time. For Latency on the other hand, the picture is different: If the latency can be decreased by half, e.g. from 120 ms to 60 ms, the page load time also sinkt um die hälfte. Or as Belshe states it, "[reducing] cross-atlantic RTTs from 150ms to 100ms [...] would have a larger effect on the speed of the internet than increasing a user's bandwidth from 3.9Mbps to 10Mbps or even 1Gbps."

This observations can be explained with the many short, small connections and requests are made when browsing websites and the contrary underlying structure of the communication protocols, which are "optimized for long-lived connections and bulk data transfers. " But just simply decreasing the latency is not straightforward: The speed of data transfer is already at a 2/3 of light, but the physical constraint is the limiting factor, e.g. there is a minimum distance between London and New York which can not be further "optimized".

Another aspect of latency is that for wireless connections and therefore mobile devices, latency is even higher, "making networking optimization a critical priority for the mobile web." This is due to the infrastructure of mobile nets, latency is high for mobile users. cf. Why are mobile latencies so high? in Grigorik

As latency is a important factor, what happens on the front end is still important. And

again for this thesis metrics measuring performance in the front end are the focus.

Before i will discuss what happens in the browser once the website data arrived, i will briefly describe the preceding steps of establishing a connection between the browser (client) and the server, which can be considered to be still a part of the network.

Network Navigation Steps

[tbd]

I will explain briefly the main navigation steps: It begins when the user is submitting a URL in the browser and ends when he received website data.

"To start, it is important to recognize that every HTTP request is composed of a number of separate stages (Figure 10-3): DNS resolution, TCP connection handshake, TLS negotiation (if required), dispatch of the HTTP request, followed by content download."

DNS Lookup When the requested resource can not be loaded from the browsers cache, the first step to establish a connection is a DNS Lookup (or DNS Resolution).

This step is about translate URL to IP address. Must be done for each unknown URL, e.g. when linked images within a website are from different server, for each unique URL DNS Lookup has to be done. The mapping of URL to IP can be cached by browser, which makes repeated views faster.

Avg. time is 20 and 120 ms

TCP Handshake Once a connection between a client and a server is established, the TCP 3-way-Handshake comes into play.

The goal of TCP is to establish a reliable connection within an unreliable network. TCP "guaranteed that all bytes sent will be identical with bytes received and that they will arrive in the same order to the client. " Regarding performance, the handshake adds two more round trips, which is bad for performance as we have seen because of latency.

Many algorithms and techniques to get optimal data transfer and also avoid congestion are existing, such as Slow-Start. Slow-Start is an algorithm that determines the maximum bandwidth that can be used by gradually increasing the amount of data sent. Slow start prevents that the full capacity of the network is being used from the beginning, which in performance terms adds again more round trips and latency.

For a detailed discussion cf "Building Blocks of TCP" in 2013 Grigorik

TLS Negotiation TLS is another protocol which has the goal to establish a secure connection in terms of data encryption. Data transmitted over the network has to be encrypted so that aussenstehende can not read or manipulate the data. For encryption, a cipher to be used needs to be established, which will be shared between client and server during the TLS Negotiation.

TLS again adds more round trips which is bad for performance.

for a detailed discussion see Transport Layer Security (TLS) in 2013 Grigorik

HTTP Request and Response Now that a secure connection is established, the client fetches the first resources via HTTP GET request. Most often, the server will respond by sending back the index.html file, which then can be used by the browser to build the website.

The time when this first response containing the first byte for building the web site is reflected in the metric TTFB which is discussed in section X.

Usually, many more resources are requested by the browser to complete the build of the web site. As of today, the median value is about 70 requests per web site.

A request is not the same as a connection. Once the connection is established via the above described procedures such as DNS lookup, TCP and TLS handshakes, multiple requests can be transmitted over the same connection. Usually, the number of requests is much higher than the number of connections to load a website, as the browser persist connections, keep them open for multiple requests. Median connections for a web site today is about 13. Modern browsers like Chrome enable up to six open connections in parallel.

At this point, the browser has received the first data about the web site and he can start with rendering the page. How this exactly happens, is explained in the next section.

2.1.2 The Website Loading Process in the Frontend: Critical Rendering Path

This section explains what happens after the first bytes of the web sites arrived in the browser. The following processes are typically subsumed under the term *Critical Rendering Path* (CRP). The CRP is the last part of the navigation process as seen in image X.

The CRP is the minimum steps that the browser has to take from the moment it receives the first byte of HTML to the moment that it renders pixels on the screen for the first time.

The rendering is critical as it is the very first render, the first visible content the user will see on the screen. The resources that are needed for the first render of the page delay the first render of the page are considered to be critical. Without the critical resources, the browser can not display content on the screen. An example of a critical resource is the first HTML file the browser receives, as without it, nothing is visible on the screen. Non-critical resources on the other hand will not stop the browser from displaying the first content on the screen.

There are a sequence of steps the browser goes through to render the page. The basic idea is to convert HTML, CSS and JS to actual pixels on the screen.

Image X visualizes the flow of the CRP: Once the HTML is received, the browser starts with parsing the HTML and translate it into the DOM. The content of the CSS files will be parsed to the CSSOM. JavaScript needs to be fetched and executed. Once DOM and CSSOM are available, the Render Tree is being created. When the Render Tree is available,

Layout is happening. Finally, pixels can be printed on the screen.

In the following, the individual steps will be discussed in more detail.

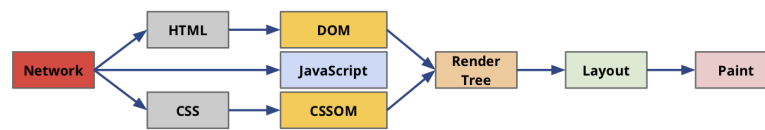


Figure 2.3: Critical Rendering Path

DOM Construction from HTML Once the browser received the first bytes of the HTML file, it starts to parse it into the *Document Object Model* (DOM). The DOM construction is the first step the browser performs when receiving data. The DOM is a tree structure and internal representation of the HTML for the browser. The general parsing process consists of translating from bytes to characters, to tokens, to nodes and finally to the object model. The specification of the DOM is maintained by the WHATWG living standard.

The DOM tree contains information about the content of the document, but not its style. The styling is defined in the CSS. Once HTML and CSS are transmitted and processed by the browser, the *Render Tree* can be created, which reflects the actual information and its styling the browser can display. Within this context, it is possible to categorise resources into render blocking and non-render blocking. A render blocking resource is a resource that prevents the browser from rendering content to the screen. HTML and CSS are render blocking resources, as the parsing process of those files blocks the browser of displaying the page to the screen.

As soon as the first data packages of HTML arrive at the browser, the parsing process starts. The DOM is created incrementally, this means that the browser can begin to process the HTML before all of its content is transmitted over the network.

Usually, within the HTML, external resources are linked which are necessary for the website to be complete, such as CSS or JavaScript. While parsing the HTML incrementally, eventually a reference to such an external resource will be encountered. How the external resources CSS and JavaScript are being handled by the browser is discussed below.

CSSOM Construction from CSS The CSS resource contains all information about the styling of the page. As with the HTML, CSS is converted from bytes to characters, to tokens, to nodes, and finally to the *CSS Object Model* (CSSOM). CSSOM construction is usually very fast. CSSOM is standardized here

As opposed to the HTML parsing process, CSS can not be translated to the CSSOM incrementally. Cause it the cascading nature of style sheets, which has the potential that the styling rules defined at the top of the file may be overridden by rules defined at the

very end of the CSS file. A partial CSSOM is therefore not possible. Hence the browser needs the entire CSS file before he can create the CSSOM.

As soon as the parser encounters a reference to an external style sheet such as

```
<link rel="stylesheet" href="styles.css">
```

it requests the resource and continues with parsing the HTML. CSS is not a parser blocking resource. When the CSS arrived at the browser, the CSSOM construction starts.

While CSSOM creation is not parser blocking, it is render blocking. The browser blocks the page rendering until it received and parsed all of the CSS. Rendering content to the screen is only possible when CSSOM and therefore CSS is available.

Once the DOM and CSSOM are created, they can be merged together into the render tree, which will be layout and painted to the screen. Before I describe this process, I will discuss how JavaScript is being handled.

JavaScript in the CRP JavaScript (JS) resources add functionality and interactivity to a web site. When the browser encounters a script tag such as

```
<script src="myScript.js"></script>
```

it will stop its current task of parsing, fetch immediately the resource and execute its content, and only then proceed with the creation of the DOM. See image X.

JS can manipulate and query the DOM tree and directly change the HTML file. As the HTML file is the input stream for the parser, the parser stops until the JS is downloaded and executed. Hence JS is parser blocking. JS fetching and execution stops the parsing of the HTML and the construction of the DOM. Only after the script finished execution, HTML parsing will continue.

Implicitly, because JS execution blocks DOM creation, and HTML processing itself is render blocking, JS is also render blocking.

The behaviour is the same for an external references JS file and a script directly added within in the HTML.

As JS can also manipulate the styling of the page, its execution is blocked until the CSSOM is available. This means that the execution of the JS is on hold until the CSSOM is ready. To summarize, while JS blocks the parsing of the HTML to the DOM, JS execution itself is blocked by the creation of the CSSOM. CSSOM blocks JS, and JS blocks DOM construction.

Several attributes on the script tag can change the behaviour of the browser. *Async* and *defer* are options to counter the blocking nature of the script tag. They will be discussed now.

With the *async* (asynchronous) attribute, the browser downloads the JS in the background while continuing with the parsing of the HTML. The parsing is not blocked and the browser can continue with his task. As soon as the JS is downloaded and available, it is parser blocking: the browser stops the parsing and executes the JS.

2 Metrics and Measurement Methods

The order of all the async scripts within the document is not maintained any more. Whenever a script is downloaded and available, it will be executed. It does not matter if an async script was included at the top or bottom of the HTML document.

Like with async, scripts with the defer attribute enable the browser to download the script in parallel while continuing with the parsing of the HTML. Contrary to async, defer scripts will only be executed after the parsing of the page is complete and the DOM tree is fully constructed, and the order of the scripts will be maintained.



Figure 2.4: Scripts

The async and defer attributes not applicable on inline scripts. The HTML standard states that "scripts may specify defer or async, but must not specify either unless the src attribute is present. " As inline scripts do not contain a src attribute, as the source of the script is within the script tags and not external, the async and defer attributes are not applicable.

Building the Render Tree As already described above, HTML and CSS are both render blocking, as they prohibit the rendering of the page. Rendering can happen once the *Render Tree* is available. The render tree is the combination of the DOM and CSSOM and captures all visible content with its styles which will be displayed on the screen. If an element has a CSS property such as `display: none;` it will not occur in the render tree.

The computed render tree is then used to layout the content to the page.

Layout In the layout process, the position and size of the nodes from the render tree are calculated. New layout calculations or reflows are triggered as soon as the screen area changes, e.g. by device rotation or window resizing, or on modifications of the DOM and render tree.

Once the layout is resolved, the browser continues with painting pixels on the screen.

Paint Finally, the browser can paint the content on the screen. If some content changes, browsers are optimized to only repaint areas on the screen affected.

2.1.3 Technical Background Conclusion

[tbd]

Network, BE and FE. Network: Latency and Bandwidth, Navigation steps FE: CRP

[Link to next section] Why was this section important for research question? How is it connected to measurement methods and metrics?

2.2 Measurement Methods

[tbd]

Last section: At this point we have an understanding of how web sites are being loaded into the browser and displayed to the user. Some of the steps are more important for performance than others. In this section, I will describe how to measure the performance of a website.

[Link to Research Question]

Multiple methods for measuring website performance exist. The prominent ones are synthetic monitoring and real user monitoring. They will be discussed below.

Some other methods are mentioned in the last section.

After discussing measurement methods, I can finally discuss the metrics we want to measure.

2.2.1 Synthetic Monitoring

The "Synthetic" Aspect in Synthetic Monitoring

As the name already suggests, synthetic monitoring is a measurement method performed in an artificial, laboratory-like, synthetic environment. Test agents simulate real users and are configured to run a browser, load the web site under observation while capturing performance data. Synthetic monitoring does not take real user traffic into account.

Performance data can be captured using common performance APIs as described in section X. Additionally, through video recording and analysis, user centric metrics such as Speed Index can be computed (see section X.)

In synthetic monitoring, many possible configurations and variables of the test agent (client) are under control, such as the location (geography), network conditions, device type, browser version, and so on. Hence, the tester has control over many variables that impact performance.

The controlled environment makes it possible to capture performance data for a specific set up of configurations, such as the test agents location or browser version, which may help to identify issues regarding certain user segments. For example., a test could check the performance of all users using Firefox running on macOS in Germany.

Apart from defining the technical configuration such as browser version or network condition, the tester can also define artificial user journeys to simulate real user behaviour.

A characteristic of the controlled environment is that measured data and test results are rather consistent with low variability and can therefore provide a performance base

line for the web site under observation and facilitate performance tuning.

Synthetic Monitoring is not about Real Users Synthetic monitoring does not capture data of real users as the web sites traffic is generated artificially. Real user behaviour is approximated through simulation of users by for example predefining user paths. The measured performance data does not necessarily reflect actual real user experience and the tester should not assume that "synthetic results are like real-user metrics".

Capturing the wide variety and diversity of real-world users such as which pages they visits,, the general configuration of the users machine such as the CPU, GPU and memory performance, what data stores the browser cache and which browser version is being used, the screen size, the operating system, and the network connection to name a few, is difficult to represent in synthetic monitoring. The selected test configuration in synthetic monitoring only reflects one special use case and can only approximate what a user with a similar set up may experience. In short, synthetic monitoring test results "are synthetic and therefore not representative for actual user data".

The "Monitoring" Aspect in Synthetic Monitoring

Synthetic monitoring can be automated and used to monitor a systems performance in real time while generating up to date reports for the systems maintainer. Monitoring enables to check the availability of the web site around the globe, to identify performance issues before real users are aware of them. and is in general helpful for continuous "health checks" of the running system.

As any web site can be tested synthetically, it is possible to compare performance data across multiple competitors.

Many synthetic monitoring tools exists (For a list of tools, see for example 2016 Kaur or some online resources here). WebPageTest is one of them and will be discussed in section X.

Coming back to e-commerce context, as discussed in section X. a online shops performance correlates with the revenue. Synthetic monitoring allows to capture performance metrics independent of real user behaviour. Real user behaviour is not measured in synthetic monitoring. As only real users are capable of generating revenue, synthetic monitoring can not identify correlations between user satisfaction and performance (as described in section X.).

In order to do this, RUM is needed. Real-User Monitoring (RUM) enables to capture data of each individual real user . RUM will be discussed next.

2.2.2 Real-User Monitoring

As the name suggests, Real-User Monitoring (RUM) is about collecting and measuring data from real users visiting the web site. As opposed to synthetic monitoring, where web site traffic is generated artificially and performance experience from real users is

only approximated, RUM data relies on real user traffic and captures data directly from each users browser. RUM measures the performance as experienced by the users.

The Page Tagging Technique in RUM

As already described in section X. Page Tagging is a technique to instrument the users browser in order to collect data and report it back to an analytics server. RUM is based on page tagging, in terms of that it relies on a JS code snippet (tracking or code) which will be loaded into the users browser. Once this JS code is loaded and executed in the browser, it collects data and sends it back to an analytics service. If the user blocks JS, or the script can not be downloaded due to other reasons, RUM will not work. Once the data arrives at an analytics service, it has to be stored and an interface for the analyst has to be provided in order that he can query the data and get insights, for example by providing a dashboard.

As RUM relies on the JS code, the very first opportunity to measure data is when this JS code has been downloaded and executed. Anything what happens before this step is not visible for the tracking script and therefore the analyst. Meenan states that approximately 20 % of the loading process lies outside of the RUM measurement scope and "getting a reliable start time for measurements from the real world has been the biggest barrier to using RUM".

Another facet of RUM is that ideally the measuring of data has as little as possible impact on the web sites rendering process and that network capacity should not be occupied by RUM scripts and block resources of the CRP (see section X.) If RUM, as a page tagging technique, is slowing down the web site under observation, is one research question of this thesis. The evaluation of the controlled experiment tackling this questions states that RUM..., as discussed in great detail in section X.

RUM is independent of the users set up or environment and collects data for all active users: Regardless of the device, the browser, the network condition or the geographical location of the user, as long as the measurement script is downloaded into the users browser, RUM collects data. Hence, RUM data represents each individual user experience.

Through the diversity of users and the unique environment of each user, RUM data tends to be more diverse and heterogeneous than data collected by synthetic monitoring.

RUM Measures Behaviour of Real Users

As discussed in section X, a web sites performance and user satisfaction are directly correlated. A critical part of RUM is to not only capture performance metrics, but also measure user behaviour, for example how the user interacts with the web site and where he clicks. In an e-commerce context, user behaviour questions of interest are for example if a new campaign changes user behaviour as expected or where users leave the check out process.

2 Metrics and Measurement Methods

RUM facilitates the combination of collected metrics with user behaviour and business KPIs and can answer questions such as if and how the performance of the web site affects the user behaviour, for example if users buy more or less depending on the web sites speed. Thus RUM is not only important for understanding user behaviour, but also for optimizing the web site and to increase revenue. With techniques such as cookies (see section X.), it is also possible to track user behaviour not only for one page load but over a series of web site visits, leading to even more detailed insights about the visitor.

Multiple RUM tools and JS libraries exists, such as Boomerang by Akamai.¹ The main player Google Analytics will be discussed in greater detail in section X.

Google collects RUM and browser data of chrome users agreed to do so. The data is accessible through the Chrome User Experience Report (CrUX) and will be discussed next.

Chrome User Experience Report (CrUX)

The Chrome User Experience Report (CrUX) is a RUM method implemented by Google which collects real user data of Chrome users. As soon as the Chrome user gives his consent, data collection can start and does not need any more set up.

The CrUX only captures data from Chrome users and is therefore not an exhaustive sample of the web users population, as data by users browsing the web with for example Firefox or Safari is not collected.

The collected data is available via Googles PageSpeed Insights, the CrUX Dashboard or the BigQuery and CrUX API.

2.2.3 Log Files and Surveys

[tbd]

Other methods are surveys and log file analysis.

2.2.4 Measurement Methods Conclusion

Multiple methods to measure performance of a web site exist. Two main complementary techniques exist, Synthetic Monitoring and Real-User Monitoring.

Synthetic Monitoring measures a web sites performance in a controlled environment using test agents and is especially useful to find a performance base line of the web site and for continuous monitoring and health checks. Performance as end users may experience it can only be approximated it is not captured by synthetic monitoring.

RUM collects data from each user visiting the web site and reports it back to an analytics server. RUM is especially useful when combining multiple metrics together such as performance and business metrics in order to analyse user behaviour. On the other hand, when no user is visiting the web site, RUM is not collecting any data.

¹<https://github.com/akamai/boomerang> [23.06.2021]

Other performance measurement methods such as CrUX and surveys provide browser specific or quality data and complement the analysts tool box.

| Synthetic Monitoring | RUM |
|-----------------------------|---------------------------------------|
| Artificial test agents | Real users |
| Controlled configuration | No control over configuration |
| Approximates real user data | Collects real user data |
| For monitoring | Links user behaviour to business KPIs |

Metrics are critical in order to map performance to some sort of value or number. Through metrics, performance is quantifiable to some extent and therefore comparable.

As already described, measurement methods such as synthetic monitoring or RUM can measure metrics such as "performance" or "business" metrics. What are does metrics exactly? What do they reflect? How can they be measured?

Those questions will be addressed in the next section.

2.3 Metrics

[tbd]

[Link to Research Question]

Through metrics, performance is quantifiable, as metrics reflect performance in numbers. Once performance is mapped to numbers, they can be compared with each other, for example over time, after a change in the measured application, or with numbers of a competitor. Through their performance quantification, metrics facilitate the analysis of website traffic. Specific metric values can be used as a target for goal achievement and are therefore a critical instrument for improving websites. Ideally, metrics are precise and serve as objective criteria for the evaluation of the measured website.

The relevance of metrics is crucial. Just as each website is unique and has a different purpose, so should metrics be which quantify the website. It is important to measure what is important and relevant for the users and reaching business goals, while "each business has its own definitions of success". Hence, metrics are ideally tailored and custom to the website.

Metrics are only helpful when they are useful. That implies that the collection and measurement of metrics should be consistent and their representation should be user-friendly and understandable. Kumar states that ideally, good metrics are uncomplex, relevant, timely, and instantly useful.

[Section Outline]

2.3.1 Business or "Non-Performance" Metrics

[tbd]

Quick explanation about the term business metrics. Unlimited metrics, also when thinking about custom metrics. The main question here is how to categorize those metrics. One approach is: numerical values, Relations, non-numerical values

Possible Categorizations of Business Metrics

Categories help to better grasp and comprehend metrics, and they can provide structure and order. Following are some examples of business metrics categorizations as they are presented in literature.

Peterson arguments from a marketing perspective and categorizes the metrics according to the customer life cycle, which includes the phases reach, acquisition, conversion, and retention.

Metrics for measuring *Reach* are for example number or percentage of new visitor. *Acquisition* contains metrics such as average number of visits per visitor or average pages viewed per visitor. The category *Conversion* includes metrics such as conversion or abandonment rates. And the last category *Retention* includes metrics such as the number of returning visitors. This proposed categorization is highly customer-related and customer-centric and from a marketers perspective.

The Web Analytics Association defines three types and accordingly categories of metrics: *Counts*, *Ratios* and *KPIs*, Where counts are metrics which are single numbers like the number of visits, ratios consist of counts divided by other counts, such as page views per visit. KPIs are counts or ratios with a specific meaning and importance for the specific business.

Jansen defines four categories for web analytics metrics: *Site Usage*, which encompasses metrics such as demographics and system statistics, but also visitor length and type, *Referrers*, that are metrics describing the referring URL, *Site Content Analysis*, which includes metrics such as top pages or visitor paths, and *Quality Assurance* with metrics reflecting errors or other quality aspects of the measured system.

Croll arguments that all metrics answer at least one of four user-centric questions: *What did they do?*, *How did they do it?*, *Why did they do it?*, and *Could they do it?*. Accordingly, the metrics are categorised by the question they answer.

Bekavac organizes the metric according to what they describe: *Visits*, such as entry or exit page, *Visitors*, such as the metrics capturing new or returning visitors, metrics such as page exit ratio or bounce rate which describe *Visitor Engagement*, and metrics describing *Conversions* as the conversion rate.

Hassler proposes a classification which is close and similar to the WAA proposed categorisation. The metrics are ordered by their type: *Counts* are absolute values like visitors or total sales, *Relations* put counts into relation for example as percentages, such as page

views per visitor, and *Values* include non-numerical metrics such as referrer or search term.

Gessert et al. propose a semantic categorization of metrics, they structure the metrics according to their meaning and their domain membership. The categories are *Performance*, which includes performance metrics such as Time to First Byte or First Input Delay (see section X.), *User Engagement* metrics such as the session length or the bounce rate, *Business KPIs* such as the cart size or the amount of transaction, but also conversion rates and revenue, and *QA Metadata* which subsumes technical metrics like JS errors or the browser distribution.

| | |
|------------------|---|
| Value-Driven | {Counts, Ratios, KPIs}, {Counts, Relations, Values} |
| Semantic-Driven | {Performance, User Engagement, Business KPIs, QA Metadata}, {Site Usage, Referres, Site Content Analysis, Quality Assurance} |
| Marketing-Driven | {Reach, Acquisition, Conversion, Retention}, {Visits, Visitors, Visitor Engagement, Conversions} |

As described above, multiple categorizations of metrics are proposed in literature. While some authors group the metrics by their type of value, e.g. if they count something or represent a ratio, others use a more semantic approach and group the metrics by their meaning, with some extreme examples by authors which group only through a marketing perspective.

In the following, I will list some metrics and provide brief explanations, following the categorization of counts, ratios and values. After that, I will take a look at metrics which are specific for performance.

Business Metrics Examples

Table X provides web analytics metrics which are not directly concerned with performance. The categories used to structure the metrics are Counts,

Ratios

and Non-Numerical Values,

Counts describe how many Can be measured Over time: last hour, month, from to, etc.

Averages are possible Compare with Segmentation

Ratios are a combination of numerical values. As Ratio or Percentage

Non-Numerical Values can not be reflected as number.

| Counts | |
|--------------------|---|
| Hits | Represent amount of requests to the server. |
| Visits or Sessions | Count how many users view the website |
| Session Length | How long the session endures |
| Page Views | How often a page has been viewed |

2 Metrics and Measurement Methods

| | |
|---|---|
| Single Page Visits | Sessions where one page has been viewed |
| New / Unique / Repeat / Return Visitors | ... |
| JS Errors | ... |
| Cart Size | ... |
| Conversions | ... |
| <i>etc.</i> | |
| Ratios | |
| Conversion Rate | ... |
| Bounce Rate | ... |
| Abandonment Rate | ... |
| Page Views per Visitor | ... |
| New Visitors Percentage | ... |
| Visits per Visitor | ... |
| Page Exit Ratio | ... |
| Click Through Rate (CTR) | ... |
| <i>etc.</i> | |
| Non-Numerical Values | |
| Demographics | ... |
| Referrer | ... |
| <i>etc.</i> | |

Table 2.1: Business Metrics Examples

List is not complete. Now we move to performance specific metrics. As performance is directly connected to time, most of those performance metrics are measuring a times-tamp. Some are also displaying a score. This will be discussed.

2.3.2 Performance Metrics

[tbd]

Business metrics was about... Performance metrics is about...

No official definitions Still there are informal standard Implementation can vary between tools who measure metrics

As with general web analytics metrics, there are multiple ways to categorize performance metrics.

- network-centric, browser-centric, and user-centric metrics

For me most intuitive is

Metrics regarding Page Weight and size of the web site Timing Metrics, how long each step from the CRP took UX Metrics, try to reflect how users experience performance, visual metrics Custom Metrics

Page Weight

- one approach of making the website quantifiable - measure the size of the web site - Page weight has an impact on performance - Page consists of resources - More resources and bytes means more requests, downloads and waiting time

- Website consists of resources - Measure bytes of each resource - Measure how many requests are needed to fetch all resources - Total Size: Number of bytes sent over the network, which may be compressed

Bytes and Requests of following resources:

| | | | |
|--------|--------|--------|-------|
| HTML | CSS | JS | Fonts |
| Images | Videos | Others | Total |

In approach section, i used this data to come up with a median web site. In this section are also some numbers available.

Performance Timings Metrics

Web Standards - in 1994, TimBL founded the World Wide Web Consortium (W3C), an organization that brings together representatives from many different technology companies to work together on the creation of web technology specifications

Web Standards: - technologies we use to build web sites - standards exist as long technical documents called specifications - detail exactly how the technology should work - to be used by software engineers to implement these technologies (usually in web browsers) - For example, the HTML Living Standard describes exactly how HTML (all the HTML elements, and their associated APIs, and other surrounding technologies) should be implemented. - Others WHATWG (who maintain the living standards for the HTML language), ECMA

W3C What is W3C

W3C publishes documents that define Web technologies. These documents follow a process designed to promote consensus, fairness, public accountability, and quality. At the end of this process, W3C publishes Recommendations, which are considered Web standards.

e.g.DOM, HTML, SVG, ...

- Recommendation track: Publication of the First Public Working Draft. Publication of zero or more revised Working Drafts. Publication of one or more Candidate Recommendations. Publication of a Proposed Recommendation. Publication as a W3C Recommendation.

- From Idea to concrete API which browser maintainers implement
- Working Draft (WD) - Candidate Recommendation (CR) - Proposed Recommendation - W3C Recommendation (REC)

2 Metrics and Measurement Methods

Web Performance Working Group Multiple groups exist which are responsible for a specific topic. Performance working group is responsible for performance.

- In 2010, the browser vendors got together under the W3C banner and formed the Web Performance Working Group to standardize the interfaces and work toward improving the state of Web-performance measurement and APIs in the browsers - Clock issue -> High Resolution Time specification

- WebPerf Working Group (founded 2010) - "Provide methods to measure aspects of application performance of user agent features and APIs"

- Working Groups push new recommendations and invent them Web Performance Working Group is responsible: - Measurement - Scheduling - Adaptation -> Important is Measurement

Normative Specifications: - High Resolution Time - Performance Timeline - Resource Timing - Navigation Timing - User Timing - Page Visibility - Long Task - Paint Timing

Server Timing:

- attempt to address the concern about lacking insight into how or why certain stages of the request-response cycle have taken as much time as they have

others, not important for metrics: - Beacon - Cooperative Scheduling of Background Tasks - Device Memory - Reporting - Network Error Logging

Now I will take a closer look at Navigation, Resource and User Timing and which metrics are derived from there. But start with time.

High Resolution Time "Level 2" is older but already recommendation from date Newest spec from date is working draft

Is the basis for other specs

- Old: Date from ECMAScript: Date object as a time value representing time in milliseconds since 01 January, 1970 UTC - DOMTimeStamp is defined similarly - definitions of time are subject to both clock skew and adjustment of the system clock - The value of time may not always be monotonically increasing and subsequent values may either decrease or remain the same. - resolve issues by providing monotonically increasing time values with sub-millisecond resolution

- Clock issue -> High Resolution Time specification

- Non-Decreasing - Earlier: Date object -> Its relative to start of navigation instead of 1. January 1970 UTC as JS Date Object

- sub-millisecond resolution - provide a monotonic, uniformly increasing timestamp suitable for interval measurements

- performance.now() is a measurement of floating point milliseconds since that particular page started to load -> the performance.timing.navigationStart timestamp to be specific - number stays relative to the page because you'll be comparing two or more measurements against each other

- type definition - used to store a time value in milliseconds, measured relative from the

time origin, shared monotonic clock, or a time value that represents a duration between two DOMHighResTimeStamps

- type - double - store a time value in milliseconds, accurate to 5 microseconds - describe a discrete point in time or a time interval

- now() - timeOrigin

Navigation Timing - access the complete timing information for navigation of a document - Navigation is about how user agents convert the requested HTML, CSS, and JavaScript into rendered pixels, which is one of the most critical steps for users to navigate a document

- complete client-side latency measurements

- Navigation timings are metrics measuring a browser's document navigation events - measures the main document's timings - read only - supported in all browsers - measuring the performance of the main page, generally the HTML file via which all the other assets are requested

- navigation timing measures the main document's timings - The real benefit of Navigation Timing is that it exposes a lot of previously inaccessible data, such as DNS and TCP connect times, with high precision (microsecond timestamps), via a standardized performance.timing object in each browser. - Hence, the data gathering process is very simple: load the page, grab the timing object from the user's browser, and beacon it back to your analytics servers! - By capturing this data, we can observe real-world performance of our applications as seen by real users, on real hardware, and across a wide variety of different networks. - Navigation Timing provides performance timers for root documents only

- The largest benefit of navigation timing is that it exposes a lot of timings that lead up to the HTML loading -> This is this famous image - In addition to providing a good start time, it exposes information about any redirects, DNS lookup times, time to connect to the server, and how long it takes the Web server to respond to the request, for every user and for every page the user visits - The measurement points are exposed to the DOM (Document Object Model) through the performance object and make it trivial to calculate load times (or arbitrary intervals, really) from JavaScript.

- Level 1 PerformanceTiming and PerformanceNavigation Interface, Both are collected in Performance Interface, Performance Interface is accessible through window.performance

- Level 1: time is measured in milliseconds since midnight of January 1, 1970 (UTC).

- Level 2: Navigation Timing 2 specification allows access to timing information related to navigation using sub-milliseconds resolution instead

- Level 1 kept for backwards compatibility - Level 2 is working draft from march 2021 and replaces first version of Navigation Timing - See summary of improvements for differences between level 1 and 2 - Level 2 is Builds on top of Resource Timing 2 and uses high resolution time 2

2 Metrics and Measurement Methods

- level 2 specification defines the PerformanceNavigationTiming interface - we will see later in X which attributes are available

PerformanceNavigationTiming Interface: - extends PerformanceEntry Interface from performance timeline. see attributes section for details - extends PerformanceResourceTiming Interface from resource timing

- window.performance.getEntriesByType("navigation")

Resource Timing - Level 1 is candidate recommendation from march 2017

- Level 2 is working draft from april 2021 - access the complete timing information for resources in a document. - Navigation Timing 2 extends this specification to provide additional timing information associated with a navigation. - mechanisms to provide complete client-side latency measurements within applications

- set of attributes for each loaded resource - access a set of critical network timing attributes for each resource on the page - resources usually refer to HTML documents, XHR objects, links (such as a stylesheet) or SVG elements

- resource timing measures timing for individual resources, the assets called in by the main page, and any assets that those resources request - Many of the measurements are similar to navigation timing

- retrieval and analysis of detailed network timing data regarding the loading of an application's resources - determine, for example, the length of time it takes to fetch a specific resource like request, svg, image, script

- Resource Timing provides similar performance data for each resource on the page, allowing us to gather the full performance profile of the page. - resource timing provides the times for all the assets or resources called in by that main document and the resources' requested resources.

- exposes timing information about every network request the browser had to make to load a page and what triggered each request (whether stylesheet, script, or image)

- PerformanceResourceTiming interface

- performance.getEntriesByType("resource"): array of Resource Timing Objects for each requested resource - The PerformanceResourceTiming interface extends the PerformanceEntry interface in the Performance Timeline - Each of these timestamps is in microseconds, which are provided by the window.performance.now() method in the High Resolution Time specification.

- APIs used to create waterfall charts - Waterfall we can see in more detail in WPT section ?

- Any time you've seen a waterfall chart, you're looking at a visual representation of the data these APIs provide

Attributes from Navigation and Resource Timing As both specs are tightly coupled, e.g. resource timings is in the middle of navigation timing, i will cover them both here

together. I will go through all exposed attributes and explain them. Then i will show one example of how a vendor is implementing this.

Then i will show which metrics are directly calculated from those attributes.

- We can see that this is the same as explained in CRP

exposed as DOMHighResTimeStamp

from PerformanceEntry Interface: name entryType startTime duration

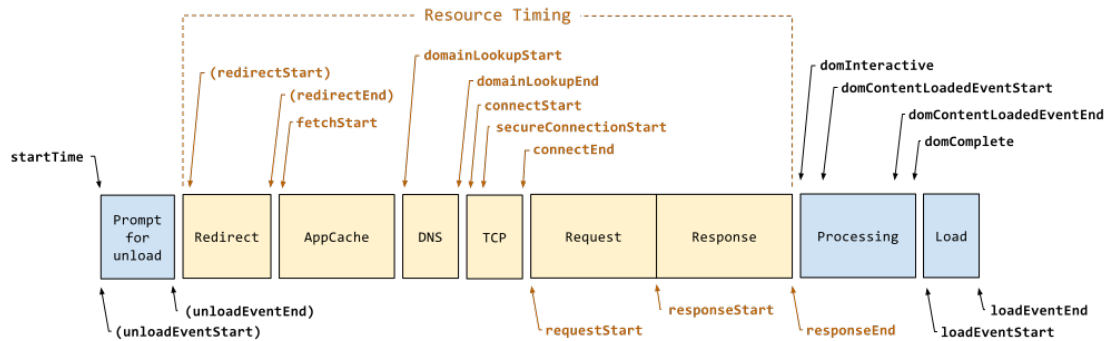


Figure 2.5: Timestamps from Navigation and Resource Timing

| Navigation Timing | |
|--|-----------------------|
| origin.. (startTime, navigationStart) | ... |
| unloadEventStart | ... |
| unloadEventEnd | ... |
| domInteractive | ... |
| domContentLoadedEventStart | ... |
| domContentLoadedEventEnd | ... |
| domComplete | ... |
| loadEventStart | Same as window.onload |
| loadEventEnd | ... |
| Resource Timing | |
| redirectStart | ... |
| redirectEnd | ... |
| fetchStart | ... |
| domainLookupStart | ... |
| domainLookupEnd | ... |
| connectStart | ... |
| connectEnd | ... |
| secureConnectionStart | ... |
| requestStart | ... |
| responseStart | ... |
| responseEnd | ... |
| Extended from PerformanceEntry Interface (cite navigation timing 2 spec) | |

2 Metrics and Measurement Methods

| | |
|--|---------------------------------|
| name | Address of the current document |
| entryType | "navigation" |
| startTime | Time value of 0 |
| duration | loadEventStart - startTime |
| Navigation Timings Outside of Timeline | |
| type | ... |
| redirectCount | ... |
| Resource Timings Outside of Timeline | |
| initiatorType | ... |
| nextHopProtocol | ... |
| workerStart | ... |
| transferSize | ... |
| encodedBodySize | ... |
| decodedBodySize | ... |

Table 2.2: Navigation and Resource Timing Level 2 Attributes

- good explanations of the attributes

Requests and responses: - fetchStart marks when the browser starts to fetch a resource. This is distinct from a request in that it doesn't mark when the browser makes a network request for a resource, but rather when it begins checking caches (e.g., HTTP and service worker caches) to see if a network request is even necessary. - workerStart marks when a request is being fetched from a service worker within a fetch event handler (if applicable). This will be always be 0 if a service worker isn't installed for the current page. - requestStart is when the browser issues the network request. - responseStart is when the first byte of the response arrives. - responseEnd is when the last byte of the response arrives.

Metrics calculated with Navigation and Resource Timing Directly from those timestamps many metrics are calculated. Sometimes different vendors give a different name to the same metric. For many metrics there are no official definitions and the values diverge depending on the implementation. I will show how those metrics are being calculated.

- navigationStart is not in level 2 - navigationStart is the same as startTime in level 2 - Difference is that navigationStart is a EPOCH time stamp. The timings have to be calculated as differences to this timestamp - navigationStart just starts with 0, which makes all the other timestamps easier to read - many still use level 1 and navigationStart

| | |
|---------------------------|--|
| Time to First Byte (TTFB) | <i>responseStart – navigationStart: blablablablb</i> |
| Page Load Time (PLT) | <i>loadEventStart – navigationStart</i> |
| DNS Lookup Time | <i>domainLookupEnd – domainLookupStart</i> |

| | |
|-------------------------------------|---|
| TCP Handshake / Server Connect Time | <i>connectEnd – connectStart</i> |
| TLS Handshake Time | <i>requestStart – secureConnectionStart</i> |
| Request / Server Response Time | <i>responseStart – requestStart</i> |
| DOM Content Loaded | <i>domContentLoadedEventEnd</i> – <i>domContentLoadedEventStart</i> |
| Page Download Time | <i>responseEnd – responseStart</i> |
| Latency | <i>responseStart – fetchStart</i> |
| DOM Interactive | |
| DOM Complete | |
| Redirect | |

Table 2.3: Metrics

- In the old days, the main time-based performance metric was `window.onload`.
- First byte that the browser receives - It's a good indicator of how quickly the backend of your site is able to process and send back content

TTFB describes how long the requesting party has to wait from sending the first request packet until receiving the first response data packet

- Has been the de facto metric of the web performance world - Increasingly insufficient performance benchmark: we are no longer building pages, we are building dynamic and interactive web applications

W3C also has more specifications which are interesting for performance. User Timing can be used for custom metrics. Performance Timeline defines an API which subsumes all relevant specifications.

User Timing - level 3 - working draft from March 2021 - give developers access to high precision timestamps - `PerformanceMark` and `PerformanceMeasure` interfaces - mark timestamps and measure time between marks

- obtain the high precision performance characteristics of an individual task which is important to you - unique marks - `PerformanceMeasure` interface: calculate the elapsed time between two marks

- provides a simple way of marking points in time using performance. `mark("label")` and a standard way of querying all of the custom measurements later

-> Puts data in Performance Timeline / DevTools

Performance Timeline Access all different data from other APIs.

- level 1 is recommendation from December 2013 - level 2 - working draft from October 2019 - extends the High Resolution Time specification - providing methods to store

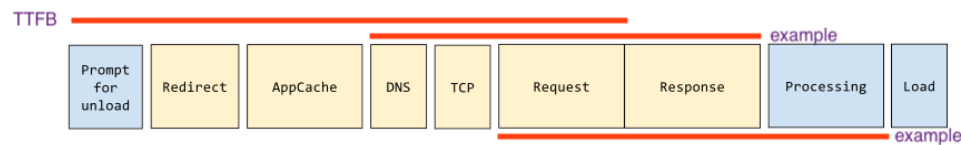


Figure 2.6: Metrics Overview

and retrieve high resolution performance metric data. - Performance Timeline defined by Navigation timing, resource timing, user timing and other interfaces - get Entries, by Type, by Name - Example entryType values defined by other specifications include: "mark" and "measure" [USER-TIMING-2], "navigation" [NAVIGATION-TIMING-2], "resource" [RESOURCE-TIMING-2], and "longtask"

- The PerformanceObserver interface can be used to observe the Performance Timeline to be notified of new performance metrics as they are recorded.

- unified interface to obtain various performance metrics

- PerformanceEntry interface encapsulates a single performance entry: a single data point or metric in the performance timeline

- performance.getEntriesByType('navigation') -> get navigation timings - performance.getEntriesByType('resource') -> get resource timings

Long Tasks - Long Tasks: Is it delightful? PerformanceObserver

Server Timing

Paint Timing - First Public Working Draft, 7 September 2017 - capture a series of key moments (First Paint, First Contentful Paint - metrics mark the points, immediately after navigation, when the browser renders pixels to the screen - answers the question: is it happening? -> We will see later that Google Web Vitals use same question

Paint or Render: "the browser has performed a "paint" (or "render") when it has converted the render tree to pixels on the screen. "

FP: "the time when the browser first rendered after navigation. This excludes the default background paint, but includes non-default background paint. This is the first key moment developers care about in page load – when the browser has started to render the page" FCP: "time when the browser first rendered any text, image (including background images), non-white canvas or SVG. This includes text with pending webfonts. This is the first time users could start consuming page content"

```

> performance.getEntriesByType("navigation");
< [PerformanceNavigationTiming] 1
  0: PerformanceNavigationTiming
    connectEnd: 24.30000001192093
    connectStart: 24.30000001192093
    decodedBodySize: 0
    domComplete: 730.3999999761581
    domContentLoadedEventEnd: 567.5
    domContentLoadedEventStart: 567.5
    domInteractive: 413.39999997615814
    domainLookupEnd: 24.30000001192093
    domainLookupStart: 24.30000001192093
    duration: 732
    encodedBodySize: 0
    entryType: "navigation"
    fetchStart: 24.30000001192093
    initiatorType: "navigation"
    loadEventEnd: 732
    loadEventStart: 730.3999999761581
    name: "https://www.baqend.com/"
    nextHopProtocol: ""
    redirectCount: 0
    redirectEnd: 0
    redirectStart: 0
    requestStart: 24.30000001192093
    responseEnd: 246.5
    responseStart: 220.80000001192093
    secureConnectionStart: 24.30000001192093
    serverTiming: []
    startTime: 0
    transferSize: 0
    type: "navigate"
    unloadEventEnd: 0
    unloadEventStart: 0
    workerStart: 9.099999964237213
    __proto__: PerformanceNavigationTiming
  length: 1
  __proto__: Array(0)

```

Figure 2.7: Navigation Timings

From the browser perspective. For user perspective, start render is the metric.

| | |
|------------------------|--|
| First Paint | "Marks the point when the browser renders anything that is visually different from what was on the screen prior to navigation" |
| First Contentful Paint | "The point when the browser renders the first bit of content from the DOM, which may be text, an image, SVG, or even a canvas element" |

First Paint, Time to First Paint:

- can tell you the first point in time when the user sees something other than a blank white screen - doesn't necessarily mean the user sees anything useful

First Contentful Paint:

use this as transition to web vitals There are more metrics which try to capture user experienced or perceived performance, which are calculated by visuals etc.

Conclusion The W3C provides recommendations and drafts which expose interesting timing data in the browser. The High Resolution Time recommendation enables exact, stable and reliable time measures. The Navigation and Resource Timing specifications expose all relevant time stamps on the document, or any resource respectively, loading process. The User Timing spec makes it possible for analysts and developers to mark and

2 Metrics and Measurement Methods

measure custom time stamps and expose them directly to the Performance Timeline. The Performance Timeline subsumes all exposed timing measures and is the go to place to fetch performance data.

Or as Grigorik states it, "The combination of Navigation, Resource, and User timing APIs provides all the necessary tools to instrument and conduct real-user performance measurement for every web application"

| | |
|----------------------|---------|
| Navigation Timing | summary |
| Resource Timing | summary |
| User Timing | summary |
| Performance Timeline | summary |
| Long Tasks | summary |
| Paint Timing | summary |

Multiple metrics are directly derived from those timing attributes, such as TTFB or Page Load Time. Those metrics cover only the technical aspect of performance, that is they reflect performance as time or how long it took for a specific task to finish. Those technical timing metrics may give an idea about the loading process of the web site, but they do not reflect how a user is experiencing the performance.

The Paint Timing specification goes into the direction of capturing user perceived performance by exposing the time when the first visual content has been displayed to the user.

This idea of user centric metrics has been followed by many such as Google, which introduces Web Vitals. Web Vitals are discussed in the next section, but before I will explain some other user centric metrics such as Speed Index.

User-Centric Performance Metrics

[tbd]

Last section was about performance timings which are available through the web apis. They are timestamps and do not tell a lot about how the user perceives the performance.

- Perceived performance - how fast a web site feels to a user - perception can be different than actual load times - more difficult to measure than loading times

I will describe established user-centric performance metrics, such as TTI, TBT and Speed Index. Then I will discuss Web Vitals.

Start Render

Time to Interactive

Total Blocking Time

First Meaningful Paint

Above the Fold Time

Speed Index

Web Vitals - "Web Vitals is an initiative by Google to provide unified guidance for quality signals that are essential to delivering a great user experience on the web." - Core Web Vitals: Metrics that matter the most - evolving: definitions and thresholds may change with greater frequency

- a set of browser-based metrics for capturing user-perceived performance. - Google heralds the Web Vitals as the gold standard for website performance - publishes them in the Chrome User Experience Report (CrUX)

- Perceived load speed - Load responsiveness - Runtime responsiveness - Visual stability - Smoothness

- The core metrics will further be used for ranking search results - Website performance according to the Web Vitals will therefore be critically important for SEO in the upcoming years.

| | |
|--------------------------|--|
| <i>Is it happening?</i> | Did the navigation start successfully? Has the server responded? |
| <i>Is it useful?</i> | Has enough content rendered that users can engage with it? |
| <i>Is it usable?</i> | Can users interact with the page, or is it busy? |
| <i>Is it delightful?</i> | Are the interactions smooth and natural, free of lag and jank? |

- apply to all web pages - available in all google tools - each core web vital represents a distinct facet of the user experience: loading, interactivity, and visual stability - each is measurable in the field - rather stable in definition and thresholds - Collected by Crux, Pagespeed insights and search console - measure with library

- Future goals: Better support for Single Page Apps, Input responsiveness, Scrolling and animations - Areas of user experience beyond performance: Security, Privacy, Accessibility

The core web vitals LCP CLS and FID are now being discussed.

Largest Contentful Paint

First Input Delay

Cumulative Layout Shift

Thresholds and Benchmarks for Core Web Vitals

2 Metrics and Measurement Methods

Custom Metrics

[tbd]

Metrics Conclusion

[tbd]

[summary table]

[Link to Research Question]

Observer Effect Avoiding the Observer Effect

- How to measure performance without affecting performance? - JS is single threaded
- Unless browser is idle, anything you do in JS will slow down some other JS -> Do only cheap stuff - Don't slow down load time: - Load measurement code outside the critical path - Use Iframe Loader Technique - Load measurement code after onload event (-> can not measure things that happen before onload)
- Do as little as possible in event handlers - Do more expensive processing via requestIdleCallback that runs when browser is idle

The first rule of effective performance measurement is to make sure your performance measurement techniques aren't causing performance issues themselves.

Before tackling this question with an experiment, I will discuss one synthetic monitoring tool WPT and one RUM tool GA which I will then use in the approach. Also some research in this field will be discussed.

3 Related Work

- Last chapter...
- This chapter: Describe shortly all sections from this chapter
- In the next chapter...
- This chapter should list research which covers and explores questions relevant for this thesis, such as:
 - Metrics: New metrics, meaning of metrics, difficulties of defining metrics, etc.
 - Overview, evaluation and comparison of measurement tools and methods
 - If available: Impact of RUM on performance

3.1 WebPageTest

- Overview
- Configuration
- Private Instances

3.1.1 Overview

- What is it
- Why to use it, Who uses it, how to use it
- Waterfall and Grades
- See in performance tab for details about grades and optimization techniques

3.1.2 Configuration

- Caching, repeat view
- Traffic shaping
- e.g. capture devtools timeline

3 Related Work

3.1.3 Private Instances

- Architecture
- AWS
- Docker localhost
- Bulk tests

- A waterfall chart such as Figure 2-2 shows you how much time it takes to request the contents of a page, such as CSS, images, or HTML, and how much time it takes to download this content before displaying it in a browser. - ...

3.1.4 Metrics

- Metrics Categories:
 - High Level Metrics:
 - * Document Complete
 - * Fully Loaded
 - * Load Time
 - * First Byte
 - * Start Render
 - * Requests
 - * Bytes In (Page Size)
 - Page-level Metrics:
 - * Technical Page Metrics:
 - -> APIs, GA Site Speed Metrics
 - TTFB
 - loadTime
 - docTime
 - ...
 - * Visual Metrics:
 - SpeedIndex
 - firstPaint
 - firstContentfulPaint
 - firstMeaningfulPaint
 - ...

- * Javascript and CPU timings
- * Page Information
- * Browser State
- * Lighthouse Summary Metrics
- * Optimization Checks/Grades
- * Instrumented Metrics
- * Test Information
- * Misc
- Request-level metrics:
 - * Request Details
 - * Request Timings
 - * Request Stats
 - * Headers
 - * Protocol Information
 - * Javascript/CPU details
 - * Optimization Checks
 - * Misc
- Optimization Grades:
 - Keep-alive Enabled
 - Compress Text
 - Compress Images
 - Cache Static Content
 - Use of CDN
- First View and Repeat View

| Name | Description |
|------------------|--|
| Successful Tests | Amount of tests who completed successfully |

3 Related Work

Document Complete

The time from the initial request until the browser fires load event. Also known as the document complete time. This is the time at which the Document Object Model (DOM) has been created and all images have been downloaded and displayed. For most traditional web pages, the load time is a suitable metric for representing how long a user must wait until the page becomes usable. This is the default performance metric on WebPageTest. Also known as Load Time (?). Around this time, the page's script is hard at work in the load-event handler firing off more requests for secondary content. The incomplete nature of this metric is why Fully Loaded was added to the table of metrics from the previous section. window.onload (?). The point where the browser onLoad event fires. The equivalent Navigation Timing event is loadEventStart. Document Complete Time: Amount of time that has elapsed from the initial page request until the browser fires the load event. This is the time at which the Document Object Model (DOM) has been created and all images have been downloaded and displayed.

Fully Loaded

The time from the initial request until WebPageTest determines that the page has finished loading content. The page might have waited for the load event to defer loading secondary content. The time it takes to load the secondary content is accounted for in the Fully Loaded Time. The time (in ms) the page took to be fully loaded — e.g., 2 seconds of no network activity after Document Complete. This will usually include any activity that is triggered by javascript after the main page loads. The point after onLoad where network activity has stopped for 2 seconds. Specific to WebPageTest and not provided by Performance API. Fully loaded waits for 2 seconds of no network activity (and no outstanding requests) after onLoad and then calls it done (only measures to the last activity, doesn't include the 2 seconds of silence in the measurement). Fully Loaded is a measure based on the network activity and is the point after onload when there was no activity for 2 seconds.

First Byte

Time until the server responds with the first byte of the response.

Start Render

Time until the browser paints content to the screen. The time for the browser to display the first pixel of content (paint) on the screen. Time until the browser paints content to the screen. WebPageTest's own metric, determined by programmatically watching for visual changes to the page. Same as First Render?

| | |
|--------------------|--|
| Bytes In (Doc) | Total size of the Document Complete Requests' response bodies in bytes. |
| Requests (Doc) | Number of HTTP requests before the load event, not including the initial request. |
| Load Event Start | Time in ms since navigation started until window.onload event was triggered (from W3C Navigation Timing). |
| Speed Index | See Speed Index |
| Last Visual Change | Time in ms until the last visual changed occurred. Last change is a completely visual measurement and is the last point in the test when something visually changed on the screen. It could be something as simple as an animated gif or ad even that didn't really cause much CPU work but changed some pixels on the screen. It is only captured when video is recorded because it depends on the video capture to measure it. |
| Visually Complete | Time in ms when page was visually completed. Is measured from a video capture of the viewport loading and is the point when the visible part of the page first reached 100% "completeness" compared to the end state of the test. |

Table 3.1: Your caption here

3.2 Google Analytics

- Custom metrics with Google Web Vitals as example
- Show how to include GA script (analytics.js, gtag, Tag Manager, etc.)
- Show some real life examples how script code is included into page, e.g. from Amazon, Otto etc

Real User Measurement (RUM) with Google Analytics

3.2.1 The Tracking Script

- Show multiple code examples
- Explain whats going on: script tag, create script element etc.
- Maybe also show Hotjar example to see that they are similar

- this async pattern is used so that all browsers will load it async - we can just use async attribute for newer browsers...

3 Related Work

3.2.2 Site Speed Metrics

Default performance metrics captured by analytics.js.

Show with analytics.js that it is indeed those navigation timing api calculations.

Ec = function (a)...

GA does not really provide any UX metrics! The site speed metrics are all from navigation timing api which are measurements from the browser.

GA Site Speed Metrics (description from https://support.google.com/analytics/answer/2383341?hl=en&ref_topic=1282106)

<https://stackoverflow.com/questions/18972615/how-do-the-metrics-of-google-anal>

| Name | Description |
|------------------------------------|--|
| Page Load Sample | The number of pageviews that were sampled to calculate the average page-load time. |
| Speed Metrics Sample | The sample set (or count) of pageviews used to calculate the averages of site speed metrics. This metric is used in all site speed average calculations, including avgDomainLookupTime, avgPageDownloadTime, avgRedirectionTime, avgServerConnectionTime, and avgServerResponseTime. |
| DOM Latency Metrics Sample | Sample set (or count) of pageviews used to calculate the averages for site speed DOM metrics. This metric is used to calculate ga:avgDomContentLoadedTime and ga:avgDomInteractiveTime. |
| Page Load Time (sec) | The average amount of time (in seconds) it takes that page to load, from initiation of the pageview (e.g., click on a page link) to load completion in the browser. |
| Domain Lookup Time (sec) | The average amount of time spent in DNS lookup for the page. |
| Page Download Time (sec) | The time to download your page. |
| Redirection Time (sec) | The time spent in redirection before fetching the page. If there are no redirects, the value for this metric is expected to be 0. |
| Server Connection Time (sec) | The time needed for the user to connect to your server. |
| Server Response Time (sec) | The time for your server to respond to a user request, including the network time from the user's location to your server. |
| Document Interactive Time (sec) | The average time (in seconds) that the browser takes to parse the document (DOMInteractive), including the network time from the user's location to your server. At this time, the user can interact with the Document Object Model even though it is not fully loaded. |
| Document Content Loaded Time (sec) | The average time (in seconds) that the browser takes to parse the document and execute deferred and parser-inserted scripts (DOMContentLoaded), including the network time from the user's location to your server. Parsing of the document is finished, the Document Object Model is ready, but referenced style sheets, images, and sub-frames may not be finished loading. This event is often the starting point for javascript framework execution, e.g., JQuery's onready() callback, etc. |

3.2.3 Comparison GA and WPT Metrics

- We can show that above relations are true with experiments
- Load test page on a specific day only once and save timings exposed by perfor-

| Navigation Timing API | WPT | GA |
|--|-------------------------------------|----------------------|
| loadEventStart - navigationStart | Document Complete, Load Event Start | pageLoadTime |
| domainLookupEnd - domainLookupStart | DNS lookup, dns_ms | domainLookupTime |
| connectEnd - connectStart | connect_ms | serverConnectionTime |
| responseStart - requestStart | .. | serverResponseTime |
| responseEnd - responseStart | .. | pageDownloadTime |
| fetchStart - navigationStart | .. | redirectionTime |
| domInteractive - navigationStart | .. | domInteractiveTime |
| domContentLoadedEventStart - navigationStart | domContentLoadedEventStart | domContentLoadedTime |

mance.timing object (from console)

- Calculate differences corresponding to the table
- Get GA data for that day and save it

3.3 Research

- Research exists about topics like:
- Here i will provide a list of in my eyes relevant papers, summaries them and discuss why this is important for my research

3.3.1 some title for first category

2014 Singal I. - Describes history of web analytics and tools - Provides definitions and taxonomy for metrics - Describes log file vs page tagging - Describes KPIs

II. - Lit. overview for KPIs and Web Metrics - Lit. overview for "Trust" - Lit. overview for "Fuzzy" -> What are does categories?

III. - Some other literature worth mentioning

IV. - Describes 8 open challenges for researchers

2015 Bekavac - Two parts: - 1: Some general overview of web analytics, tools and metrics, KPIs etc - 2: Empirical study about employees satisfaction of used web analytics tools

1: - 9 web business models and 5 common goals - Hypothesis: Web analytics tools track and improve a user's satisfaction with web-based business models. - Web analytics definition. Log files vs Site Tagging - Web Analytics process - Tools: 5 categories, Process of selecting tool, Table with features of different tools - Web metrics categories, Table with business models and their KPIs

2: - Which tools are used for which purpose / Activity - Users satisfaction

3.3.2 Research about Tools

Kaushik 2007 - Provides 3 questions which help to choose web analytics tools

2011 Nakatani - Gives some arguments why web analytics is important for business - Provides different categorizations for web analytics tools - Gives pros and cons of log file analysis and page tagging - Provides tool selection method based on AHP (Analytic Hierarchy Process)

"Web analytics tools collect click-stream data, track users navigation paths, process and present the data as meaningful information. - Categorizations: 1: By 4 different data collection methods 2: SaaS vs in-house 3: mobile vs non-mobile 4: Time lag

3 Related Work

2016 Kaur - free vs paid - real time vs long term - hosted vs in-house - data portability
- free / open source tools - proprietary tools - Service Hosted Software - GA most popular one

3.3.3 Research about Metrics

Categorizations as seen in section X.

- Dont know:

4 Approach

- Last chapter...
- This chapter: Describe shortly all sections from this chapter
- In the next chapter...
- In this chapter the practical work should be documented and explained
- Elaboration of how the practical work could help answer the research question
- Discussion of real-life setup and how experiments approach it

4.1 Empirical Research Methods

- Overview of methods
- reproduceability etc.
- validity
- Justification why following approaches are conducted as controlled experiments
- Change something: Delete this item again

4.1.1 Controlled Experiment

- Short overview about controlled experiments in computer science
- Design: Show test setup image: Independent and dependent variables
- Hypothesis testing

4.1.2 Test Setup

- What is test object (website)
- What are dependent variables: Performance metrics
- What are independent variables: Specific changes in test object (see next chapter)
- Kohavi 2016: Sample size, collect right metrics, track right users, randomization unit

4 Approach

| Variable | Values |
|--------------|------------------------------------|
| Position | top-head, bottom-head, bottom-body |
| Attribute | no attribute, async, defer |
| Other Script | false, true |

Measure effects: Dependent Variables

- Performance metrics from Lab and Field, see terms and definitions
- But also quality of RUM data. Because we could have a nice performance but RUM will be of bad quality.

Test object / HTML Template

- Depending on different approaches / Ideas (see next chapter), template looks different
- But general structure stays the same and independent variables can be defined
- Here we show different independent variables and variants

Lab and Field

- I want to collect Lab and field data for dependent variables for comparison
- This setup is a special case because lab bots (e.g. WPT) simulate at the same time real users for RUM data

4.1.3 Independent Variables within template

- IV 1 POSITION: Position of included analytics script. Values: top-head, bottom-head, bottom-body
- IV 2 ATTRIBUTE: Attribute of included analytics script: no-attribute, async, defer
- IV 3 OTHER SCRIPT: Other tracking script included
- Other IVs not included but worth mentioning

I will compare the values from one independent variable only. Therefore, when comparing the values of one independent variable, I need to set a default value for the other independent variables. The default values are:

Position: top-head Attribute: no attribute Other Script: false

Listing 4.1: Position 1

```

<!DOCTYPE html>
<html>
  <head>
    <!-- Google Analytics -->
    <script></script>
    <!-- End Google Analytics -->

    <title>
    <meta>
    <link>
    <script>
  </head>

  <body>
    ...
  </body>
</html>

```

Listing 4.2: Position 2

```

<!DOCTYPE html>
<html>
  <head>
    <title>
    <meta>
    <link>
    <script>

    <!-- Google Analytics -->
    <script></script>
    <!-- End Google Analytics -->
  </head>

  <body>
    ...
  </body>
</html>

```

Listing 4.3: Position 3

```

<!DOCTYPE html>
<html>
  <head>
    <title>
    <meta>
    <link>
    <script>

  </head>

  <body>
    ...
    <!-- Google Analytics -->
    <script></script>
    <!-- End Google Analytics -->
  </body>
</html>

```

4 Approach

Other IVs not included but worth mentioning

- More or less infinite number of independent variables
- Again the big and important fact that each website is different

it looks like attribute on inline script is ignored... "Inline JavaScript script tags ignore the defer or async attribute" so those variables will not make any sense? Do i see this in the data? As i can see how the GA is included, it will create a async attribute to fetch the analytics.js

4.2 Test Object: HTML Template / Test website ideas

- Several ideas are proposed
- Each idea has pro and contra: each idea should be discussed of its usefulness, advantages and disadvantages

4.2.1 WordPress

- Show usage of WordPress with some statistics: Why is it so verbreitet
- Explain Plugin system
- Explain Setup on localhost with wocommerce and GA plugin
- Elaborate why this idea was not used

4.2.2 Plain / Skeletal Website

- Idea: Lab environment to have control over all and see effects of changing independent variables
- Problem: Too far away from reality
- Use this as the simplest test possible, not even POC (POC is http archive site)

4.2.3 HTTP Archive inspired website

- Idea: Get correct page weight
- POC: Show that changing independent variables X affect result

- Chart with changes on time: apps are growing

4.2.4 Mirroring a complete e-commerce website

- Which website / shop to clone? Show some statistics about biggest e-commerce websites in germany

Listing 4.4: Attribute 1

```

<!DOCTYPE html>
<html>
  <head>
    <!-- Google Analytics -->
    <script></script>
    <!-- End Google Analytics -->

    <title>
    <meta>
    <link>
    <script>
  </head>

  <body>
    ...
  </body>
</html>

```

Listing 4.5: Attribute 2

```

<!DOCTYPE html>
<html>
  <head>
    <!-- Google Analytics -->
    <script async></script>
    <!-- End Google Analytics -->

    <title>
    <meta>
    <link>
    <script>
  </head>

  <body>
    ...
  </body>
</html>

```

Listing 4.6: Attribute 3

```

<!DOCTYPE html>
<html>
  <head>
    <!-- Google Analytics -->
    <script defer></script>
    <!-- End Google Analytics -->

    <title>
    <meta>
    <link>
    <script>
  </head>

  <body>
    ...
  </body>
</html>

```

Listing 4.7: Other Script 1

```
<!DOCTYPE html>
<html>
  <head>
    <!-- Google Analytics -->
    <script></script>
    <!-- End Google Analytics -->

    <title>
    <meta>
    <link>
    <script>
  </head>

  <body>
    ...
  </body>
</html>
```

Listing 4.8: Other Script 2

```
<!DOCTYPE html>
<html>
  <head>
    <!-- Google Analytics -->
    <script></script>
    <!-- End Google Analytics -->

    <!-- Other Script -->
    <script></script>
    <!-- End Other Script -->

    <title>
    <meta>
    <link>
    <script>
  </head>

  <body>
    ...
  </body>
</html>
```

Otto Re-write this to otto start page clone chapter

Manual adjustments: - Move everything to test folder because top domain is /otto

What did not work (mostly 404s): - user-set-consent-id-cookie: Cookie with name consentId is not set, user-set-consent-id-cookie returns therefore 404 - subscribeToNewsletterSnippetContent: Change path did not work... - amount.json: Not found, also wl_miniWishlistAmount in local storage does not created - a_info: Mock a_info response json does not work...

- footer - userTiming

WPT RV is returning empty csv when 404s are encountered. Therefore i mock the missing ressources so that WPT can run bulk tests successfully.

- mock image sprite_all_1ba408b2.png

- create empty file called user-set-consent-id-cookie

- change path for subscribeToNewsletterSnippetContent: This will remove the cookie banner... but then WPT works

- Idea: Close to reality as possible
- Problems when mirroring a website
- Elaborate why this idea of mirroring complete website was not used
- I used mock of start page of otto, which works fine
- Compare original otto website with mock

Comparison to original webpage

- Remove GA again from mock, so that mock and original are as similar as possible
- Run the same lab test on both pages: WPT and maybe lighthouse
- Compare both results and explain differences

- Setup: Run WPT on mock and on original website - WPT config: - Browser: Chrome
- Number of test runs: 3 - FV and RV - Capture Video - Capture DevTools Timeline - Bulk testing: 100x

Diagrams with FV and RV for both cases:

Technical: - First Byte - Bytes In (Doc) - Requests (Doc)

Visual: - Document Complete - Speed Index

Problem with Repeat View - Problem with RV, Caching: Otto sets request headers to cache-control: no-cache which means that RV basically downloads all resources again. The mock is hosted on Github, where the cache-control header is set to ... It is not possible to change the github request headers. We can modify the http request headers via html, but this is not a clean solution. Therefore I use a different e-commerce website which does not shut down caching so that the RV results are more similar.

4 Approach

Ideally I would host the mock website on a similar infrastructure as the original site with the same webserver configuration. This is for a masters thesis not feasible.

Zalando Idea: It looks like zalando page does not has that many cache-control headers, therefore it may be easier to clone so that RVs are more similar.

Comparison Diagrams with fixed traffic shaping:

4.3 Test Runs

- This section covers all conducted test runs
- Explain test configuration: how many runs, dependent and independent variables, etc.

4.3.1 WPT Configurations

General Settings

Table 4.1: Test Runs [Sch99]

| Configuration Setting | Options | GA |
|--|---|-----|
| Test Location | Test Location | . |
| Browser | Firefox, Chrome | . |
| Connection | LAN | . |
| Number of Tests to Run | 1 to 9 | .. |
| Repeat View | First View and Repeat View, First View Only | . |
| Capture Video | True or False | .. |
| Keep Test Private | True or False | ... |
| Label | Any String | ... |
| Advanced Tab | ... | ... |
| Chromium Tab | ... | ... |
| Auth, Script, Block, SPOF, Custom Tabs | ... | ... |
| Bulk Testing Tab | List of URLs | ... |

Explanations First View: "First View refers to the cold cache setup in which nothing is served locally" Repeat View: "Repeat View refers to the warm cache containing everything instantiated by the first view" (2016 Using WPT p. 62)

Capture Video: ...

For one test, we have actually six times that the website gets loaded and tested. For e.g. 500 URLs in the bulk test list, we have a total of $500 \times 6 = 3000$ page hits.

Configuration 1

Configuration 2 Emulate Mobile Browser

Figure 4.1: Number of tests to run: 3, First View and Repeat View

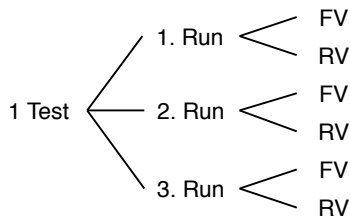


Table 4.2: Configuration 1

| Configuration Setting | Option |
|--|---|
| Test Location | Test Location |
| Browser | Chrome |
| Connection | LAN |
| Desktop Browser Dimensions | default (1366x768) |
| Number of Tests to Run | 1 |
| Repeat View | First View and Repeat View |
| Capture Video | True |
| Keep Test Private | False |
| Label | none |
| Advanced Tab | Nothing selected |
| Chromium Tab | Capture Dev Tools Timeline selected |
| Auth, Script, Block, SPOF, Custom Tabs | Nothing |
| Bulk Testing Tab | Test URL x times according to test plan |

Traffic Shaping

- Important to have stable and realistic network condition
- Chromes tool is not the best for this
- Private WPT Instance docker on mac does not allow traffic shaping functionality from WPT
- I use Network Link Conditioner from Apple to slow down the whole machine. See in same blogpost that Patrick highly recommends this
- WPT also slows down their whole machines
- IN general internet connection is very unstable. If i run network link conditioner with e.g. DSL each speedtest gives different results. And other test platforms such as fast.com gives also different result.
- as long as internet connection is stable along all tests, it should not make a big difference because i compare the different variants. Therefore internet connection will fall out of the equation

4 Approach

- i will use the durchschnitt in germany which seems to be 40 mbit per second. or actually i use LTE profile from network conditioner which is 50 mbit per second

4.3.2 Test Object (Website) Variations

as described before, i will compare the values within one independent variable. This is needed in order to compare the impact of the different values within one IV. For example, i want to measure if there is a difference in performance between the different script attributes. To measure this, i set the default values for the other IVs and vary the values for the IV attribute

Positions: 1: Top of head element 2: just before closing head element 3: just before closing body element

Variants

| Variant | Position | Attribute | Other Scripts |
|-------------|-------------|-----------|---------------|
| Variant P1 | top-head | none | no |
| Variant P2 | bottom-head | none | no |
| Variant P3 | bottom-body | none | no |
| Variant A1 | top-head | none | no |
| Variant A2 | top-head | async | no |
| Variant A3 | top-head | defer | no |
| Variant OS1 | top-head | none | no |
| Variant OS2 | top-head | none | yes |

Table 4.3: Your caption here

I will not compare variants which are not from the same subgroup, e.g. Variant A2 will not be compared to Variant OS2. Because the first row of the variants table also includes the default values for Attribute and Other Scripts, VP1 is equal to VA1 and VO1.

With the defined IVs and variants, I can create the test objects, that is the index.html files with the corresponding setup. Because its easier to differentiate i will create for the three equal variants nevertheless own index files.

For each test variant, I will create a concrete test artefact, which is a modified index.html. This index.html needs to be uploaded to the webserver before starting with the tests.

All variants will have the same name which is index.html. This is the default file which will be delivered by the webserver when accessing root path of webpage.

Variants to measure: _____

- Original website - Mock without GA - Position 1 - Position 2 - Position 3 - Attribute 1

- Attribute 2 - Attribute 3 - Other Script True - Other Script False

4.3.3 Test Plan. Generate the data

The Google Analytics code is more or less fixed and there are no configurations. It would be possible to change config of script, e.g. change sample rate, track other metrics etc. But it is not possible to change default tracking behaviour (?)

How the script is included into the file should be reflected with Website Variations

I will use only one WPT Configuration for all tests. Other WPT config can be used in future work, e.g. emulate mobile device.

Table 4.4: Test Runs [Sch99]

| Variant | Traffic Shaping | Runs | Date |
|---------|-----------------|------|------------|
| V-P1 | DSL | 500 | 2021-05-07 |
| V-P2 | DSL | 500 | 2021-05-07 |
| V-P3 | DSL | 500 | 2021-05-07 |
| V-A1 | DSL | 500 | 2021-05-07 |
| V-A2 | DSL | 500 | 2021-05-07 |
| V-A3 | DSL | 500 | 2021-05-07 |
| V-OS1 | DSL | 500 | 2021-05-07 |
| V-OS1 | DSL | 500 | 2021-05-07 |

Pre-step: Compare Mock website with and without GA included The comparison between mock and original is part of chapter Test Object

4.3.4 Test Protocol

- Deploy variant of index.html by pushing to GitHub
- Start Network Link Conditioner with specified config on local machine
- Test internet speed with speedtest-cli
- Start local WPT server and agent
- Configure WPT according to specified setup and add list of urls to bulk test interface
- Run test
- When finished, download summary csv file
- On GA helper site, fetch and download data for the current day

4 Approach

4.3.5 Tool support for diagrams and data analysis

- python
- Matplotlib
- seaborn library

5 Evaluation



- Last chapter...
- This chapter: Describe shortly all sections from this chapter
- In the next chapter...

5.1 Test Results

5.1.1 Metrics for Evaluation

Page Weight: Measured by WPT: - bytes - bytes uncompressed - Requests

Technical Timings / API: Measured by WPT and GA: - page load time - domain lookup time - page download time - redirection time - server connection time - server response time - Dom interactive time - Dom content loaded time

Visual Metrics / Web Vitals: Measured by WPT TODO Measure also with GA / own script ??: - CLS - FCP - FMP - LCP - SI

5 Evaluation

- Visually complete ? - Time to Interactive ? Is this the same as DOM interactive time ?

Core Web Vital FID ?? -> Can not be measured without real users...

From WPT bulk section. Also include this somewhere for comparison ?: - Filmstrips ?

- Waterfall ? - Visual Progress ? - Layout Shifts ?

5.1.2 Original vs Mock Plain

5.1.3 Mock Plain vs Position 1 (which is default position of GA: Check this again!)

TODO rename this like with GA true false ?

5.1.4 Position 1 vs 2 vs 3

5.1.5 Attribute 1 vs 2 vs 3

5.1.6 Other script True vs False

5.2 General

- For each attempt, describe: Threats to validity, generalizability

generalizability: meine Daten zeige nur für Chrome, MacBook, diese Geschwindigkeit etc. Und auch nur für diese Test-Website Die Schwierigkeit der Generalisierbarkeit ist eines der grössten Probleme bei dieser Fragestellung

5.3 Plain / Skeletal Website

- Information gained from this experiment
- Limitations and questions which can not be answered with this approach

5.4 Mirroring

5.5 HTTP Archive inspired website

- Information gained from this experiment
- Meaning and interpretation of the collected data
- Limitations and questions which can not be answered with this approach

5.6 WebPageTest Bulk Tests

- Bulk testing is a feature for private instances only
- Misuse this feature to test the same website X times

5.6.1 Bulk Test Overview: Description of test result page

- Each test has Test ID: YYMMDD_random_random
- Test results after bulk test available under `http://localhost:4000/result/{testID}/`
- For each test run, following data is available:
 - Link to test results: Test result page as same as for single test run
 - Median load time (First view)
 - Median load time (Repeat view)
 - Median Speed Index (First View)
 - Raw page data (file: [TestID_summary.csv])
 - Raw object data (file: [TestID_details.csv])
 - Http archive (.har) (file: json)
- Average First View Load Time
- Average Repeat View Load Time
- Combined Raw: Page Data (file: [TestID_summary.csv])
- Combined Raw: Object Data (file: [TestID_details.csv]). For 100 test runs, this file is appr. 20 MB, 24432 rows, 76 columns.
- Aggregate Statistics (file: [TestID_aggregate.csv])

5.6.2 Summary File for one Test

- Contains 6 rows: 3 test runs: for each test runs 1x first view and 1x repeat view
- Rows 1, 3, 5 contain FV, rows 2, 4, 6 contain data for RV

5.6.3 Aggregate Statistics File

- Contains aggregated data from bulk test
- One row for each test run: For 100 URLs in bulk test will be 100 rows in csv
- Each metric is available with Median, Average, Standard Deviation, Min, Max

5 Evaluation

- Metrics are available once from FV and once for Repeat View
- Metrics:
 - Successful Tests
 - Document Complete
 - Fully Loaded
 - First Byte
 - Start Render
 - Bytes In (Doc)
 - Requests (Doc)
 - Load Event Start
 - Speed Index
 - Last Visual Change
 - Visually Complete
- => For metric details, see Terms and Definitions

5.6.4 Compare Section

WPT has a feature to compare multiple tests. Accessible under compare URL: `http://localhost:4000/video/compare.php?tests={TestID},{TestID},...`

The compare page contains:

- Film strip
- Waterfall diagram
- Visual Progress diagram
- Timings diagram:
 - Visually Complete (First View Visually Complete Median)
 - Last Visual Change
 - Load Time (onload)
 - ...
- Cumulative Layout Shift diagram
- Requests diagram
- Bytes diagram
- Visually complete

- Last Visual Change
- Load Time (onload)
- Load Time (Fully Loaded)
- DOM Content Loaded
- Speed Index
- Time to First Byte
- Time to Title
- Time to Start Render
- CPU Busy Time
- 85% Visually Complete
- 90% Visually Complete
- 95% Visually Complete
- 99% Visually Complete
- First Contentful Paint
- First Meaningful Paint
- Largest Contentful Paint
- Cumulative Layout Shift
- html Requests
- html Bytes
- js Requests
- js Bytes
- css Requests
- css Bytes
- image Requests
- image Bytes
- flash Requests
- flash Bytes

5 Evaluation

- font Requests
- font Bytes
- video Requests
- video Bytes
- other Requests
- other Bytes

5.7 Internal, external validity

- At this point, i have the data collected and can analyse it
- The quality and quantity of the data needs to be discussed
- Quality: There are chances that some data are malformed, e.g. because internet connection was bad, etc.
- Quantity: Is the amount of data sufficient to make the evaluation generalisable

6 Future Work

- Last chapter...
- This chapter: Describe shortly all sections from this chapter
- In the next chapter...

6.1 Limitations of this thesis

- Discussion of unobserved topics
- Discussion of possible next steps

6.2 Other measurement tools and metrics

- List of tools and metrics worth investigating

6.2.1 Google Analytics 4

6.3 Speed Kit

6.4 PWAs, AMPs, Service Workers, Caching, HTTP2 etc.

- Overview of other web technologies and how they could be relevant for further research

7 Conclusion

- Last chapter...
 - This chapter: Describe shortly all sections from this chapter
 - Scope and contribution of this thesis
 - Short summary of each chapter:
 - Problem statement and why it is worth to examine research question
 - Terms and definitions
 - (Related work)
 - Approach and evaluation of practical work
 - Future work
- Several topics wurden bearbeitet in this thesis, such like mocking a website for testing purposes, literature review, metrics taxonomy, and the main part which is an experiment

8 Appendix

8.1 WebPageTest Bulk Tests

8.1.1 Single Test Raw page data

WPT Metrics from summary file

| Name | Description |
|----------------------------|---|
| minify_total | Total bytes of minifiable text static assets. |
| responses_200 | The number of responses with HTTP status code of 200, OK. |
| testStartOffset | ... |
| bytesOut | The total bytes sent from the browser to other servers. |
| gzip_savings | Total bytes of compressed responses. |
| requestsFull | ... |
| start_epoch | ... |
| connections | The number of connections used. |
| base_page_cdn | The CDN provider for the base page. |
| bytesOutDoc | Same as bytesOut but only includes bytes until the Document Complete event. Usually when all the page content has loaded (window.onload). |
| result | Test result code. |
| final_base_page_request_id | ... |
| basePageSSLTime | ... |
| docTime | Same as loadTime. |
| domContentLoadedEventEnd | Time in ms since navigation started until document DOMContentLoaded event finished. |
| image_savings | Total bytes of compressed images. |
| requestsDoc | The number of requests until Document Complete event. |
| firstMeaningfulPaint | ... |
| score_cookies | WebPageTest performance review score for not using cookies on static assets. |
| firstPaint | RUM First Paint Time, the time in ms when browser first painted something on screen. It's calculated on the client for browsers that implement this method. |
| score_cdn | WebPageTest performance review score for using CDN for all static assets. |
| optimization_checked | Whether or not optimizations were checked. |

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| | |
|----------------------------|---|
| score_minify | WebPageTest performance review score for minifying text static assets. |
| gzip_total | Total bytes of compressible responses. |
| responses_404 | The number of responses with HTTP status code of 404, not found. |
| loadTime | The total time taken to load the page (window.onload) in ms. |
| URL | The tested page URL. |
| score_combine | WebPageTest performance review score for bundling JavaScript and/or CSS assets. |
| firstContentfulPaint | ... |
| image_total | Total bytes of images. |
| score_etags | WebPageTest performance review score for disabling *ETag*s. |
| loadEventStart | Time in ms since navigation started until window.onload event was triggered (from W3C Navigation Timing). |
| minify_savings | Total bytes of minified text static assets. |
| score_progressive_jpeg | WebPageTest performance review score for using progressive JPEG. |
| domInteractive | ... |
| score_gzip | WebPageTest performance review score for using gzip compression for transferring compressable responses. |
| score_compress | WebPageTest performance review score for compressing images. |
| domContentLoadedEventStart | Time in ms since navigation started until document DOMContentLoaded event was triggered (from W3C Navigation Timing). |
| final_url | ... |
| bytesInDoc | Same as byteIn but only includes bytes until Document Complete event. |
| firstImagePaint | ... |
| score_keep-alive | WebPageTest performance review score for using persistent connections. |
| loadEventEnd | Time in ms since navigation started until window.onload event finished. |
| cached | 0 for first view or 1 for repeat view. |
| score_cache | WebPageTest performance review score for leveraging browser caching of static assets. |
| responses_other | The number of responses with HTTPS status code different from 200 or 404. |
| main_frame | ... |
| fullyLoaded | The time (in ms) the page took to be fully loaded — e.g., 2 seconds of no network activity after Document Complete. This will usually include any activity that is triggered by javascript after the main page loads. |
| requests | List of details of all requests on tested page. |

| | |
|---|---|
| final_base_page_request | ... |
| TTFB | Time to first byte, which is the duration in ms from when the user first made the HTTP request to the very first byte of the page being received by the browser. |
| bytesIn | The amount of data that browser had to download in order to load the page. It is also commonly referred to as the page size. |
| osPlatform | ... |
| test_run_time_ms | ... |
| tester | The ID of tester that performed the page test. |
| browser_version | The browser version. |
| document_origin | ... |
| document_URL | ... |
| date | Time and date (number of seconds since Epoch) when test was complete. |
| PerformancePaintTiming.first-paint | ... |
| osVersion | ... |
| domElements | The total number of DOM elements. |
| browserVersion | The browser version. |
| fullyLoadedCPUms | CPU busy time in ms until page was fully loaded. |
| browser_name | The browser name. |
| PerformancePaintTiming.first-contentful-paint | ... |
| base_page_cname | ... |
| eventName | ... |
| os_version | ... |
| base_page_dns_server | ... |
| fullyLoadedCPUpct | Average CPU utilization up until page is fully loaded. |
| domComplete | ... |
| base_page_ip_ptr | ... |
| document_hostname | ... |
| lastVisualChange | Time in ms until the last visual changed occurred. |
| visualComplete | Time in ms when page was visually completed. |
| render | The first point in time (in ms) that something was displayed to the screen. Before that user was staring at a blank page. This does not necessarily mean the user saw the page content — it could just be something as simple as a background color — but it is the first indication of something happening for the user. |
| SpeedIndex | The SpeedIndex score. |
| visualComplete85 | Time in ms when page was visually completed 85%. |
| visualComplete90 | Time in ms when page was visually completed 90%. |
| visualComplete95 | Time in ms when page was visually completed 95%. |
| visualComplete99 | Time in ms when page was visually completed 99%. |
| LargestContentfulPaintType | ... |
| LargestContentfulPaintNodeType | ... |

8 Appendix

| | |
|--|--|
| chromeUserTiming.navigationStart | ... |
| chromeUserTiming.fetchStart | ... |
| chromeUserTiming.responseEnd | ... |
| chromeUserTiming.domLoading | ... |
| chromeUserTiming.markAsMainFrame | ... |
| chromeUserTiming.domInteractive | ... |
| chromeUserTiming.domContentLoadedEventStart | ... |
| chromeUserTiming.domContentLoadedEventEnd | ... |
| chromeUserTiming.firstPaint | ... |
| chromeUserTiming.firstContentfulPaint | ... |
| chromeUserTiming.firstImagePaint | ... |
| chromeUserTiming.firstMeaningfulPaint | ... |
| chromeUserTiming.firstMeaningfulPaintCandidate | ... |
| chromeUserTiming.domComplete | ... |
| chromeUserTiming.loadEventStart | ... |
| chromeUserTiming.loadEventEnd | ... |
| chromeUserTiming.LargestContentfulPaint | ... |
| chromeUserTiming.LargestTextPaint | ... |
| chromeUserTiming.CumulativeLayoutShift | ... |
| run | The run number. |
| step | ... |
| effectiveBps | Bytes per seconds, i.e.: total of bytes in / total time to load the page. |
| effectiveBpsDoc | Same as effectiveBps but until Document Complete event. |
| domTime | The total time in ms until a given DOM element (specified via domelement parameter when running a test) was found on the page. |
| aft | Above the Fold Time (no longer supported). The time taken to load everything in the viewport above the fold. |
| titleTime | Total time in ms until page title was set on browser. |
| domLoading | ... |
| server_rtt | ... |
| smallImageCount | ... |
| bigImageCount | ... |
| maybeCaptcha | ... |
| bytes.html | ... |
| requests.html | ... |
| bytesUncompressed.html | ... |
| bytes.js | ... |
| requests.js | ... |
| bytesUncompressed.js | ... |
| bytes.css | ... |
| requests.css | ... |
| bytesUncompressed.css | ... |
| bytes.image | ... |
| requests.image | ... |

| | |
|----------------------------------|-----|
| bytesUncompressed.image | ... |
| bytes.flash | ... |
| requests.flash | ... |
| bytesUncompressed.flash | ... |
| bytes.font | ... |
| requests.font | ... |
| bytesUncompressed.font | ... |
| bytes.video | ... |
| requests.video | ... |
| bytesUncompressed.video | ... |
| bytes.other | ... |
| requests.other | ... |
| bytesUncompressed.other | ... |
| id | ... |
| chromeUserTiming.InteractiveTime | ... |

Table 8.1: Your caption here

- 8.1.2 Single Test Raw object data
- 8.1.3 Single Test Http archive (.har)
- 8.1.4 Combined Test Raw page data
- 8.1.5 Combined Test Raw object data
- 8.1.6 Combined Test Aggregate data

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