

# AUGMENTED REALITY

COEN 332 – WIRELESS MULTIMEDIA NETWORKS

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## AUDIENCE

This document is targeted toward a technologically inclined audience, particularly those interested in immersive experiences, user interfaces, and human-computer interaction. It is also relevant for students pursuing degrees in computer science, information technology, or multimedia, as well as industry professionals in gaming, entertainment, education, and healthcare.

The intended audience is assumed to possess intermediate knowledge of IOT, multimedia, operating systems, and computer networks and an interest in knowing what is AR in order to comprehend the various technologies discussed in this paper.

This research paper explores the fundamental concept of Augmented Reality, encompassing its techniques, applications in diverse fields such as gaming, education, and manufacturing, and the associated implementation challenges and future prospects.

This research paper does not talk about programming or coding the underlying technology. Instead, it emphasizes practical applications and ongoing research in the field of Augmented Reality.

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# INTRODUCTION

With the help of cutting-edge technology known as augmented reality (AR), we can perceive and interact with the environment more effectively. It combines digital data, including 3D models, visuals, audio, and various other sensory inputs, seamlessly into our experience. It overlays digital content in the real world, letting users engage with both, in contrast to virtual reality, which produces an entirely immersive digital experience.

Prior to recently becoming a scientific reality, mixed reality and augmented reality were once thought of as science fiction. Instead of taking you out of your current environment and placing you in another one, its purpose is to enhance it through including virtual objects in three dimensions to it. Because the word "augmented" means "to add to or increase," AR transforms the environment of the user through digital means.

## a. Definition and fundamental concepts of Augmented Reality

The main idea regarding augmented reality is to add digital content to practical applications and data in order to enhance reality. It gives consumers real-time access to more information, context, and interactive components, improving their comprehension, efficiency, and overall experience.

Computer vision, recognition of images, and tracking technologies are at the heart of augmented reality (AR), which uses them to precisely determine and align virtual features with real-world items or locations. AR applications provide users with an enriched perception of their surroundings by using cameras, sensors, and displays on mobile devices, smart glasses, or headsets.

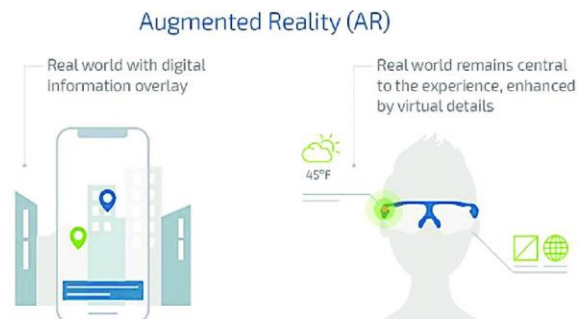


Figure 1: Augmented Reality Fundamental Source: ResearchGate

## Key Elements of Augmented Reality:

- AR systems combine virtual content with the physical world in real time, ensuring a seamless and interactive user experience.

### Real-Time Integration:



- AR applications consider the user's location, orientation, and environment to provide relevant and meaningful digital information.

### Contextual Awareness:



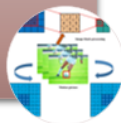
- AR interfaces allow users to interact with virtual elements through gestures, voice commands, or other input methods, enabling a natural and intuitive user experience.

### Interaction and User Interface:



- Precise tracking and alignment of virtual objects with real-world objects or surfaces ensure accurate augmentation and maintain a consistent user perspective.

### Registration and Tracking:



- AR systems employ various techniques, such as projection, superimposition, or transparent displays, to render virtual content in a manner that integrates seamlessly with the physical environment.

### Visualization and Rendering:



Figure 2: Key Elements of AR

## b. Significance and relevance of AR in various fields

Augmented Reality (AR) is highly relevant in a variety of professions and sectors, altering the way people interact, acquire knowledge, create, and experience our surroundings. Here are some crucial instances where AR displays its importance:

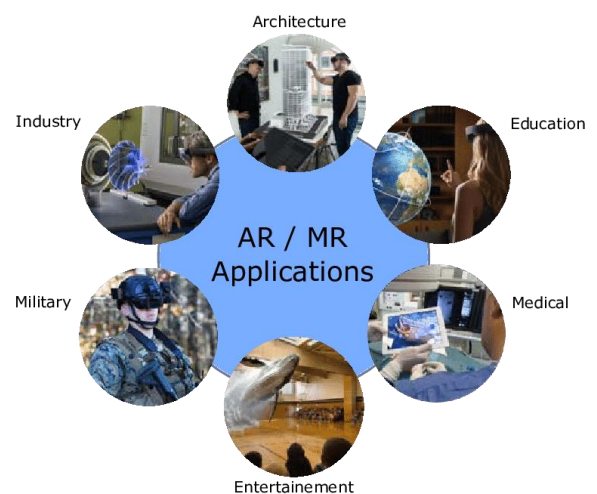


Figure 3: AR in various fields

- Gaming and entertainment: By delivering immersive experiences, augmented reality has completely changed these industries. Users can interact with virtual people, things, and settings that are superimposed on the actual world to create engaging and dynamic gameplay.
- Education and Training: By bringing abstract ideas to life, augmented reality (AR) offers creative educational opportunities. It makes engaging and graphical learning experiences possible, fostering interest and comprehension in areas like geography, history, and science. In industries like health, engineering, and aviation, AR may additionally be utilized in training simulations.
- Healthcare and medical treatment: AR has the ability to improve surgical procedures, medical education, and patient care. Using augmented reality (AR), surgeons may see and move through the patient's anatomy in actual time, increasing accuracy and lowering risks. Additionally, it makes telemedicine and remote consultations possible.
- Applications in Manufacturing and Industry: AR is essential to both the manufacturing and industrial industries. It supports assembly procedures by offering detailed instructions and identifying potential mistakes. AR-based guidelines for maintenance and repairs streamline processes, increasing effectiveness and minimizing downtime.
- Engineering and design: AR helps designers and architects to more interactively understand and present their designs. Prior to construction, it enables clients to enjoy virtual tours of structures and spaces, improving making choices and design communication.
- Tourism and navigation: By offering immediate details about landmarks, important places, and points of interest, augmented reality (AR) improves tourists' experiences. By steering users through unfamiliar areas and giving them pertinent details about their surroundings, it provides navigation help.
- Advertising and Marketing: AR gives marketing initiatives an interactive and captivating component. It makes it possible to virtually try on clothing and cosmetics, see things in the actual world, and develop engaging brand experiences that draw in customers.



- Cooperation and remote assistance: By enabling users to exchange virtual information and engage with other individuals in augmented environments, AR promotes distant cooperation. It enhances efficiency and lowers travel expenses by enabling specialists to offer remote guidance and support in real time.
- AR is utilized to protect and present historical locations and cultural heritage assets in museums. Visitors can learn more about the histories and meanings behind the exhibitions through its interactive and educational activities.

### c. Overview of the report structure

This comprehensive report explores the fundamental concepts, technologies, and applications of AR across various fields.

#### Chapter 1: Introduction to AR

The importance of Augmented Reality (AR) in improving our view of and interaction with our surroundings is emphasized in this chapter's introduction to technology. It illustrates how augmented reality (AR) easily incorporates digital data into our current surroundings by fusing virtual aspects with the real world. The chapter also emphasizes the differences between augmented reality (AR) and a virtual reality (VR), with augmented reality (AR) allowing consumers to communicate with both the real environment and digital material.

#### Chapter 2: AR Technologies and Techniques

Different AR methods and tools are examined here. It starts with a description of marker-based augmented reality, which uses actual markers as benchmarks for aligning virtual material. The discussion then shifts to markerless augmented reality (AR), which uses tracking and registration techniques instead of markers to overlay digital content. The use of mapping projections with interactive surfaces to produce immersive AR experiences is highlighted in the discussion of projection-based AR. The topic of sensor-based augmented reality is also explored, with a focus on camera and depth-sensing systems that record and analyze actual data. Additionally, the usage of intuitive user engagement strategies including recognizing gestures and voice commands as well as communication methods in augmented reality systems are investigated.

### Chapter 3: AR Applications

This chapter looks at the many different areas where augmented reality is having a big impact. The first section, titled Augmented Reality in Entertainment & Gaming, explains how AR creates immersive gaming environments and makes it possible to include virtual characters as well as items in gameplay. The use of AR in training and instruction is then discussed, emphasizing how AR improves classroom settings and makes simulations and training easier. The chapter then shifts to augmented reality (AR) in healthcare and medicine, emphasizing its uses in surgery guidance, visualization, rehab, and treatment. The usage of AR for manufacturing & industrial applications is highlighted, with a focus on the processes for quality control and inspection as well as assembly and maintenance instructions. This article examines AR in design and architecture and shows how it might help with virtual prototyping and design visualization. The use of AR in navigation and tourism is examined, with a focus on augmented reality-based navigation, directions, and cultural site enhancement. The final topic is augmented reality (AR) in Marketing and Advertising, with an emphasis on product visualization, digital try-on, and AR-based marketing efforts.

### Chapter 4: Challenges and Future Directions

The difficulties and potential paths for AR are covered in this chapter. It talks about the hardware constraints and technical difficulties in putting AR into practice, like processor power, gadget form factors, & battery life. To enable simple and seamless communication with AR systems, customer experience and design of interfaces factors are studied. Concerns like privacy and ethics that are related to the usage of AR are also discussed, emphasizing the necessity for responsible and safe use of the technology. The final section of the chapter examines prospective avenues for future study in the area of augmented reality, including developments in software, hardware, and user interface design.

### Chapter 5: Conclusion

The primary conclusions and important takeaways from the report are summarized in the last chapter. It highlights AR's ability to improve entertainment, learning, medical care, manufacturing, and architecture, tourism, & marketing while summarizing its influence and potential across multiple sectors. To encourage readers to keep researching and expanding the area of AR, the conclusion also contains final thoughts and ideas for additional study. Following this extensive format, the paper offers an in-depth analysis of augmented reality, including its principles, technologies, applications, difficulties, and prospects for the future.

# AUGMENTED REALITY TECHNOLOGIES AND TECHNIQUES

A broad range of innovations and techniques are included in augmented reality, which enables the seamless incorporation of virtual aspects into the actual world. The report's review of the various augmented reality (AR) technologies and methods utilized to produce immersive and engaging experiences can be found in this section.

The report examines marker-based augmented reality, which projects digital media onto the real world by identifying particular marks or patterns. Markerless AR, on the contrary hand, eliminates the requirement for markers by using sensors and computer vision techniques to detect and record virtual objects in real-time. In projection-based AR, digital content is projected onto actual surfaces to produce immersive displays and augmented surroundings. Sensor-based AR precisely aligns virtual items with the actual world by utilizing cameras, depth gauges, and various other sensors to comprehend and analyze the user's environment. The research also discusses many methods that users might intuitively interact with virtual objects in AR systems, including recognition of gestures, spoken instruction, and haptic feedback.

This study gives readers a basic understanding of the instruments and techniques used to produce engaging AR experiences by giving a description of the aforementioned technologies and processes.



Figure 4: Types of AR Technology

## Marker Based AR

- Markers serve as reference points in marker-based AR, enabling the system to recognize and monitor users' orientation and position in real-time

## Markerless AR

- Tracking and registration techniques utilized, uses computer vision tools & sensors to identify and monitor the real-world environment

## Projection AR

- Uses projectors to superimpose virtual content onto real-world surfaces, producing lively and engaging augmented worlds

## Sensor Based AR

- Use of various detectors and camera technologies, aims to improve perception and relationship between virtual information and the real environment.

Table 1: Types of AR Technologies

### a. Marker-based AR: Principles and applications

An option that has gained popularity is marker-based augmented reality (AR), which uses markers or sequences to anchor simulated information onto the real world. The report digs further into the foundations and uses of marker-based AR in this part.

Markers serve as reference points in marker-based AR, enabling the system to recognize and monitor users' orientation and position in real-time. These indicators may be barcodes, printed patterns, or simply straightforward geometric shapes. The AR system can perfectly match virtual information with the marker's

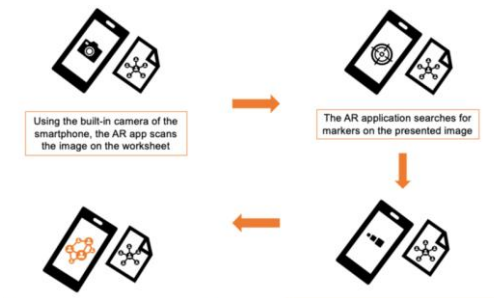


Figure 5: Marker-Based AR - Example

orientation & position by capturing the visual properties of the marker using a camera or sensor.

The robustness and accuracy of marker-based AR's tracking is one of its main benefits. Because markers have recognizable visual traits, it is possible to reliably identify them and track them. This means that even when the camera or the participant's view changes, the virtual content will stay in line with the real world.

Applications for marker-based AR can be found in many fields. Markers are frequently used in video games as goals for virtual people or objects, allowing for more engaging gameplay. In order to improve learning, markers can be incorporated into textbooks or other instructional materials. These markers can then trigger supplemental digital content, such as 3D models or movies. Markers can be used in marketing to produce interactive packaging for products or print adverts that, when detected by a mobile device, reveal more digital material.

Overall, marker-based AR offers a useful and approachable way to add virtual content to the actual environment, allowing engaging and interactive experiences.

## **b. Markerless AR: Tracking and registration methods**

A technique called markerless augmented reality lets virtual content to be superimposed on the actual world without the use of specific markers or patterns. Tracking and registration techniques utilized in markerless AR are examined in this portion of the report. Markerless augmented reality (AR) uses computer vision tools & sensors to identify and monitor the real-world environment, as opposed to marker-based augmented reality (AR), which depends on predetermined markers for tracking. The real-time object and surface identification and tracking capabilities of the AR system depend on an analysis of the scene's visual properties, such as corners, edges, and textures. Feature-based tracking is an approach that is frequently utilized in markerless AR. This method entails identifying and following distinguishing elements in the environment, such as vertices or edges, then comparing them with a database of features.

Simultaneous localization and mapping, or SLAM, is an alternative strategy which incorporates the steps of mapping the surroundings and tracking the user's position inside it. SLAM algorithms estimate the location and movement of the camera with respect to the map while concurrently creating a three-dimensional visualization of the surroundings using data from sensors, such as camera pictures or depth information.



*Figure 6: Markerless AR Technique - Example*

Applications for markerless AR are numerous. It enables immersive gameplay experiences in video games by enabling the placement and interaction of virtual items in the user's actual environment. Markerless AR can help in industrial environments with activities like object detection, geographical mapping, & augmented maintenance processes. Additionally, it has uses in e-commerce for virtual try-on experiences and navigation, among other things.

Markerless AR provides the freedom to modify the real environment without being constrained by predefined markers, giving up a variety of options for interactive and context-aware situations. It does this by leveraging algorithms for computer vision and sophisticated tracking techniques.

### **c. Projection-based AR: Projection mapping and interactive surfaces**

A technique to augmented reality (AR) known as projection-based AR uses projectors to superimpose virtual content onto real-world surfaces, producing lively and engaging augmented worlds. The following section of the report emphasizes mapping projections and interactive surfaces as two essential components of projection-based augmented reality.

Projectors are used in projection mapping, often referred to as spatial augmented reality (AR), to precisely map virtual material onto complex and irregular actual objects, such as interiors, sculptures, or buildings. Projection mapping gives the appearance that the virtual content has smoothly merged with the surrounding environment by accurately coordinating the projected image with the physical object. This method, which offers engrossing and immersive visual experiences, has been frequently used in creative installations, marketing, and entertainment events.



*Figure 7: Projection Based AR Technology - Example*

In projection-based augmented reality, interactive surfaces refer to the incorporation of interactive components onto real-world surfaces. Users can immediately engage with the displayed content by connecting projectors with detectors or touch-sensitive devices, turning conventional surfaces into displays that are interactive. For instance, a projection game interface on the floor enables interactive gaming, and a projected keyboards on a table enables people to type and communicate with virtual objects. AR becomes more interactive and participative when surfaces are interactive because they create new opportunities for user interaction and teamwork.

Numerous fields have found uses for projection-based augmented reality. It has been used in the entertainment sector to produce hypnotic visual effects for live concerts, stage shows, and theme parks. Projector-based augmented reality (AR) enables attention-grabbing and immersive brand experiences. Additionally, projected visualizations can help people grasp spatial concepts and designs in industries like building design, interior design, and education.

Projection-based augmented reality (AR) enables the conversion of real-world surfaces into dynamic, interactive canvases through the integration of projectors with cutting-edge mapping methods and interactive technology. This strategy creates fresh opportunities for artistic expression, interactive encounters, and useful applications across several industries.

#### **d. Sensor-based AR: Depth sensing and camera technologies**

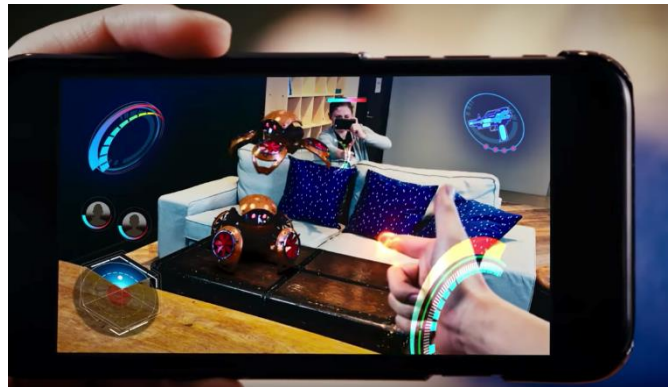
The use of various detectors and camera technologies in sensor-based augmented reality, or AR, aims to improve perception and relationship between virtual information & the real surrounding. Depth detection



and camera technologies are the two main topics of this section of the paper, which focuses on sensor-based AR.

In sensor-based AR, depth sensing is essential for determining the separations between items in the surrounding environment. By emitted infrared light and evaluating its reflection, depth sensors, like time-of-flight (ToF) lenses or structured illumination sensors, assess the depth measurements of the scene. With the aid of this depth information, AR systems may more precisely position and align virtual objects within the physical environment by comprehending the spatial arrangement of the surroundings. Occlusion is made possible via depth sensing, allowing virtual objects to appear realistically behind physical objects.

The core of sensor-based AR is camera technology, which records the physical environment and provides the visual input for superimposing virtual material. The live video feed is captured by high-resolution cameras built in smartphones, tablets, or specialized AR devices, which are subsequently analyzed by the AR system. In order to identify and monitor features, items, or markers in instantaneously, computer vision techniques analyze the camera input. This enables seamless incorporation of digital components into the real-time video stream.



*Figure 8: Depth Sensing Technology in AR - Example*

Applications for sensor-based augmented reality are numerous. It enables the creation of immersive gameplay experiences in video games by enabling realistic item interactions and contextual comprehension. Sensor-based augmented reality (AR) can offer real-time navigation and wayfinding assistance by superimposing directions or places of interest onto the camera view. In commercial environments, It makes it possible for technicians to see technical information or repair instructions superimposed on the equipment we are working on during augmented reality (AR)-assisted maintenance.

Sensor-based AR improves the precision and reality of virtual content merging with the real world by utilizing depth detection and camera technology. This method makes it possible to create more realistic experiences, exact object placements, and useful applications in a variety of industries, like gaming, navigation, and the manufacturing industry.



## e. Interaction techniques in AR systems

In Augmented Reality or AR frameworks, interaction strategies are crucial because they let users interact with and control virtual material while in a real-world setting. The numerous interaction methods utilized in AR systems are the main topic of this portion of the paper.

**Gesture Identification:** Gesture-based interaction enables users to operate augmented reality (AR) software by making hand or body gestures. Swiping, tapping, pinching, and waving are examples of actions that can be included in this. The AR system can detect and interpret these actions using sensing devices or wearable technology. Gesture detection allows for intuitive and organic interactions, making it easier to manipulate objects, navigate menus, or choose virtual objects.

**Voice Instructions:** Voice-based interaction enables users to give spoken commands to AR systems. AR apps are able to understand vocal commands by using speech detection and processing of natural language technology. Within the AR environment, voice commands are capable of being used to start programs, activate particular features, or give input to virtual assistants.

**Contact and Haptic Communication:** Touch-based interaction uses touchscreens, contact-sensitive surfaces, or handheld devices to allow users to interact directly with virtual content. Touching, tapping, or swiping on the screen allows users to interact with virtual items or open contextual menus. The sense of touch can be improved through haptic feedback, such as sensations or tactile sensations, giving consumers a more immersive and lifelike AR experience.

**Head and Eye Tracking:** In order to deliver context-aware interactions, head and eye monitoring technologies track the user's head motions and eye gaze. AR systems can modify the position and alignment of virtual content in accordance with the user's focus and viewpoint. This makes it possible for features like gaze-based choices, which let users interact with items or access information only by casting their eyes over them.

**Wearable Technology:** Hands-free interactivity and visual overlays are provided through AR systems built into wearable technology, such as smart spectacles or headsets. These gadgets may have eye-tracking

cameras, gesture recognition sensors, or voice control features that let users engage with virtual content without losing sight of their surroundings.

AR systems give users simple and engaging methods for interacting with virtual material by using several interaction approaches. These methods improve user interaction, allow for fluid object manipulation, and ultimately lead to a more realistic and engaging AR experience.



*Figure 9: Wearable AR - Example*

## AUGMENTED REALITY APPLICATIONS

Augmented Reality has many uses in different industries, changing how we interact with the outside world and opening up new opportunities for immersive experiences. Some of the most important AR applications are examined in this part of the paper.

### a. AR in Entertainment and Gaming

With its innovative and engaging experiences which combines virtual & real-world components, augmented reality has completely changed the entertainment & gaming industries. Immersive gameplay and the incorporation of virtual items and characters are two important uses of AR in this field.

## Immersive gaming experiences:

By superimposing virtual components on the user's actual environment, augmented reality (AR) elevates gaming to a whole new level. Players are able to communicate with virtual characters and items in their actual surroundings thanks to this. Gamers can participate in location-based games, where their actions and surroundings have an impact on the gameplay, by using AR-enabled gadgets like smartphones or specialized AR glasses. This produces an immersive and participatory game experience that goes beyond the limitations of conventional gaming.

## Virtual characters and objects in AR

Virtual people and things are made possible by augmented reality (AR), which allows for their seamless integration into the user's environment. Virtual characters who engage with users and react to their actions can give them a sense of presence.

Users can also install virtual furniture or ornamental items in their environment to see the way they fit and appear in real time. This creates new opportunities for social interactions, artistic expression, and virtual storytelling in the gaming industry.



*Figure 10: AR in Gaming – Virtual Characters - Example*

The use of AR in games and other forms of entertainment demonstrates how disruptive the technology may be. AR boosts immersion, interactivity, and involvement by seamlessly fusing virtual and practical elements, giving players access to entirely new levels of enjoyment.

## b. AR in Education and Training

Through the provision of immersive and interactive educational experiences, augmented reality has the potential to change education and training. Augmented reality improves comprehension, involvement, and retention of instructional materials by superimposing virtual content over the real world. Here are two significant uses of augmented reality in teaching and education:



*Figure 11: AR in Education - Example*

### AR-enhanced learning environments

By incorporating a layer of virtual content and interactive aspects, AR can completely alter conventional learning environments. Students can access supplementary content, such as models in three dimensions, animations, or extra clarifications layered onto textbooks or educational materials using AR-capable devices. By adding visual and interactive elements, complicated ideas become more tangible and approachable, improving comprehension and engagement. Virtual field trips can be created through AR to give students the opportunity to travel to far-off locations, historic sites, or observe phenomena in science without exiting the classroom.

### Simulations and training using AR

**Training and Simulations:** AR provides lifelike simulations for hands-on training in a variety of professions. By placing digital models of anatomical structures over the patient's body, for instance, medical students can utilize augmented reality to rehearse surgical operations. This gives pupils the chance to practice their skills in a safe setting. Similar to this, AR can be applied to the teaching of

technical skills, assembly procedures, and equipment operation. AR-based simulations improve learning outcomes and performance by giving detailed instructions and immediate feedback.

AR in training and education promotes engagement, critical thinking, and active learning. It gives students engaging, interactive learning opportunities that close the gap between academic theory and practical application. Using augmented reality, educators and trainers may design immersive environments for learning that improve comprehension, motivation, and retention.

### c. AR in Healthcare and Medicine

Surgery, therapy, and rehabilitation have all been transformed by the use of AR technology. Two important domains where AR is having an impact are listed below:



*Figure 12: AR in Medical Research - Example*

#### Surgical guidance and visualization

Real-time guidance and improved vision are provided to surgeons during difficult surgeries through augmented reality (AR). AR systems help surgeons visualize important features, such as blood arteries or cancers, without the need for intrusive examination by superimposing virtual data onto the patient's anatomy. This enhances surgical accuracy, precision, and safety. In order to facilitate better decision-making and enhance surgical outcomes, AR may additionally show real-time patient information right in the surgeon's point of view, like vital signs or results from imaging.

#### Rehabilitation and therapy

Rehabilitation and therapy: By giving patients engaging, interactive experiences, augmented reality is revolutionizing rehabilitation and therapy. Virtual worlds can be built by AR-based rehabilitation systems so that patients can undertake exercises and other tasks suited to their individual needs. The efficiency and participation of rehabilitation programs are increased by these systems' tracking of patient movements and

provision of real-time feedback. By combining virtual signals and difficulties into therapy sessions, AR can help with cognitive rehabilitation issues such as remembering or attention training.

Healthcare practitioners can optimize surgical processes, enhance patient outcomes, and provide cutting-edge rehabilitation and therapy techniques by utilizing AR technology. Surgery performed with more accuracy and efficiency thanks to augmented reality (AR) guidance and visualization. AR provides vivid and interactive experiences for therapy and rehabilitation that encourage patient involvement, motivation, and healing. The adoption of augmented reality (AR) in healthcare settings has an opportunity to transform clinical practices and enhance patient care.

#### d. AR in Manufacturing and Industrial Applications

With considerable advantages in assembly maintenance instructions, quality control, and inspection procedures, AR has become a potent tool in industrial and manufacturing settings. The two primary fields where AR is having a significant influence are listed below:

##### Assembly and maintenance instructions

Instructions for Assembly and Maintenance: By giving workers real-time direction and visual instructions, AR improves assembly and maintenance procedures. To assist workers with difficult assembly or repair jobs, augmented reality (AR) overlays digital data, such as detailed instructions, models in three dimensions, or annotations, onto real-world objects. As a result, there is a reduction in the demand for intensive training and an increase in efficiency. To further increase worker productivity and effectiveness, AR can also contain interactive aspects, such as highlighting particular components or dispensing audio instructions.

## Quality control and inspection

Quality Assurance and Inspection: By providing real-time viewing and information overlay on actual physical objects, augmented reality is transforming inspection and quality assurance procedures. The inspected products can have virtual information superimposed directly on them, such as dimensions, quality standards, or problem detection. As a result, inspectors can find anomalies quickly, compare them to norms, and decide accordingly. Aside from automating data collection and analysis, AR-based quality control solutions can help streamline the inspection procedure and lower error rates.



*Figure 13: AR in Manufacturing - Example*

Businesses may increase profitability, precision, and worker efficiency by utilizing augmented reality (AR) in industrial and manufacturing settings. AR-based assembling and maintenance instructions make difficult operations simpler, decrease mistakes, and improve employee training. Real-time visualization provided by AR in quality assurance and inspection enables prompt and precise fault or discrepancy identification.

### e. AR in Architecture and Design

With its inventive approaches to design representation, virtual developing prototypes, and immersive walkthrough experiences, augmented reality technology has significantly advanced the fields of architecture and design. Here are two notable uses of augmented reality in building and design:



## AR-assisted design and visualization

Architectural and design professionals can view their ideas and designs in actual environments with the support of augmented reality. AR-assisted design enables experts and customers to preview and evaluate designs in real-time by superimposing virtual architectural components, such as three-dimensional models, layouts, or renderings, onto actual environments. This improves perception of scale, spatial knowledge, and material choice. Additionally, interactive design revisions are made possible by AR, allowing users to dynamically alter design aspects and assess their effects, promoting more effective and cooperative design processes.



*Figure 14: AR in Architecture - Example*

## Virtual prototyping and walkthroughs

**Virtual Prototype and Walkthroughs:** AR makes it possible for stakeholders to view and engage with designs for architecture before construction by facilitating virtual prototyping and interactive walkthrough experiences. Through the use of AR, users may move around virtual worlds and enter areas as if they're really there. By giving architects and clients an accurate understanding of scale, dimensions, and spatial relationships, this facilitates decision-making. Users using AR-based walkthroughs may additionally experiment with lighting and material effects, evaluate the functioning and usability of places, and visualize design alternatives, all of which improve design outcomes.

Architects and designers are able to improve design visualization, better client communication, and speed up the architectural review process by incorporating AR into their practices. A more holistic and interactive approach is provided by AR-assisted design and visualization, allowing stakeholders to better comprehend. This empowers designers to produce better, more informed designs while reducing expensive adjustments made during the building stage.

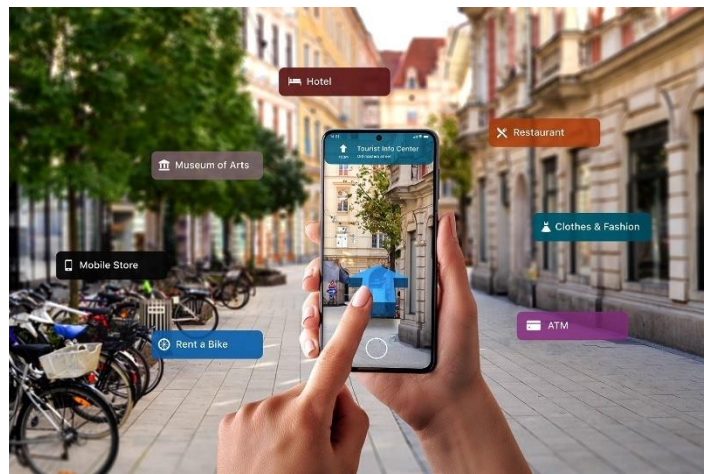


## f. AR in Tourism and Navigation

The tourist and navigation industries have seen significant developments thanks to AR, which now offers improved experiences via Augmented-based navigation and wayfinding as well as the augmentation of cultural and historical sites. Here are two significant uses of augmented reality in navigation and tourism:

### AR-based navigation and wayfinding

By superimposing digital data on the real world, AR technology transforms navigation by giving users contextual information and real-time direction. Directions, sites of interest, and other pertinent information can be displayed right in the user's field of vision with the use of AR-based navigation applications, making navigation easier. Users can easily travel through unfamiliar surroundings with AR by utilizing GPS, a compass, & visual recognition technology. This increases spatial awareness and lessens reliance on conventional maps or navigational aids.



*Figure 15: AR in Navigation and Tourism*

### Cultural and historical site augmentation

**Augmenting Cultural and Historical Sites:** By adding virtual content to the real world, augmented reality (AR) improves the tourist experiences at cultural & historical sites. Applications for augmented reality (AR) can overlay interactive elements, 3D reconstructions, or historical data onto the actual location, giving visitors a greater knowledge and more engaging experience. Users can access multimedia content, explore virtual layers of knowledge, and see past events brought to life via AR-enhanced storytelling. This enhances the site visit's cultural and educational value, making it more interesting, instructive, and memorable.

The use of augmented reality in navigation & tourism creates new opportunities for exploration. Travel and wayfinding are made simpler by AR-based navigation, which makes it simpler for visitors to find their way around foreign places. Augmenting cultural and historical sites with AR gives visitors a richer, more engaging experience that helps them better appreciate the value and history of the location. The tourist sector can provide more immersive and interesting experiences by utilizing AR, which will increase visitor happiness and encourage cultural appreciation.

### g. AR in Marketing and Advertising

With its innovative methods of connecting with users via product representation, virtual fitting experiences, & AR-based promotional efforts, augmented reality has changed the game in the fields of marketing and advertising. Here are two prominent uses of augmented reality for marketing and advertising:

#### Product visualization and virtual try-on

AR enables customers to view and try on things virtually before making a purchase. Clients may utilize their smartphones or AR-capable gadgets to overlay virtual images of things like furniture, apparel, or cosmetics onto their actual environment using AR product visualization. They can then evaluate the product's appearance, fit, and functionality, resulting in a better purchasing decision. Customers can also virtually try on apparel, accessories, or cosmetics via AR virtual try-on experiences, improving the shopping experience and reducing returns.

#### AR-based promotional campaigns

AR provides immersive, engaging experiences which can be used in advertising efforts. augmented reality (AR) experiences which engage customers and increase brand awareness can be made by brands.



Figure 16: AR in Advertising - Example

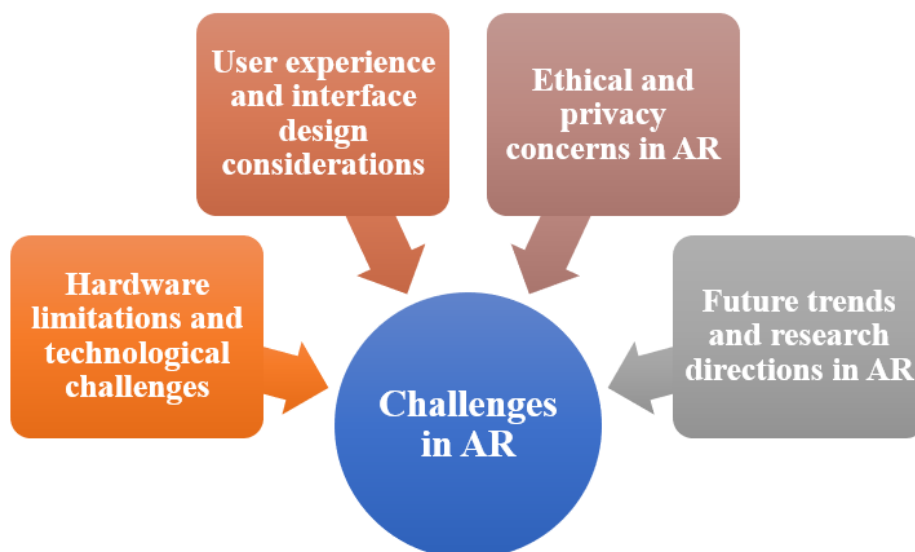
For instance, AR can be used to add virtual components to print advertisements, billboards, or product packaging, such as films with animations, individuals, or interactive games. This not only grabs customers' attention, but it also promotes engagement and social sharing. AR-based marketing efforts can raise awareness, boost consumer interaction, and produce enduring brand impressions.

Businesses may give customers a more individualized, interactive, and interesting experience thanks to the use of augmented reality, in marketing and advertising. AR-enhanced visualizations of products and virtual fitting experiences aid online shoppers in making knowledgeable purchasing selections. AR-based marketing initiatives draw consumers' attention, encourage brand involvement, and produce enduring brand impressions. By embracing AR, businesses can take advantage of the immersive technology's ability to connect with customers in novel and significant ways, ultimately increasing brand loyalty and customer happiness.

## CHALLENGES AND FUTURE DIRECTIONS



Although Augmented Reality or AR has advanced significantly across many fields, it still faces some obstacles and has room for improvement. It is essential for the continued advancement and widespread use of AR technology to comprehend these issues and consider potential solutions. Here are some major issues and potential directions for the field of augmented reality:



*Figure 17: Challenges in AR*

#### a. Hardware limitations and technological challenges

For AR experiences, smartphones, smart glasses, or headgear are frequently used. The processing speed, longevity of the battery, angle of view, and dimensions of the available technology, however, might be constrained. For widespread acceptance and seamless AR experiences, it will be crucial to get over these constraints and create more potent, manageable, and user-friendly AR devices.



*Figure 18: AR Hardware Components*

#### b. User experience and interface design considerations

For the best user experience, interfaces for augmented reality applications must be simple and straightforward. The user's environment should be smoothly integrated into immersive, responsive, and AR interfaces. Future work will focus on improving voice commands, haptic feedback, and gesture-based controls to improve user interactions and reduce cognitive burden.

#### c. Ethical and privacy concerns in AR

Concerns over ethics and privacy are raised as AR technology spreads. AR may invade one's privacy, cause digital distractions, or encourage the dissemination of false information. Building confidence and ensuring the ethical use of AR technology will require overcoming these issues via guidelines on ethics, safeguarding policies, and responsible usage policies.

#### d. Future trends and research directions in AR

Combining technological know-how with artistic abilities is necessary to create high-quality AR content. Realistic models in three dimensions, animations, and interactive components that

flawlessly mesh with the physical environment must be designed and developed by content producers.

In Education industry using AR, in order to improve students' reasoning and practical use of related programming languages, the augmented reality (AR) system merged artificial intelligence with deep learning technology to assess its significance through the compilation and functioning process. It also recommended different educational work for students who were perplexed or thought about the learning process to be non-understandable.

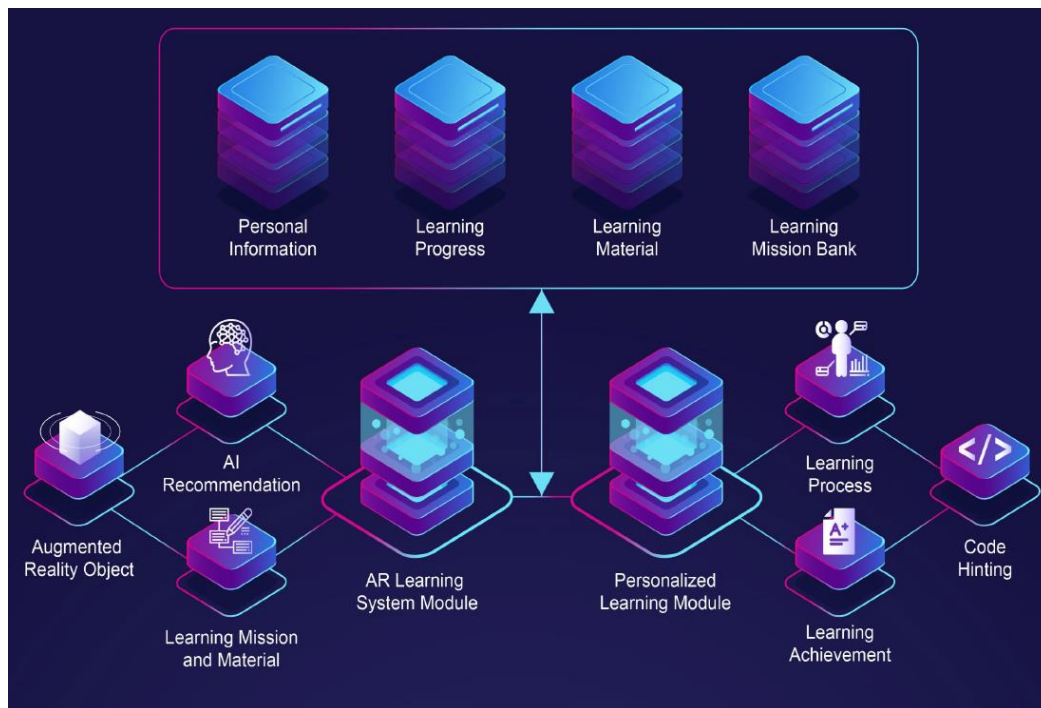


Figure 19: AI and Deep learning in AR - For Education

Future approaches should focus on enhancing content production tools, streamlining workflows, and promoting interaction between designers, developers, and content producers.

# CONCLUSION

An overview of augmented reality (AR), its foundational ideas, technological advances, and applications in many fields has been offered in this study. The main conclusions and ideas are outlined below:

## a. Recap of key findings and insights from the report

AR is a cutting-edge technology that enhances our perception & engagement with the environment by fusing virtual and real-world aspects. It offers enriched contextual knowledge and interactive components while smoothly integrating digital data into our real-time experience. The primary methodologies utilized in AR systems include marker-based, markerless, projection-based, and sensor-based AR, each having unique guiding principles and uses.

A wide range of industries, including manufacturing and industrial applications, learning and instruction, healthcare and medical, entertainment and gaming, architecture and design, travel and navigation, & marketing and advertising, use augmented reality.

By facilitating immersive experiences, improving learning and training processes, enhancing surgical recommendations and recovery, enhancing manufacturing and maintenance methods, facilitating architectural design as well as representation, transforming tourism experiences, along with revolutionizing strategies for advertising and marketing, augmented reality (AR) has the potential to completely transform these fields.

## b. Summary of the impact and potential of AR in various domains

AR has the power to increase output, increase user engagement, and produce unforgettable experiences. It has the ability to alter the way we communicate with data, things, and environments. Industry-revolutionizing AR can enhance customer experiences, spur innovation, and change business models. In a variety of fields, augmented reality (AR) is making a big impact and a lot of potential.



The boundaries between the virtual and real worlds are blurred by AR's immersive experiences and games that are interactive in the gaming and entertainment sectors. By delivering interactive and compelling experiences through data visualizations, simulations, and digital models, augmented reality (AR) can change learning in education and training. In the medical field, augmented reality (AR) enables surgical assistance and visualization, boosting precision and assisting in therapy and rehabilitation. AR optimizes assembly and maintenance procedures as well as quality control and inspection in manufacturing and industrial settings. By enabling immersive experiences & virtual prototyping, augmented reality (AR) alters visualization and presentation techniques in architecture and design. In tourism, augmented reality (AR) improves navigation and offers site augmentation for cultural and historical sites, bringing landmarks to life. AR improves customer engagement and brand recognition by enabling visualization of products and virtual try-on experiences.

Thus, augmented reality has the ability to transform a variety of fields and sectors by providing fresh ways to engage with data, objects, and settings, boosting engagement, productivity, and innovation.

### c. Closing remarks and suggestions for further research

It is crucial to understand that augmented reality (AR) is an emerging field that is always being researched and developed. To solve issues like technology constraints, user interface design, moral considerations, and content development, more research is required. Additionally, investigating fresh uses and fusing augmented reality with other cutting-edge technologies will expand the potential applications of augmented reality.

Even though Augmented Reality, also referred to as AR, has come a long way, there are still a number of topics that demand more study and investigation. Here are some ideas for the next studies in the area of AR:

- Enhanced Tracking and Registration systems: Investigating novel methodologies for continuous monitoring and registration of digital objects into the actual world as well as improving the precision and durability of markerless tracking systems.



- **Interaction with Users and Interface Design:** To enhance user experience and usability, we are researching intuitive & seamless interaction approaches in AR systems, including gesture detection, speaking commands, and haptic feedback.
- In order to give greater immersion and realistic augmented reality experiences with larger fields of view, researchers are exploring new technologies for display like holographic displays, light and comfy headgear, and better optics.
- Collaborative augmented reality (AR) systems that let many consumers to interact with and distribute virtual items in real-time are being researched in order to improve social interactions and teamwork in AR-based applications.
- **Context-aware & Adaptive AR Systems:** Context-aware augmented reality (AR) systems that can autonomously modify and personalize information based on a user's surroundings, preferences, and task needs are being developed in order to deliver more relevant and specialized AR experiences.
- **Ethical & Privacy Considerations:** Researching the privacy issues and ethical ramifications of augmented reality, including security of data, user privacy, and possible psychological and societal effects, in order to ensure competent and ethical application of augmented reality technologies.
- **AR in Particular Domains:** concentrating on addressing specific difficulties and doing domain-specific research to examine the potential of AR in industries such as architecture, schooling, medical care, manufacturing, or entertainment.
- **AI and AR integration:** Investigating the combination of Artificial Intelligence (AI) tools, such as computer vision and machine learning, with augmented reality (AR) systems to improve object recognition, scene comprehension, and intelligent interaction abilities.
- Interoperability across various AR platforms and devices is made possible by developing standards and rules for the production of AR content, formats for data, and interoperability across them.

- User research and human factors research are conducted to better understand how users behave, cognitive elements, and the effects of augmented reality (AR) on people's perceptions, attention, and performance. This information informs the planning and optimization of AR devices.

Overall, augmented reality has demonstrated enormous potential and is ready to transform many different sectors and domains. By adopting this technology, we may unleash its transformational potential and design a society where the real and virtual coexist together, enhancing our lives as well as experiences in previously unimaginable ways.

## ACRONYMS

1. AR - Augmented Reality
2. VR - Virtual Reality
3. AI - Artificial Intelligence
4. IoT - Internet of Things-refers to the network of interconnected physical devices embedded with sensors, software, and connectivity, enabling them to exchange data & interact with each other.
5. 3D - Three-Dimensional: 3D refers to the representation of objects or spaces in 3D, providing depth and volume.
6. UI - User Interface
7. UX - User Experience
8. AI - Augmented Interaction: AI, in this context is referring to the ability of AR systems to enhance & augment human-computer interaction.
9. ToF – Time of Flight
10. 5G - Fifth Generation: of wireless communication technology, offering faster data transfer speeds, lower latency, and increased capacity.
11. OS - Operating System
12. IEEE – Institute of Electrical and Electronics Engineers
13. SLAM - Simultaneous localization and mapping
14. GPS – Global Positioning System

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