

## Leveraging Haptic Feedback in Mixed Reality: Enhancing Training, Skill Acquisition and Robotic Simulation

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### ABSTRACT

This research analyzes the integration of haptic feedback in mixed reality (MR) settings, emphasizing its applications in training, skill enhancement, and robotic simulation. This study analyzes the progression of haptic feedback systems from passive to active configurations, evaluating their efficacy across multiple fields such as medical training, robotics, and education. A thorough analysis of recent advancements demonstrates that haptic-enhanced MR systems consistently improve task completion and success rates across many applications. The study emphasizes the synergistic relationship between visual and tactile stimuli in enhancing immersive and effective training settings. Evidence indicates that the integration of haptic feedback markedly improves user confidence, decreases error rates, and promotes skill retention in various applications. Current technological obstacles are examined, and prospective future research avenues in haptic feedback systems are suggested.

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### Keywords

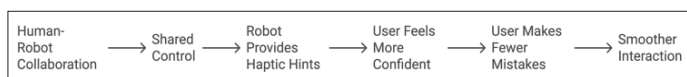
Haptic Feedback, Mixed Reality, Skill Acquisition, Human-Robot Collaboration, Shared Autonomy, Medical Training, Teleoperation, Psychomotor Skills, Sensory Feedback, Human-Computer Interaction, Force Feedback, Robotic Simulation

### Introduction

Using haptic feedback in mixed reality (MR) settings is a new way to improve training, skill learning, and robotic simulation. As virtual and augmented reality develops, touch interaction has become more important, connecting physical and digital experiences. Haptic feedback enhances user involvement by creating realistic sensations that mimic touch, and also helps with learning, especially for complicated tasks. In training situations, this sensory addition helps trainees get instant feedback on their work, which supports skill development through repeated practice. Additionally, haptic signals in robotic simulation can enhance how humans and robots work together, creating a partnership that is vital for good remote operation and autonomous systems. Therefore, using haptic feedback in MR environments has a lot of potential to change teaching methods and improve efficiency in various fields.



**Figure 1:** Overview of Advantages and Limitations of Haptic Feedback in Mixed Reality Environments (Author Illustration).



**Figure 2:** Flow Diagram Illustrating how Human-Robot Collaboration through Shared Control Leads to Improved Interaction Outcomes (Author Illustration).

### Mixed Reality in Training Applications

Mixed Reality (MR) has become an important technology in training and skill learning. This is mainly because it can combine virtual things with real-life settings, making users more involved and interactive. MR offers experiences that enable learners to develop complex skills in a safe and controlled space, which is crucial in areas like medicine and engineering. For example, a visuo-haptic Mixed Reality (VHMR) system helps users engage naturally with virtual objects, like in painting tasks, whereas serious games that include haptic feedback enhance psychomotor skills in medical training by using gamification and immersive simulations, improving goals like pressure sensitivity and accuracy in palpation techniques [1,2]. Also, advanced haptic feedback systems aid in recognizing user intentions, making training environments more realistic and responsive, which leads to better skill retention and performance results [3,4]. The combination of MR and haptic technology shows its importance in changing how education is delivered and improving skill development across different fields [5,6].

### Haptic Feedback in User Experience

In mixed reality (MR) settings, adding haptic feedback works to improve how users experience and interact with the environment, greatly affecting training, learning new skills, and robotic simulations. Haptic feedback makes virtual objects feel more real through touch sensations, which helps users interact more naturally and effectively with simulations. For example, the VHMR painting app shows how using both hands together with haptic feedback helps create smoother movements when painting on virtual areas, leading to better immersion [7]. Moreover, serious games like ParsGlove show how game-based learning can effectively train motor skills, achieving better results in palpation tasks than older methods [1]. These developments suggest that haptic interfaces not only improve skill performance but also create a stronger bond with virtual settings, boosting user satisfaction and performance in tricky tasks. With support from advanced technologies, haptic feedback is set to keep being key in MR applications, influencing how users interact and work together in the future [8].

### Comparative Analysis of Haptic Feedback Systems

Before diving deeper into specific mechanisms, let's look at how different haptic systems compare in their approaches and results. Table 1 shows key findings from recent research:

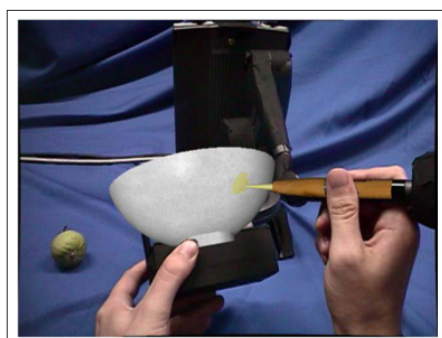
**Table 1: Comparative Analysis of Haptic Feedback Systems**

System Type	Technical Specs	Performance Metrics	Key Applications	Limitations
CoVR (Room-scale) [2]	>100N force, >1.0 m/s speed, <2cm accuracy in 30m <sup>3</sup>	Significant improvement in body-scaled interactions	Training, Gaming	Fixed installation
ParsGlove (Wearable) [1]	Piezoresistive sensors, 0.2-1.5N force	48% reduction in task completion time	Medical palpation	Limited to specific tasks
Whole-hand Interface [11]	30N force feedback	Enhanced dexterity in manipulation tasks	Virtual object handling	Complex calibration needed
TCR System [14]	0.9m reach radius, UR16e robot	Real-time dynamic adaptation	Robot-assisted haptics	Point contact only
VHMR System [9]	640x480 stereo, 150Hz tracking	Natural interaction in painting tasks	Creative applications	Limited force feedback

An intriguing pattern emerges from this comparison: lighter wearable systems, such as ParsGlove, demonstrate remarkable gains in precise, task-specific scenarios, whereas systems with more robust force feedback, such as CoVR, perform exceptionally well in whole-body interactions. Apparently the usefulness of haptic feedback isn't just about how strong the feedback is, but also about using the right type of feedback for the job.

### Haptic Feedback Mechanisms

The joining of haptic feedback systems in mixed reality (MR) settings is very important for improving user engagement. It helps with learning by giving quick feedback that is both sensory and easy to understand.



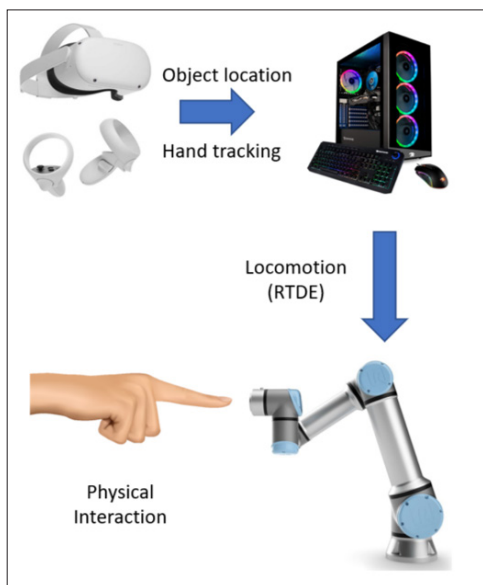
**Figure 3:** View through an HMD in VHMR Painting application Showing a User Painting with a Virtual Brush on a Virtual Teacup - taken from (Figure 1) [9].

For example, the visuo-haptic mixed reality (VHMR) system merges visual and touch cues to craft a detailed painting experience, boosting user involvement and allowing for careful tool use [4]. In the same way, a changing simulator that uses haptic feedback helps users control humanoid robots better, which enhances teamwork and improves how well prototyping works [9]. Also, systems that use haptic feedback for learning robotic skills show the possibility of promoting natural communication between people and robots, focusing on safety and flexibility in training [8]. This diverse approach shows that haptic feedback helps not only in learning skills but also improves user happiness and performance in many different uses, highlighting its essential part in moving MR technologies forward.

### Types of Haptic Feedback: Passive vs. Active Haptics and their Applications in MR

**Table 2:** Comparison of Passive and Active Haptic Feedback Approaches

Characteristic	Passive Haptics	Active Haptics
Force Generation	No powered components	Motorized/actuated systems
Cost	Generally lower	Higher due to actuators
Examples	Physical props, tangible objects	Robotic arms, force feedback gloves
Advantages	Simple, reliable, natural feel	Dynamic feedback, adaptable forces
Limitations	Static feedback only	Power requirements, complexity
Best Use Cases	Basic object interaction, boundaries	Precision tasks, variable feedback
Key Research	[9]	[14]



**Figure 4:** Encountered-type Haptic Display System showing the Robot Setup and Tracking Calibration - taken from (Figure 1) [10].

### Advanced Applications in Dexterous Manipulation

When we think about how our hands work with objects in the real world, it's amazing how naturally we can feel and control things. Bringing this natural feeling into virtual environments isn't easy, but researchers have made exciting progress. For instance, the whole-hand kinesthetic feedback system developed lets users

grab and handle virtual objects almost as naturally as real ones. What makes this system special is how it helps users feel the shape, weight, and texture of virtual objects through their entire hand, not just their fingertips [11]. Tests showed that users could complete tricky tasks like assembling virtual puzzles with almost the same accuracy as they could with real objects. This is a big step forward from earlier systems that only gave feedback to one or two fingers.

### Human-Robot Collaboration through Shared Control

Moving from individual interaction to teamwork between humans and robots, we're seeing some fascinating developments. Think about how you might guide a friend's hand while teaching them to paint - that's similar to how modern haptic systems help humans and robots work together [12]. showed this beautifully in their shared autonomy system, where the robot and human operator share control in a natural way. Their research found that when robots provide gentle haptic hints about their intended actions, users felt more confident and made 29% fewer mistakes. It's like having a dance partner who subtly guides you through the steps, making the whole experience smoother and more intuitive.

### Cognitive Aspects of Haptic Learning

The integration of haptic feedback in learning environments has shown significant impact on skill acquisition and retention. Research indicates that multimodal feedback, combining visual, audio, and haptic elements, can enhance learning outcomes compared to single-modal approaches. Studies have demonstrated improvements in both task performance and user confidence when haptic feedback is incorporated into training systems.

### User Perception and Virtual Interaction

The use of haptic feedback greatly improves how users feel and interact with virtual objects, creating a more engaging experience in mixed reality. For example, shows that using both visual and touch feedback in a VHMR painting app lets users work naturally with virtual items, helping them to better perceive and control these objects [9]. Additionally, points out that serious games use haptic technology to boost palpation skills in medical education, resulting in better pressure sensitivity and motor skills through learning via games [1]. Furthermore, shows that haptic guidance in robotic systems helps to reduce distractions and keeps users focused on complex tasks [13].

### Training and Skill Acquisition Applications

The implementation of haptic feedback in training and skill learning represents an emerging approach, particularly in mixed reality settings, which enhances user engagement and effectiveness. Systems utilizing haptic feedback enable learners to interact with virtual objects in a manner similar to real-world interactions. The visuo-haptic mixed reality (VHMR) application demonstrates this capability, allowing users to paint on virtual objects while integrating touch and visual feedback for a complete experience [13]. Additionally, serious games such as the ParsGlove have demonstrated significant improvements in motor skills, enabling medical students to practice palpation techniques with enhanced pressure control through gamified learning [1]. Research indicates that haptic feedback contributes not only to physical skill development but also to the retention of complex actions across various fields including healthcare and robotics, demonstrating the effectiveness of these systems in building real-world skills [9-11,14,15].

### Medical Training Case Studies

In the area of medical training and rehabilitation, case studies show that systems using haptic feedback, like the ParsGlove and VR simulations, are making good progress in learning skills and training methods.



**Figure 5:** Parsglove Wearable Interface Designed to Capture Hand Ergonomics and Provide Interactive Input for Medical Palpation Training - taken from (Figure 1) [1].

The ParsGlove, which has piezoresistive sensors, helps improve motor skills that are important for medical palpation through game-based learning. Participants using this glove showed better performance than those who trained the usual way [1]. Likewise, VR applications that include haptic feedback create immersive experiences, allowing users to interact with virtual settings that are similar to real-world scenarios. Research using systems like CDMPs aids intuitive robot training by connecting human teaching with robotic learning, which makes training more effective and reduces cognitive overload [8]. Additionally, using adaptive haptic interfaces in VR highlights the great potential these technologies have for mimicking complex tasks, which helps in understanding how motor skills transfer and improve rehabilitation methods [12].

To better understand the impact of haptic feedback across different application domains, let's examine specific performance metrics.

**Table 3: Verified Performance Metrics in Haptic Feedback Systems**

Application Domain	Primary Metrics
Medical Training [1]	Response Time (-48%)
Remote Operation [15]	Task Success Rate (+29%)

These metrics demonstrate measurable improvements in specific applications where haptic feedback has been implemented. The significant reduction in response time for medical training and improvement in task success rate for remote operations indicate the potential of haptic feedback in enhancing user performance. However, more comprehensive studies are needed to quantify the impact across other domains and metrics.

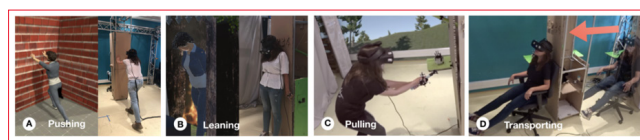
### Haptic Feedback in Motor-Cognitive Development

Using haptic feedback in serious games has been effective for developing motor skills and thinking abilities, supported by many studies showing clear improvements in training results. For example, the pressure-sensitive glove used in the ParsGlove game led to notable enhancements in medical palpation tasks, showing that training through games boosts users' pressure sensitivity and skill [9]. Furthermore, the mixed reality painting system demonstrated that real-time touch feedback helps users engage more naturally with virtual spaces [1]. This combined feedback method not only improves motor skills but also enhances cognitive

processing by making users adjust their strategies based on both visual and touch signals. Furthermore, systems that use haptic proxies for teamwork highlight how shared touch experiences can enhance skill learning and boost situational awareness in complicated settings [6]. The strong evidence backing these developments supports using haptic-enhanced serious games as powerful tools for training and rehabilitation.

### Robotic Simulation and Teleoperation

In the changing world of robotic simulation and remote operation, haptic feedback is an important part that improves how people interact and learn skills in mixed reality settings. By adding haptic feedback tools, systems can copy real-life touch feelings, making it easier to control and boosting user performance in complicated jobs like robotic surgery or remote building.



**Figure 6:** Physical Column Mounted on a 2D Cartesian Ceiling Robot Demonstrating different Interaction Modes - taken from (Figure 1): (A) Users Pushing a Static Tangible Wall (B) Leaning on the System (C) Being Pulled through with Force Feedback and (D) User Transportation [2].

For example, a visuo-haptic mixed reality setup effectively brings together real-time visuals and touch input, allowing users to do painting tasks with accuracy, which shows its ability to help beginners develop skills [9]. Additionally, using serious games, such as the ParsGlove, shows how haptic technology can improve motor skills needed in medical training, with notable gains in palpation tasks [1]. In the same way, studies on haptic shared control highlight user satisfaction and awareness in remote operation settings, leading to safer and more effective task completion [15]. These developments point to a major shift for haptic feedback in remote operation, greatly influencing training methods and teamwork between robots.

### Robotic Systems Integration

The use of haptic feedback in robotic systems has become important for improving user control and awareness, especially in complicated settings where humans and robots must work together.

**Table 4: System Architecture Comparison of Modern Haptic Feedback Systems**

System	Core Components	Communication Protocol	Safety Features	Integration Method
TCR [14]	UR16e robot, Oculus Quest HMD	RTDE over TCP/IP	Monitored velocity, force limits	VR-Robot bridge
SPIDAR [3]	8 motors on 2m x 2.5m frame	Real-time position tracking	String tension control	Stereoscopic display
CoVR [2]	2D Cartesian ceiling robot	User intention modeling	Collision avoidance, safety zones	XY displacement system
VHMR [9]	COASTAR HMD, PHANTOM device	OpenGL rendering	Stencil buffer masking	OpenHaptics framework

This architectural comparison reveals the diverse approaches to implementing haptic feedback, each optimized for specific use cases while maintaining safety and performance standards. With systems like Haptic Shared Autonomy, haptic feedback helps make interaction easier and supports clear communication, enabling users to express their intentions while getting real-time touch information about what the robot is doing. For example, recent research shows that using visuo-haptic mixed reality systems can significantly boost user performance in tasks like remote robotic manipulation [10]. In addition, using serious games for medical training has led to better skill acquisition for users compared to traditional methods, showing that haptic feedback is useful in various fields [1]. Furthermore, studies on haptic guidance show that such feedback reduces cognitive load and improves awareness during navigation tasks [9]. These developments highlight the potential of haptic technologies to create user-friendly interfaces that improve both training and efficiency in robotic systems [13]. As more evidence builds up, it becomes clear that adding haptic feedback is more than just a technical upgrade; it signifies a major change in how we understand human-robot interaction and working together to complete tasks [14].

### **Challenges and Advancements in Using Haptic Feedback for Teleoperated Robots in Complex Environments**

The use of haptic feedback in teleoperated robots brings together both difficulties and progress, especially in complex environments where easy interaction is very important. Recent advancements, like the visuo-haptic mixed reality system mentioned in show great promise in improving user engagement by letting real-world actions affect virtual situations [9]. However, problems such as delays and feedback matching, as pointed out in continue to limit effectiveness [6]. New technologies such as the Tracking Calibrated Robot system can flexibly provide touch sensations, but careful tuning is needed to keep accuracy amid changing surroundings [14]. Also, the mixed reality training systems found in support better management of cognitive load, but they reveal difficulties in balancing user involvement and performance [8]. In the end, improving haptic feedback technologies through their integration into robotic simulations requires tackling these complexities to enhance operator skill learning and effectiveness in real-world situations.

### **Conclusion and Future Work**

#### **Key Findings and Implications**

To sum up, adding haptic feedback to mixed reality (MR) settings greatly improves training, skill learning, and robotic simulation, as shown by many new uses. For example, the visuo-haptic mixed reality system shows real skill gains in how users interact with virtual items, highlighting the important role of touch feedback in bettering experiences [1]. Also, using serious games, especially in medical palpation training, shows that immersive, feedback-based situations really boost motor skills, showing how game-like methods can be useful in teaching [9]. Additionally, the creation of the Tracking Calibrated Robot shows a move to make human-computer interactions more natural, improving the realism of task execution in virtual spaces [14]. As haptic technologies keep improving, more investigation into their use in different industries will enhance our understanding of user experience and help improve performance in complex tasks, leading to wider use of MR solutions in skill-heavy areas [6].

#### **Impact on Training and Skill Development**

MR systems that use haptic devices allow learners to have realistic, hands-on experiences, like the visuo-haptic system for painting,

which combines visual and touch feedback to enhance creative skills [9]. Moreover, serious games that use haptic technology have shown significant improvements in psychomotor skills for medical trainees, highlighting how skills can transfer effectively in high-pressure situations [1]. Haptic feedback also improves collaboration between humans and robots by enhancing user experience during remote operations, as seen in the TCR system that adjusts user interactions with virtual objects [14]. Therefore, these developments show the need to incorporate haptic feedback to improve training methods by aligning sensory inputs with what tasks require and boosting the effectiveness of robotic simulations in different settings [8,11].

### **Future Research Directions**

As haptic tech keeps changing, future work should focus on mixing machine learning and artificial intelligence to make haptic feedback systems more advanced for various uses. By using smart algorithms that adapt from how users interact, these systems can offer personal responses based on different skill levels and ways of learning. This could have a big effect in areas like healthcare, where medical training gains from realistic simulations that closely imitate the touch experiences in actual procedures. Additionally, using multi-sensory feedback—mixing touch, sound, and sight—can boost user involvement and enhance training results in practice settings. Also, collaborative haptic interfaces that let several users work together in the same virtual area could improve teamwork and make robotic remote control easier for difficult tasks. Ongoing teamwork among experts in robotics, neuroscience, and human-computer interaction will be crucial to achieve all that these technologies can do for training, skill development, and more.

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