

## Role of Generative AI in Augmented Reality (AR) and Virtual Reality (VR) Application Testing

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### ABSTRACT

The integration of Augmented Reality (AR), Virtual Reality (VR), and Generative Artificial Intelligence (AI) into testing applications heralds a new era of innovation and efficiency. As AR and VR technologies spread throughout sectors, robust testing procedures become increasingly important. Generative AI provides a viable answer to the particular issues associated with testing immersive and interactive AR/VR apps. Because AR and VR apps are interactive and immersive, testing them brings new problems that necessitate the development of novel methodologies for functionality and user experience validation. This study investigates the convergence of AR, VR, and Generative AI in testing, emphasizing the vital importance of understanding the possible benefits, obstacles, and best practices associated with this novel approach. Developers and testers may better exploit disruptive technologies such as AR and VR by investigating the core ideas, techniques, and applications of Generative AI.

The incorporation of Generative AI into AR/VR testing frameworks has enormous promise for providing solutions to existing issues in testing immersive apps. Traditional testing methods, primarily manual, struggle to emulate natural user interactions and provide various test cases, resulting in restricted coverage and scalability issues. Furthermore, maintaining the integrity of 3D content rendering is difficult, exacerbated by the complexity of AR/VR situations. Generative AI takes a revolutionary approach, allowing for the production of realistic user interaction simulations, automated test case generation, and synthetic 3D material for thorough testing across multiple scenarios. Techniques like Generative Adversarial Networks (GANs) and Variational Autoencoders (VAEs) make it easier to create synthetic environments and augment data, improving AI models' robustness and generalization.

The incorporation of Generative AI into AR/VR testing continues to face challenges, such as restricted device availability, a lack of standards, technological complexity, and inadequate testing tools. Overcoming these issues necessitates ongoing study, collaboration, and innovation in the AR/VR business. Embracing Generative AI in testing methodology has the potential to expedite testing procedures, increase application quality, and stimulate innovation in the AR/VR ecosystem. Using Generative AI, developers can ensure the functionality, stability, and immersive user experiences of AR/VR applications, propelling the industry to unprecedented development and innovation.

**Keywords:** Augmented Reality, Virtual Reality, AR, VR, Generative Artificial Intelligence, Generative AI, Testing, Data Augmentation

## 1. Introduction

Augmented Reality (AR) and Virtual Reality (VR) have quickly developed as disruptive technologies with applications<sup>1</sup> in entertainment, software, education, and healthcare, and many areas are yet to be explored. As immersive experiences grow more integrated into our daily lives, it is critical to ensure their quality, usefulness, and effectiveness. Because AR and VR applications are interactive and immersive, testing them with Generative AI presents unique problems<sup>2</sup> requiring novel techniques to validate functionality and user experience.

In this respect, generative artificial intelligence (AI) collaboration with AR and VR testing holds immense potential. This article delves into the convergence of AR, VR, and Generative AI in the testing context, underlining the crucial need<sup>3</sup> to understand the potential advantages, challenges, and best practices associated with this novel approach. We explore the fundamental principles, approaches, and applications of Generative AI for AR and VR testing, providing insights and recommendations to help developers and testers harness the full potential of these disruptive technologies. By understanding Generative AI's capabilities and limitations comprehensively, we aim to drive breakthroughs in AR and VR testing procedures, ultimately enhancing the quality and impact of immersive experiences for people worldwide.

The rapid expansion of Augmented Reality (AR) and Virtual Reality (VR) technologies has sparked significant interest in developing robust testing approaches to ensure functionality, reliability, and user satisfaction within these immersive environments. A particularly promising avenue of research lies in integrating Generative Artificial Intelligence (AI) tools into AR/VR testing frameworks. This literature survey aims to explore pivotal works at the intersection of AR/VR testing and Generative AI, shedding light on their collective implications and potential for innovation.

## 2. Problem Statement

Generative Artificial Intelligence (GenAI) faces a hurdle when testing next-generation Augmented Reality (AR) and Virtual Reality (VR) applications because current frameworks struggle to automate interactions such as eye tracking, hand tracking, and 3D object manipulation in immersive environments. Due to a lack of automation, substantial human testing is required, resulting in higher expenses, inadequate test coverage, and scalability concerns. To solve this, GenAI must create new testing systems capable of simulating natural user interactions, validating 3D content accuracy, and automating spatial navigation and manipulation in AR/VR environments.

## 3. Literature Survey

Riegler, Riener, and Holzmann's systematic review<sup>4</sup> examines augmented reality (AR) applications in the context of automated driving. The assessment runs from 2009 to 2020 and examines various AR implementations and their impact on automated driving systems. The authors investigate the function of augmented reality (AR) in improving situational awareness, navigation, and user interaction in autonomous cars. They investigate several AR technologies, such as head-up displays (HUDs), dashboard projections, and windshield overlays, and evaluate their efficacy in giving real-time feedback and visualizing sensor data. The review covers the obstacles and limitations of incorporating AR into automated driving,

including technical constraints, user acceptance, and regulatory considerations.

Rzig et al. investigate<sup>6</sup> the state of virtual reality (VR) software testing. The study examines many areas of VR testing methodology, problems, and practices. The authors hope to identify the distinct characteristics and requirements of VR software testing by examining existing research and industry data. The study covers important topics like interaction testing, environmental variability, hardware integration, 3D content rendering, cross-platform compatibility, performance optimization, and usability evaluation in VR environments. This comprehensive assessment gives useful insights into the difficulties and intricacies of testing VR apps, laying the groundwork for future research and development in the field of VR software testing. According to research<sup>7</sup> on Augmented Reality and Virtual Reality technology is crucial in the field of information technology and software development. These technologies have already been applied in various fields, including education, medical treatment, construction, military affairs, and entertainment.

Investigate the interaction of VR content development<sup>8</sup> with deep learning approaches. The survey offers an overview of cutting-edge methodologies and advancements in applying deep learning to generate and explore VR content. The writers look at many areas of VR content development, such as 3D modeling, texture synthesis, scene generation, and immersive experiences. By evaluating existing literature and research, they identify important trends, problems, and opportunities for deep learning to improve VR content creation workflows. Wang et al.'s survey contributes to our understanding of how deep learning techniques can transform the process of creating and enjoying virtual reality material, paving the stage for future breakthroughs in this quickly growing industry.

Overall, these studies provide a thorough grasp of the current status, problems, and prospects for using Generative AI to test AR and VR systems, paving the way for future advances in this quickly growing field.

## 4. Current Methodology

AR/VR testing approaches are mostly manual, resulting in limitations. Existing frameworks struggle to simulate realistic user interactions in 3D space, such as eye tracking and hand motions. Additionally, developing different test cases that cover a wide range of user scenarios is a time-consuming and resource-intensive operation. Furthermore, maintaining accurate rendering and behavior of 3D objects in an immersive environment is challenging, particularly when depth perception and user viewpoint are taken into account. However, generative AI has enormous potential for overcoming these constraints. We may leverage its features to develop realistic user interaction simulations, automatically generate thorough test cases, and create synthetic 3D content for testing a broader range of scenarios. This change to Generative AI-powered testing has the potential to transform the AR/VR testing landscape, resulting in more robust applications and, eventually, a more seamless and immersive user experience.

Overall, testing without generative AI for AR/VR testing entails assessing systems based on existing functionalities and capabilities rather than their ability to generate datasets based on prediction and test cases.

### 5. Proposed Mechanism

Generative AI has demonstrated encouraging results in modeling complicated real-world environments for AR/VR testing, providing a more cost-effective and scalable alternative to traditional physical setups. Here’s how generative AI is applied across the existing setup.

- **Environment Generation:** Generative AI techniques, such as Generative Adversarial Networks (GANs) and Variational Autoencoders (VAEs), may create synthetic environments that are very similar to real-world datasets. These algorithms can create a variety of landscapes with different lighting conditions, textures, objects, and spatial layouts, simulating the complexities of real-world settings.
- **Data Augmentation:** Generative models can improve current datasets by producing more synthetic data points. This is very beneficial for developing machine learning models for AR/VR applications that require massive amounts of heterogeneous data. Augmented datasets can improve the resilience and generalization of AI models, making them more adaptive to real-world situations. Generative AI techniques such as Generative Adversarial Networks (GANs) and Variational Autoencoders (VAEs) can generate realistic 3D models of objects, environments, or characters. These models can be tailored to specific requirements and used as synthetic test data to train machine-learning models or validate application behavior.

In VR applications, avatars play a crucial role in user interaction and immersion. Generative AI algorithms can create personalized avatars by synthesizing facial features, body shapes, and clothing styles based on input parameters or reference images. These avatars can be used for user testing, social interactions, or virtual meetings.

- **Scenario Simulation:** Generative AI can mimic certain scenarios or occurrences in virtual environments, including traffic analysis, workload analysis, and application model distribution. Simulating multiple scenarios allows developers to evaluate the functionality of AR/VR apps in various contexts, including complex behavior that would be difficult to duplicate physically.
- **Dynamic adaptation:** AI-powered simulation environments can alter dynamically based on human inputs or predefined parameters, enabling interactive testing experiences. For example, generative AI can simulate changes in types of execution, monitoring of database and application, and user behavior to assess how AR/VR applications adapt in real-time.
- **Eye tracking:** Eye tracking technology, along with Apple’s Vision Pro, opens up a world of possibilities for developers to create creative and immersive AR experiences. As this technology advances and becomes more widely used, we should expect to see even more intriguing apps that use eye tracking to improve user interaction, accessibility, and engagement in AR environments.
- **Hand Pose Estimation:** Gesture recognition is integral to many AR/VR applications, allowing users to interact naturally with virtual objects or interfaces. Generative AI algorithms, such as Convolutional Neural Networks (CNNs) or Graph Neural Networks (GNNs), can accurately estimate hand poses from depth or RGB images, enabling precise gesture support in applications.

- **Gesture Synthesis:** Generative AI techniques can synthesize realistic hand gestures or movements based on high-level commands or motion trajectories. By understanding the semantics of gestures and their context within the application, generative models can generate natural and contextually appropriate gestures, enhancing user experience and interaction fidelity. Moreover, Generative AI-powered models can adapt to dynamic changes in hand gestures or movements, improving robustness and accuracy in gesture recognition tasks.
- **Cost and Time Savings:** Using generative AI for environment simulation, developers can dramatically cut the costs of building up real testing settings. Furthermore, the time necessary to iterate and test AR/VR applications can be shortened because virtual environments can be swiftly built, updated, and reset as needed.
- **Customization and control:** Generative AI enables developers to tailor virtual environments to specific testing objectives and needs. Developers can manage ambient variables, object placement, and complexity, allowing for more exact testing and analysis.
- **Cross-platform compatibility:** Synthetic worlds created by generative AI may be readily integrated into numerous AR/VR development platforms and frameworks, ensuring interoperability with various hardware and software combinations.

We suggest using Generative Artificial Intelligence (AI) to replicate complicated real-world situations in AR/VR applications during testing. By leveraging Generative AI, we hope to eliminate dependency on costly physical setups, shorten testing methods, and improve the overall efficiency and efficacy of AR/VR testing.

**Table 1:** Comparison of Traditional & Proposed Testing.

Parameter	Traditional	Proposed
Challenge	Simulating natural user interactions (eye tracking, hand tracking)	Train GenAI models on user data to create realistic simulations.
Challenge	Manual test case creation (limited coverage)	Generates comprehensive test cases based on app functionality and user behavior.
Challenge	Testing 3D content fidelity (rendering, depth perception)	Create synthetic 3D objects and environments for broader testing scenarios.
Scalability	Limited to available physical setups	Enables testing across a wider range of virtual environments.
Accuracy	Prone to human error (manual testing)	Reduces human error through automation.
Testing Procedure	Time-consuming, requires manual intervention	Streamlines testing with automated processes.
Coverage	Limited to predefined test cases	GenAI Offers broader coverage through diverse simulated user interactions and synthetic data.

Overall, using generative AI to simulate complex real-world settings in AR/VR applications is a diverse and cost-effective way to test and validate the performance and functionality of these technologies.

### 6. Results and Discussion

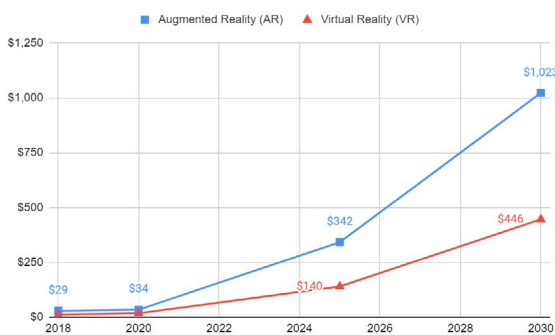
To ensure the functioning and user experience, generative AI models for augmented reality (AR) and virtual reality (VR) applications must be tested using a variety of critical approaches

and factors. This article looks at the possibilities of Generative AI (GenAI) for testing AR/VR applications. Here are the main takeaways.

- AR/VR is fast evolving, and rigorous testing methodologies are required to assure user experience and functionality.
- Traditional testing approaches have limitations in modeling user interactions and developing different test cases.
- GenAI provides a promising solution by allowing for realistic user interaction simulations, automated test case production, and synthetic 3D content creation.

Using these approaches, developers can ensure that generative AI models used in AR and VR apps are reliable, perform well, and satisfy users.

According to the use of AR & VR in industries, the projection for Augmented Reality (AR) and Virtual Reality (VR) projects a consistent increase in value over time.



**Figure 1:** Industry growth projection of AR & VR.

AR and VR are on an increasing trajectory, with values climbing steadily from 2018 to 2030. This means that the demand or popularity of AR and VR technologies will likely increase dramatically in the coming years.

## 7. Challenges

Automating the testing of an AR (Augmented Reality) application with 3D content introduces several challenges due to the unique nature of AR experiences. On the other hand, automating the testing of fully immersive applications (Virtual Reality) with 3D content presents several unique challenges due to the complexity of these applications. Here are some key challenges

### 1. Real-world Interaction Simulation/Patterns:

- AR applications overlay virtual 3D content onto the real world, requiring testers to simulate real-world interactions such as object recognition, spatial tracking, and environmental context awareness. Automating these interactions accurately within diverse real-world scenarios poses a significant challenge, as it requires sophisticated testing frameworks capable of integrating with AR hardware and software components.
- Fully immersive applications often involve complex interaction patterns, including hand gestures, body movements, voice commands, and spatial navigation. Designing automated tests to simulate and validate these interactions accurately can be challenging, requiring sophisticated testing frameworks and tools.

### 2. Realistic Environmental Variability:

- AR applications operate in dynamic real-world environments with varying lighting conditions, textures, surfaces, and background elements. Automating testing across different environmental settings and contexts necessitates comprehensive environmental modeling and simulation capabilities to ensure consistent and reliable application behavior.
- Creating realistic virtual environments with 3D content for testing purposes is crucial but challenging. To ensure comprehensive testing coverage, automated testing frameworks must accurately simulate various environmental factors such as lighting conditions, textures, object interactions, and spatial layouts.

### 3. 3D Content Generation/Rendering:

- AR applications incorporate complex 3D content, including virtual objects, animations, textures, and spatial effects, which must be rendered accurately and seamlessly within the AR environment. Automating testing of 3D content rendering involves validating rendering quality, performance, occlusion handling, and visual consistency across various viewing angles and distances.
- Many immersive applications incorporate dynamic 3D content that changes based on user inputs, environmental conditions, or procedural generation algorithms. Automating the testing of such dynamic content requires adaptive testing approaches and real-time feedback mechanisms to validate content integrity and behavior.

### 4. Performance Testing and Optimization:

- AR applications demand high-performance rendering, real-time processing, and low-latency interactions to deliver immersive and responsive user experiences. Automating performance testing involves measuring frame rates, latency, memory usage, CPU/GPU utilization, and energy consumption to identify performance bottlenecks, optimize resource allocation, and ensure optimal application performance on target devices.
- Immersive applications often demand high-performance rendering and real-time responsiveness to deliver a seamless user experience. Automated performance testing tools must accurately measure frame rates, latency, rendering quality, and resource utilization to identify performance bottlenecks and ensure optimal application performance across different hardware configurations.

### 5. Usability and User Experience Testing:

- AR applications heavily rely on usability and user experience (UX) design principles to provide intuitive and engaging interactions within the real-world context. Automating usability testing involves evaluating factors such as interface clarity, content legibility, interaction intuitiveness, and overall immersion to assess the application's usability and UX quality objectively.
- Immersive applications heavily rely on user experience (UX) design principles to provide intuitive and engaging interactions. Automated usability testing tools must evaluate factors such as user comfort, navigation clarity, interaction intuitiveness, and overall immersion to assess the application's usability and UX quality objectively.

Automating the testing of AR and fully immersive VR applications with 3D content involves numerous obstacles, each of which stems from the unique nature of these experiences. Testing is complicated, requiring sophisticated frameworks and tools to simulate real-world interactions, ensure cross-platform compatibility, and optimize speed. To properly handle these problems, testing systems must grow to include complete environmental modeling, integration with specialized hardware, adaptive content validation methods, and usability assessment tools. By addressing these challenges, automated testing can improve AR and VR application dependability, functionality, and user experience, opening the path for mainstream adoption and success in various real-world scenarios.

## 8. Conclusion

Integrating Augmented Reality (AR), Virtual Reality (VR), and Generative Artificial Intelligence (AI) into testing applications is a huge technological leap, opening up a new frontier for creativity and efficiency. In a quickly changing market where AR and VR technologies are becoming more widespread in various industries, the necessity for rigorous testing methodologies has never been higher. Generative AI emerges as an effective answer to the particular issues of testing immersive and interactive AR/VR apps. Traditional testing methods can require costly physical setups and resource-intensive procedures, which limit scalability and coverage. In contrast, Generative AI takes a transformative approach, allowing for the building of synthetic environments, data augmentation, scenario modeling, and dynamic adaptation. Techniques like Generative Adversarial Networks (GANs) and Variational Autoencoders (VAEs) enable the creation of realistic synthetic environments, bypassing the constraints of physical setups and permitting complete testing across multiple scenarios.

Furthermore, Generative AI enables data augmentation, improving AI models' resilience and generalizability by generating synthetic data. This capability is extremely useful for building machine-learning models and evaluating application behavior in AR/VR environments. Scenario simulation allows developers to test AR/VR apps in various settings, whereas dynamic adaption allows simulation scenarios to change dynamically based on user inputs or specified criteria. Despite the bright prospects for Generative AI in AR/VR testing, substantial problems and misconceptions remain, such as limited device availability, a lack of standards, technological complexity, and limited testing tools. Overcoming these challenges needs ongoing study, collaboration, and innovation in the AR/VR business.

Embracing Generative AI and using its powers allows developers to shorten testing methods, improve application quality, and promote innovation in the AR/VR ecosystem. Integrating Generative AI into AR/VR testing frameworks can transform testing methodologies by assuring functionality, dependability, and immersive user experiences in AR/VR apps. As AR and VR technologies expand and gain momentum across sectors, the requirement for creative testing methods will only grow. By adopting Generative AI and pushing technological boundaries, we can open up new possibilities and catapult the AR/VR industry into a future of unprecedented innovation and growth.

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