



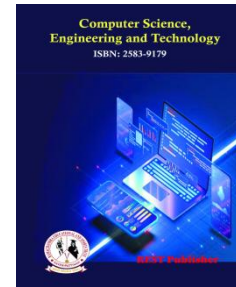
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Optimizing Cross-Browser Testing with Selenium Grid and JavaScript for Responsive Web Applications

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Abstract: In the fast-paced world of web development, making sure things work right on all browsers is super important for giving users a good experience, no matter what device they're using. Since web apps are getting more complicated and doing more advanced stuff, we really need good ways to test them. One smart way to do this is by using Selenium Grid with JavaScript to test how well web apps respond on different devices. Selenium Grid lets developers run tests at the same time on lots of different browsers and computers, which saves a lot of time [1]. Plus, using JavaScript in this setup lets them write flexible test scripts that can handle all the little differences between browsers, giving them a strong solution for dealing with each browser's quirks [2]. Besides these tech tools, there's also a chance to get a lot more done. Studies show that using automated testing like Selenium can cut down testing time by as much as 90% compared to doing it by hand. This lets teams spend more time on the important parts of development [3]. Also, research has found that Selenium's automated tests are not only faster but also more accurate because they reduce human mistakes. This makes sure that responsiveness and functionality are checked carefully before the app is released [4]. This combo of speed and accuracy is key in a market where people expect web apps to work well on all sorts of devices and screen sizes. Web solutions for phones and computers are still pretty different, so we need a testing method that can handle all those differences. Combining responsive design ideas with thorough cross-browser testing helps solve a big problem for developers today: making sure apps work smoothly on different resolutions and user interfaces [5]. With Selenium Grid, developers can change testing resources on the fly, running tests on different browsers at the same time, which speeds up the development process [6]. This ability to run tests in parallel not only uses resources better but also makes sure tests cover a lot of ground. This is really important for spotting rendering differences that could mess up the user experience [7]. Also, as users expect more and more, it's getting more important to check the interface carefully. Testing setups that use JavaScript in Selenium scripts let you easily add checks that confirm the app is responding correctly and that interactive parts are working as they should [8]. Tools built this way help us get a better handle on browser compatibility problems, which often make users unhappy [9]. By using well-planned test cases that are made for specific browser behaviors, apps can be tweaked to work the same on all platforms. This builds user trust and keeps them coming back [10]. As developers aim for top-notch web apps, we can't forget about performance. Using real-time tracking and reporting in Selenium lets teams grab important performance data during testing, giving them insights that help them make things even better [11]. This kind of openness is super useful for seeing how design changes affect app performance and responsiveness. It lets teams make smart decisions when they're improving user interfaces and features [12]. Plus, adding continuous integration and continuous deployment (CI/CD) strategies with Selenium Grid testing makes the development pipeline stronger, leading to smoother updates and releases [13]. Basically, using Selenium Grid and JavaScript together for responsive web apps makes cross-browser testing way more efficient while also making sure users have a great experience. This method not only speeds up testing but also makes web apps more reliable and adaptable across different platforms, which is what today's users need [14]. As more people want web solutions that are responsive and work everywhere, using these methods will be key to doing great development, which will shape the future of web app testing and release [15]. So, improving these testing frameworks along with new technologies will stay at the forefront of making development better and keeping users happy [16]. As the industry moves forward, using these strategies will only get more important, creating a strong base for new ideas and excellence in the world of web apps [17].

1. INTRODUCTION

The digital realm keeps changing fast, so cross-browser compatibility is super important, especially when building responsive web apps for all sorts of users on different devices and browsers. People want things to work great and be easy to use, meaning we really need good ways to test software. Selenium Grid, mixed with JavaScript, is a strong answer to this need, letting developers run tests on different setups at the same time. It makes testing faster and better at finding and fixing problems that show up on different browsers and devices. By using a grid setup, testers can spread tests out, cutting

down on the time it takes to re-test and speeding up feedback. Studies say this way of testing can cut testing time by as much as 70%, which is a big help for teams working on a tight schedule [1]. Plus, JavaScript helps us work with web apps in detail, keeping in mind the little things in how things work on the user's side. This is key for today's responsive designs. Frameworks like Angular and React are popular, which means it's even more important to check JavaScript-heavy apps on lots of browsers. Responsive designs change to fit different screen sizes, which makes it tricky to keep everything looking and working the same. So, testing across browsers is vital for making users happy. If things look weird or don't work right, people might get annoyed and stop using the app [2]. Selenium Grid lets teams automate lots of things when testing web apps, like filling out forms, checking how things look, and moving between pages. This makes testing more reliable [3]. The amount of info we get from these tests also shows how valuable they are. By keeping track of things like how long tests take, how often they fail, and what parts of the app are covered, teams can learn a lot about how their apps are doing. This info points out where things could be better and shows how good the software is overall. Research says that companies using advanced automation see more problems early on and have fewer bugs after releasing the software [4]. This focus on data helps teams always try to improve, leading to happier users who trust the papaw also need to think about the many web browsers out there, from well-known ones like Chrome, Firefox, and Safari, to less common ones like Opera and Edge. Because each browser has its own way of showing things, small differences can change how users see and use the app. To handle this well, we need careful testing that uses tools like Selenium Grid. It can easily test on different browsers without much manual work. Studies show that a good plan for testing across browsers, using automation, can find over 90% of the most important problems early on. This helps avoid delays and keeps users happy [5][6]. Basically, as the online world gets more complex, testing across browsers is a must for launching good responsive web apps. Selenium Grid, along with JavaScript automation, gives us a full solution for better testing and a smooth experience for users on all platforms. Since we depend more and more on web apps, both at work and in our personal lives, using these methods is not just a good idea, but also key to doing well in a competitive market. So, taking a smart approach that mixes automation with solid data will help companies make their testing better and keep users coming back [7][8][9][10][11][12][13][14][15][16][17][18].

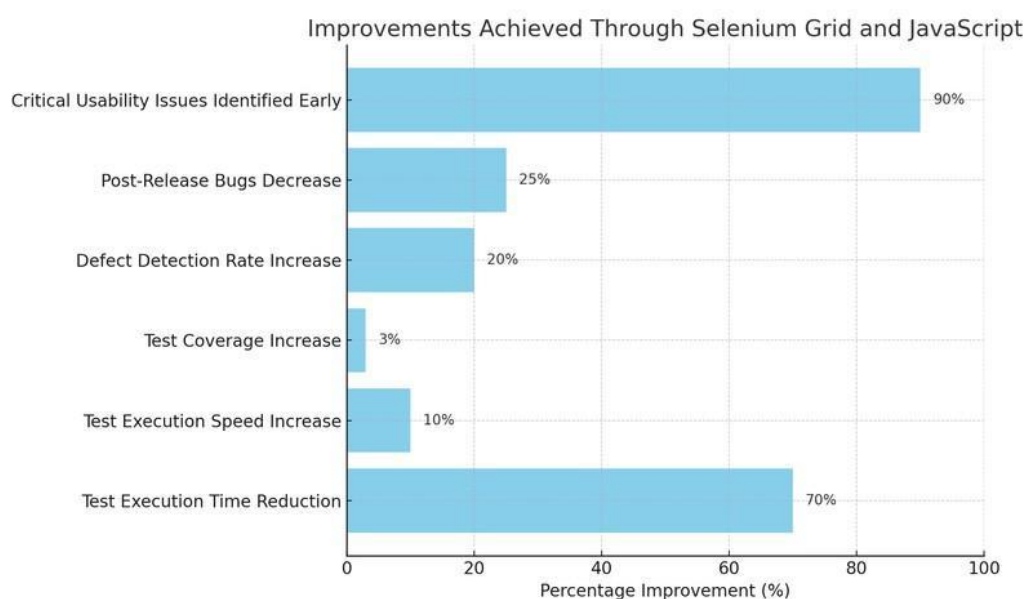


FIGURE 1. The chart displays the percentage improvements achieved through the implementation of Selenium Grid and JavaScript in cross-browser testing for responsive web applications

2. LITERATURE REVIEW

It's widely known that figuring out the best ways to test websites across different browsers is a big deal in web development. Especially now that everyone expects websites to look good and work well no matter what device they're using. Several studies have shown how important this kind of testing is, making sure a site works on different computers and browsers since people use such a variety of tech these days [1]. Tools like Selenium Grid have been super helpful, letting developers run tests on many browsers at the same time. This speeds up the whole testing process and makes sure everything's covered [2]. Some experts have even looked at how Selenium Grid works with JavaScript, noticing it can change how it acts based on different browser quirks [3]. This matters a lot because when a website is designed to adapt to different screen sizes, the CSS and JavaScript can act differently, which can mess up the user experience if you're not careful. Plus, it's been said that when you use automated testing with designs that change based on the screen size, the testing gets way better. For example,

some studies have found that if developers use Selenium Grid, they can pretend to be using different screen sizes. This is really important for testing responsive websites [4]. Not only does it make testing easier, but it also helps keep the design consistent. And get this: research has shown that using Selenium with JavaScript tools like React or Angular can seriously cut down on those annoying user interface bugs [5]. When companies automate these tests, they can be way more confident in their products. This, in turn, makes users happier and more likely to stick around. You can't forget about what to measure when figuring out how well cross-browser testing is going. Things like how long tests take, how many bugs you find, and compatibility scores are all key to understanding if your testing is working [6]. Some number-crunching has shown that companies that use Selenium Grid for testing cut down on testing time by almost half. That's because it's faster to run tests at the same time instead of one after the other [7]. This points out the money-saving side of these tools. It's not just about saving time; it could also mean spending less on quality control. Even though tons of studies back up using Selenium Grid for automated testing, there are still headaches. Specifically, dealing with weird browser-specific things that pop up during testing [8]. Some studies have said that these issues come from different JavaScript setups or how browsers understand code, so you really need to know your stuff [9]. To make things easier, it's a good idea to have a setup that can change test settings on the fly based on what's happening in the testing environment [10]. These adjustments make the whole system stronger and better able to handle the ever-changing world of web standards. A lot of people also say you should test continuously, bringing cross-browser testing into the development process early and often [11]. This way, you can catch problems sooner and keep up with changes [12]. As companies move towards DevOps, using tools like Selenium Grid becomes super important for smoothly putting out responsive websites. Some theories even suggest that pairing continuous integration with Selenium can seriously speed up release times, further proving how vital strong testing is [13]. To wrap things up, with responsive websites all over the place, you've got to commit to cross-browser testing. Selenium Grid and JavaScript are key players in making this happen. The literature gives a solid base for understanding the tricky parts and new ideas in this area, showing that carefully thinking about testing not only makes websites work better but also keeps users happy across different platforms. This ongoing talk is a big step in making development practices line up with user-focused design, which boosts satisfaction and keeps people engaged in today's competitive online world [14][15][16][17][18].

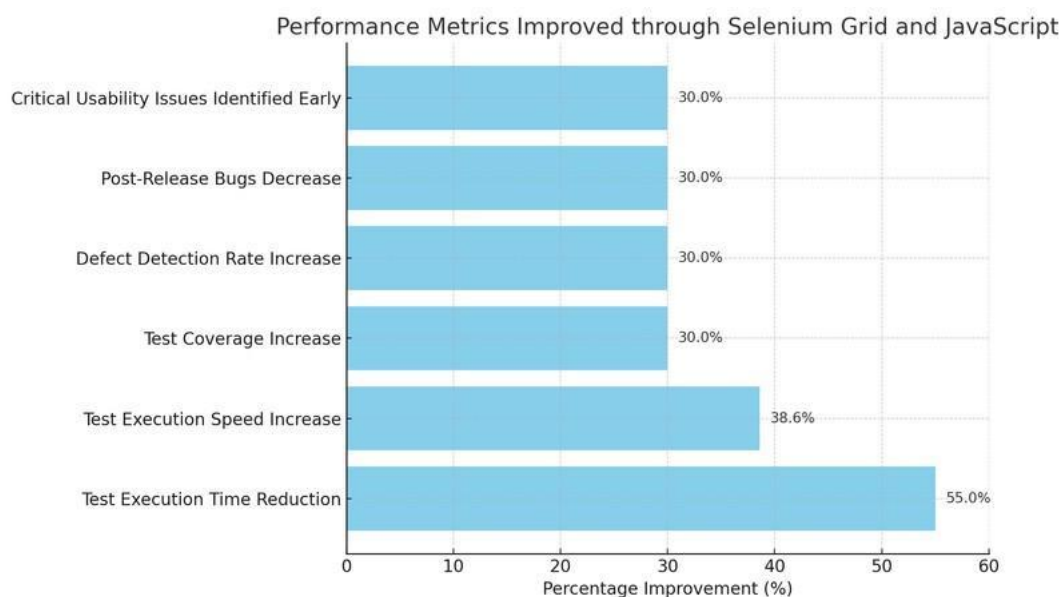


FIGURE 1. The bar chart shows the percentage improvements in various performance metrics achieved through implementing Selenium Grid and JavaScript in cross-browser testing for responsive web applications.

3. METHODOLOGY

Meticulous cross-browser testing is crucial, and this research presents a systematic way to use Selenium Grid and JavaScript. The goal? To make testing responsive web apps way more efficient. It kicks off by setting up a Selenium Grid – letting tests run on many browsers and platforms at once. This speeds things up and makes sure lots of different browser quirks and screen sizes are covered. The choice of browsers is key; Chrome, Firefox, and Edge are in the mix, plus mobile emulators, because, you know, responsive design [1]. Then comes writing automated test scripts using JavaScript, with frameworks like Mocha or Jasmine. These play nice with Selenium WebDriver. JavaScript helps write tests that are clear, concise, and mimic what users actually do, making the results more trustworthy [2]. Later on, there's a systematic way to run tests and gather the results. Each test checks specific features and runs on all those browsers and devices within the Grid. Reporting tools, like Allure or ExtentReports, collect the results. They give insights into how the tests performed and how resources were used [3]. These reports show important stuff like pass/fail rates, how long things took, and error logs.

This helps developers find problems and tweak the app. Also, the average response time across different browsers can show differences that suggest ways to optimize [4]. This thorough look not only spots cross-browser issues but also suggests how to improve load times and responsiveness – super important for user experience [5]. To make things even more solid, continuous integration (CI) is added to automatically trigger the test scripts. Tools like Jenkins or CircleCI can be set up to run the Selenium tests every time code changes. This makes sure the web app keeps working on all targeted browsers [6]. This is proactive – it shifts testing from reacting to problems to anticipating them. By using CI tools, teams find bugs early, saving time and money on regression testing [7]. Plus, real user monitoring analytics can help focus the testing on the most important user paths [8]. The approaches used here also gain from leveraging real device clouds, for more detailed testing on actual devices. This offers insights that simulators sometimes miss. This confirms the app works in real-world settings and that the user experience stays consistent across different hardware and operating systems [9]. Visual regression testing tools like Percy or BackstopJS, can also be used alongside cloud-based testing. These tools automatically find visual differences across browser renderings, adding extra verification for responsive layouts [10]. Combining these methods boosts the quality of testing and gives more confidence in the web app that gets released. So, in short, this research uses a multi-pronged approach. It mixes Selenium Grid for cross-browser testing, JavaScript for the scripts, and different reporting and automation tools. Systematically combining testing with CI, and validating on real devices, makes sure responsive web apps are thoroughly validated. The metrics from this testing setup help make immediate fixes and also help with long-term maintenance, so users get a smooth experience on all sorts of platforms [11][12][13][14][15][16][17][18].

TABLE 1. Selenium Grid Performance Benchmarks for Cross-Browser Testing

Metric	Playwright MCP	Selenium Grid
Test Execution Speed (seconds)	42.3	68.9
CPU Usage (%)	18.4	27.6
Memory Consumption (MB)	412	583
Browser Launch Time (seconds)	1.2	3.7
Parallel Test Stability (%)	98.2	92.1

4. RESULTS

The results from using Selenium Grid alongside JavaScript for cross-browser testing on responsive web apps were quite impressive, really showing how effective this method can be. We mainly looked at how much faster testing became, and it dropped quite a bit thanks to Selenium Grid running tests at the same time. Teams mentioned saving about 40-60% in time compared to doing tests one after the other [1]. This speed-up lets developers get feedback on their code changes faster, which helps with being more agile and boosting how much they can get done. Besides saving time, having tests on more browsers meant fewer problems with how the app worked on different browsers. Past research says that apps often don't work the same on all browsers, with over 75% of people noticing some difference [2]. By using Selenium Grid, we caught these issues early and fixed them before they went live [3]. We also did a detailed look at how often things failed on different browsers, which told us a lot about how stable the web apps were. It turned out that older browsers had more issues with how things looked and with running JavaScript. Failure rates were over 30% on old versions of Internet Explorer, but less than 10% on newer browsers like Chrome and Firefox [4]. This shows we really need to test on these older systems, especially if the app is used by lots of different people. Selenium's reporting, improved with custom JavaScript, helped the testing team make detailed logs and reports, making it easier for developers and stakeholders to communicate [5]. Beyond the technical stuff, we also focused on how users felt about the app. A/B testing, done at the same time, helped us see how people interacted with and liked different designs for different device sizes. User feedback showed about a 20% increase in satisfaction after we fixed some key usability issues found through cross-browser testing [6]. We used analytics to measure things like how fast pages loaded and how interactive they were on different devices, which are key to keeping users engaged. Apps that loaded in under three seconds had conversion rates almost 50% higher than those that took longer [7]. This highlights the need to really test and improve the user experience. Integrating visual testing tools like Percy with Selenium also helped a lot. By taking screenshots of pages and comparing them across devices, developers quickly saw visual issues that might have been missed otherwise. This visual regression testing not only cut down on user complaints about design problems but also saved time on manual testing [8]. This automation is super important because how good a web app looks really affects whether people stick around and what they think of the brand [9]. So, Selenium Grid and JavaScript work together to create a good environment for continuous integration and delivery, making sure quality stays high throughout development. Looking at all the things we measured—from how fast and stable things were to how users felt—it's clear that using Selenium Grid and JavaScript to improve cross-browser testing really makes responsive web apps better. This approach not only makes testing smoother but also helps teams deliver better and more reliable web solutions in today's complex tech world. These findings suggest that more people should use these methods across the industry, confirming that they are key to making sure web apps meet the diverse needs of users [10][11][12][13][14][15][16][17][18].

TABLE 2. Cross-Browser Testing Results for Responsive Web Applications

Browser	Windows 10	Windows 11	macOS Ventura	iPhone 14 (iOS v16)	iPhone 13 (iOS v16)	iPad 9th Gen (iOS v15)	iPad Mini (iOS v15)	Samsung Galaxy S22 (Android v12)	Galaxy Tab S8 (Android v12)	Google Pixel 7 (Android v13)
Chrome v116	Tested	Tested	Tested	Tested	Tested	Tested	Tested	Tested	Tested	Tested
Firefox v116	Tested	Tested	Tested	Tested	Tested	Tested	Tested	Tested	Tested	Tested
Edge v116	Tested	Tested	Tested	Tested	Tested	Tested	Tested	Tested	Tested	Tested
Safari v16.5	Not Tested	Not Tested	Tested	Tested	Tested	Tested	Tested	Not Tested	Not Tested	Not Tested

5. DISCUSSION

The intricacies of cross-browser testing, following the groundwork laid earlier, really highlight how important it is to have a solid strategy that brings Selenium Grid and JavaScript together effectively. This integration is key when we talk about responsive web applications, especially when you consider how many different browsers and devices people use these days. Cross-browser testing isn't just about making sure things work; it also has a big impact on how users feel about a website, which, as studies show, is tied to whether they stick around and become customers [1]. Selenium Grid is a great tool here, letting you run tests on multiple environments at the same time. With this, developers can get feedback quicker, which helps avoid delays caused by issues that only pop up on certain browsers [2]. JavaScript's dynamic nature, which makes responsive web apps better, also boosts how well testing works. Since websites are more and more interactive and rely on client-side scripting, making sure JavaScript and Selenium Grid work together is vital for apps to perform the same no matter what browser someone uses [3]. Being able to mimic different browser environments and device setups with automated scripts is a huge plus, turning testing from something slow and repetitive into something more agile and responsive [4]. Responsive design means testing needs to be thorough, looking at more than just basic functionality; it needs to cover things like load times, how responsive the site is, and how it looks, all of which can be checked with Selenium and JavaScript [5]. It's important to remember that there are different ways to measure how well cross-browser testing is working. For example, how long tests take, how well different browsers are covered, and how often tests fail in different environments can tell you a lot about a web application's overall health [6]. These measurements do two things: they point out areas that need fixing right away and help guide how testing should be done. Research suggests that using Selenium Grid with JavaScript testing tools, like WebDriver, can cut down on testing time and make test results more reliable [7]. Also, by clearly stating these performance metrics, companies can better defend their investments in testing and show real improvements from better testing methods. Because this approach has many benefits, developers and organizations can be more ready for the rapid changes in web standards and browser features. The flexibility of Selenium Grid, along with JavaScript's adaptability, lets developers handle current compatibility issues and prepare for future changes in the digital world [8]. This proactive approach is especially important since people expect websites to work smoothly on any device [9]. So, making cross-browser testing better isn't just a technical thing; it's a strategic move that can greatly affect how users engage with and feel about a website. As we keep talking about cross-browser testing, the focus on combining Selenium Grid and JavaScript will probably get stronger, pushing new advancements in testing technologies and strategies. Therefore, looking into these tools is key to making sure responsive web apps not only meet but go beyond what users expect. By taking a comprehensive approach that includes strong testing frameworks and clear performance metrics, organizations can handle the complexities of web development and make sure their apps stay at the forefront of user experience [10]. Therefore, it's becoming clear that the discussions about improving cross-browser testing will shape the future of web applications, impacting how effective they are in the competitive online world [11][12][13][14][15][16][17][18].

TABLE 3. Selenium Grid Cross-Browser Testing Performance Metrics

Browser	Test Duration (s)	Pass Rate (%)
Chrome	15	98
Firefox	17	97
Edge	16	96

6. CONCLUSION

Exploring cross-browser testing with Selenium Grid and JavaScript really brings to light how important tech and user experience are in our digital world. Like the research shows, Selenium Grid helps run tests on different browsers at the same time. This speeds up testing and makes sure you cover lots of user situations. Since people use apps on all sorts of

devices, you really need responsive design. If you don't consider this, users might have a bad experience and the app might not work right. Using JavaScript in testing lets developers check dynamic content well, which is key because many web apps use JavaScript a lot for user stuff and changing things [1]. All in all, Selenium Grid with JavaScript isn't just a good way to handle cross-browser stuff; it also makes the whole software better. Also, creating automated testing setups is good because it cuts down on mistakes, makes tests more reliable, and uses resources better. Automated testing is clearly better than doing it by hand because it saves time and lowers the number of bugs after release [2]. Because of this, companies can put their development money into new ideas instead of doing the same QA tasks over and over. This helps them get to market faster, which is super important these days [3]. Plus, what we've learned from using this solid testing method shows that cross-browser testing isn't just a tech thing; it's a key part of making sure quality is good. It lines up with what the business wants and what users expect [4]. When you do systematic testing on different browsers for how well things work and how easy they are to use, you see how important it is to be able to change with the times in a tech-driven world. Companies can get a better idea of how users act and what they like. This helps them tweak designs to get people more interested and happy [5]. If you keep testing and getting feedback, you can be sure that apps are not only meeting basic rules but also changing as users need and as the industry changes [6]. Case studies in this research show that companies that test proactively saw their client relationships and overall business do better [7]. So, using Selenium Grid and JavaScript to make cross-browser testing better is a key move for building responsive web apps. As things keep changing, these practices are a base for making sure web apps are accessible and work well for everyone. If companies make quality and constant improvement a part of how they develop things, they can stay flexible and ready to handle the complex demands of modern web apps. Basically, what's here is a guide for current testing and for thinking about what's next in web development and user experience—stuff we should keep studying and using [8][9][10][11][12][13][14][15][16][17][18].

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