

Exposing Blind Spots in XR Accessibility With Simulated Vision Impairments

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1 MOTIVATION

One in four people in the United States of America has some form of disability [8]. Yet this large portion of the population is unable to use extended reality (XR) head-mounted displays (HMDs) due to their inaccessible designs. Both head-worn augmented reality (AR) displays like the Microsoft HoloLens and virtual reality (VR) displays like the Oculus Rift fall under the umbrella of XR HMD products. Accessibility groups, like XR Access [14], have recently emerged to disseminate best known practices for developing accessible applications in extended reality. However, best practices for accessibility in immersive XR HMDs are still a nascent area of research.

Because XR HMDs are not yet a mature or widespread technology—developers, designers, and researchers alike have the rare opportunity to make immersive XR accessible from the outset [7]. A barrier to this goal is that most software developers and designers do not know how to make their applications accessible, and they often do not have access to user testers with disabilities to evaluate their products.

My dissertation research will create and evaluate the efficacy of a testbed that will give developers the ability to design better XR experiences for those with vision disabilities, whom account for 4.6% of the U.S. population [8]. I will create an eye-tracked, data-driven visual impairment simulation with flexible input parameters that allows people to experience visual impairments firsthand. Furthermore, I will conduct a robust evaluation of the system with low vision patients, those with simulated low vision, and those with normal vision.

1.1 Visual Impairments

The visual impairments expressed by low vision, in which vision is impaired to the degree that it cannot be corrected with glasses alone, are often the result of a *scotoma*—or a blind spot in one’s visual field. Scotomas vary in size, intensity, number, and placement within a person’s visual field. As such, low vision conditions are heterogeneous and vary widely between conditions and even between patients with the same condition. Two of the most common types of visual field loss that can affect people’s vision are: central and peripheral field loss. An example of simulated peripheral vision loss, which may be caused by glaucoma or retinal detachment, can be seen in Figure 1. Low vision conditions interfere with one’s ability to interpret visual information, making everyday tasks like reading, driving, or walking down the street challenging. Tasks like driving may even become dangerous.

1.2 Disability Simulations

If developers are to design accessible products that people with disabilities can use, then they must understand how affected populations interact with their surroundings. Disability simulations allow

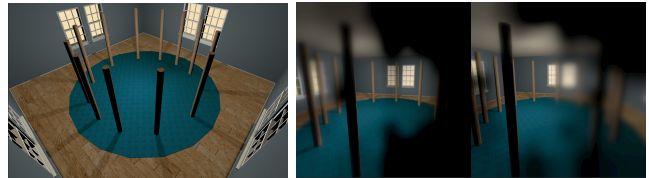


Figure 1: An overhead view of a virtual environment (left) and the environment as viewed stereoscopically by someone with simulated peripheral field loss (right)

individuals to experience what it is like to have a specific impairment. These simulations are not only informative for product and application design, but they can also help caregivers or medical professionals better understand the needs of those whom they care for.

Extended reality (XR) provides a particularly unique opportunity for disability simulation. Within XR people may experience firsthand how specific disabilities, like visual impairments, affect the strategies that one employs to interact with their surroundings. Some immersive low vision simulations already exist. However, most are based on simplified symptoms of eye diseases [12] and are unable to produce the irregular scotomas that individuals experience in reality. Even fewer of these simulations have been implemented with eye tracking [6, 13]. Yet the biggest obstacle for the adoption of immersive low vision simulations for design may be that there are no rigorous evaluations of their efficacy. In short, there are no complete, empirical studies that evaluate the ability of low vision simulations to replicate the impairments of those with low vision. This dearth of evaluations is likely due in part to the low latency demands of eye-trackers for effectively simulating low vision and to the difficulty of recruiting a sufficient number of people with visual impairments for system evaluations. As a result, most researchers have either only been able to conduct preliminary analyses [12, 6] or they have focused on applying their simulation to applications [13].

2 PROJECT FRAMEWORK

2.1 Research Objectives

Accessible design allows a large portion of the population, which would otherwise be neglected, to have access to products. However, not all product development teams have access to disabled test users for feedback. Reliable disability simulations may allow these teams to better design their products for accessibility, especially in the absence of real user testers.

My dissertation research presents an immersive, low vision simulation testbed to evaluate how design decisions affect user experience for those with visual deficits. This testbed uses a data-driven approach to empower XR developers to design for low vision individuals—even when they do not have access to real low vision test users. I will validate the testbed by analyzing behavioral responses across real low vision patients, simulated low vision patients, and normally-sighted individuals.

I will also demonstrate how to employ this testbed to evaluate

accessibility by conducting user studies with both normally-sighted and simulated low vision participants to assess how specific rendering techniques affect spatial perception in XR. By the end of my dissertation research, I will have generated developer guidelines that improve spatial perception for both normally-sighted and low vision users in XR. And I will create a testbed for future investigations into how design decisions affect those with low vision in XR.

2.2 Vision Disability Simulation

My immersive simulation will map data from visual field tests, such as Humphrey or Goldmann, to calibrated blur and opacity maps in a stereoscopic head-mounted display (HMD). By employing HMDs equipped with eye trackers, I may map foveal deficits correctly to the foveal regions of a user's vision. The field of view of these devices is limited, so I am unable to model far peripheral field deficits. User-specified scotomas and blur fields can also easily be mapped. An example of the simulator output using patient data is shown in Figure 1.

How to best render scotomas for simulation is an active area of research [9]. However, the simulation of central vision loss is particularly challenging since intrasaccadic perception might occur [5], which would result in a misalignment between the simulated field and fovea. Misalignment could allow "peeking" at the percepts that are supposed to be masked. To prevent this effect, a low vision simulation that attempts to mask central vision should have an overall latency of 25 ms or less; higher latencies can be tolerated for peripheral field loss [10]. This overall latency is independent of the display update rate but instead derives from the time between eye movement event and display event. Recent work on commodity-level head-mounted displays suggests that system latency remains the primary concern but that commodity eyetrackers perform well at simulating peripheral field loss [11]. The low vision simulator proposed in this grant will be built on equipment that has significantly lower overall latencies than those tested in Sipatchin et al. [11]. If necessary, the field of foveated rendering has developed fast gaze prediction techniques [4] that can be used to further reduce latencies.

2.3 System Evaluation

There is little published research validating the ecological validity of immersive low vision simulations. My primary evaluation will be conducted within virtual reality (VR) for experimental control. I intend to thoroughly assess my system by observing behavioral responses across three groups: people with low vision, people with simulated low vision, and people with normal vision. Low vision participants will be recruited through Vanderbilt University Medical Center. All three groups will undergo a training period to acclimate to the VR environment. A training period is particularly important for those in the simulated low vision group, since people with low vision develop compensatory techniques over time to successfully navigate their environment.

2.4 XR Design Testbed

After the initial evaluation, I intend to extend the testbed to encompass both video see-through and optical-see through augmented reality HMDs. The HoloLens 2 is of particular interest for low vision simulation since it provides an unobstructed view of the real world outside of any augmentations. This feature makes visual impairment simulation within the HoloLens desirable for the evaluation for physical products. I will additionally make the simulation publicly accessible for other developers and researchers to use. For a design case study, I will evaluate the effects of non-photorealistic rendering techniques on perception in XR, which is motivated by my prior work in which I found that non-photorealistic renderings

of cast shadows improved surface contact perception in immersive augmented reality displays [2, 3].

3 CONCLUSIONS

Although many consider extended reality to be one of the next major computing platforms, current head-mounted displays do not easily accommodate for consumers with disabilities—a population that constitutes one fourth of the U.S. population. Robust toolkits for enhancing accessibility in XR for people with low vision like those presented by Zhao et al. [15] are rare. Effective disability simulations, like the system proposed in the current work, may allow accessible design tools to be developed more rapidly and iteratively, especially for groups without ready access to user testers with disabilities. My simulation, when extended to immersive augmented reality, can even inform the accessible design of physical products. Given my prior research findings in which high contrast shading was demonstrated to improve spatial perception [2, 3], I hope to extend my research to enhance depth perception for both normally-sighted individuals [1] and those with low vision.

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- [9] E. Peli, J.-H. Jung, and R. Goldstein. Better simulation of vision with central and paracentral scotomas. *Investigative Ophthalmology & Visual Science*, 61(7):3370–3370, 2020.
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Budget Proposal:

Exposing Blind Spots in XR Accessibility With Simulated Vision Impairments

Expenditure Category	Quantity	Cost	Total Amount
Equipment Expenses			
Microsoft HoloLens 2	1.00	\$3500.00	\$3500.00
Pupil Labs Binocular Add-on	1.00	\$2100.00	\$2100.00
MSI GE76 Raider 10UG-232 Laptop	1.00	\$2299.00	\$2299.00
VIVO Stand Up Height Adjustable Desk Riser	1.00	\$159.99	\$159.99
Seagate Desktop 8TB External Hard Drive HDD	1.00	\$144.99	\$144.99
Subtotal			\$8203.98
Personnel Expenses			
Underrepresented Undergrad Research Assistant	1.00	\$6000.00	\$6000.00
Vision Simulation Experiment Participants	40.00	\$30.00	\$1200.00
Accessible Design Experiment Participants	40.00	\$30.00	\$1200.00
Subtotal			\$8400.00
Miscellaneous			
IEEE Open Access Publication Fees	2.00	\$2045.00	\$4090.00
Conference Attendance Costs	1.00	\$4300.00	\$4300.00
Subtotal			\$8390.00
Total Requested			\$24993.98

The requested funds will go towards progressing & disseminating the proposed research. Equipment purchases will allow research to be completed faster, and the HoloLens 2 will be essential for porting the simulation to optical see-through display. I have requested personnel expenses to equitably compensate those who volunteer for our experiments, as well as funds for supporting an undergraduate researcher from an underrepresented group in computer science to join my lab in 2022. I am actively involved with CS outreach & mentorship programs with younger students. To disseminate my research, I have allocated a portion of the budget towards open access publication fees, & I have set aside funds for conference attendance at venues including IEEE VR & ASSETS.

Microsoft Research Dissertation Grant

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Research Interests

PERCEPTION | VIRTUAL & AUGMENTED REALITY | HUMAN-COMPUTER INTERACTION | VISUALIZATION

Education

PhD in Computer Science

VANDERBILT UNIVERSITY | NASHVILLE, TN, USA

2016 - present

ADVISOR: BOBBY BODENHEIMER

BSc in Computer Science

RHODES COLLEGE | MEMPHIS, TN, USA

2011 - 2015

ADVISOR: BETSY WILLIAMS SANDERS

Exchange Student in Information and Communication Technology

GRIFFITH UNIVERSITY | SOUTHPORT, QLD, AUSTRALIA

2014

Research Experience

Research Assistant

DEPARTMENT OF ELECTRICAL ENGINEERING AND COMPUTER SCIENCE

Vanderbilt University

2018 - present

- Project 1: Assessed what visual properties of holograms affect depth perception and action affordances in the Microsoft HoloLens
- Project 2: Developed a deep learning walking-in-place system for infinite locomotion in VR

Graduate Researcher

DEPARTMENT OF ELECTRICAL ENGINEERING AND COMPUTER SCIENCE

Vanderbilt University

2016 - 2018

- Project 1: Revealed behavioural differences in children's motor recalibration after VR exposure
- Project 2: Simulated vision impairments from patient data using a head-mounted display
- Project 3: Designed an interface for visualization of ear anatomy in medical training

Undergraduate Research Assistant

DEPARTMENT OF MATH AND COMPUTER SCIENCE

Rhodes College

2015 - 2016

- Integrated Oculus Rift DK2 and WorldViz PPT Tracking System to create collaborative experience
- Evaluated how virtual reality affects collaboration when users are unable to meet their collaborators in person prior

Undergraduate Research Assistant

DEPARTMENT OF COMPUTER SCIENCE

University of Minnesota

2013

- Conducted preliminary work on a VR application for neurocognitive assessment

Publications

Journal & Conference Proceedings

HALEY ADAMS, SARAH CREEM-REGEHR, JEANINE STEFANUCCI, AND BOBBY BODENHEIMER. "STAY IN TOUCH! SHAPE AND SHADOW INFLUENCE SURFACE CONTACT IN XR DISPLAYS". *IEEE Transactions on Visualization and Computer Graphics (TVCG)*. 2021. [SUBMITTED]

HALEY ADAMS, JEANINE STEFANUCCI, SARAH CREEM-REGEHR, GRANT POINTON, WILLIAM THOMPSON, AND BOBBY BODENHEIMER. "SHEDDING LIGHT ON CAST SHADOWS: AN INVESTIGATION OF PERCEIVED GROUND CONTACT IN AR AND VR". *IEEE Transactions on Visualization and Computer Graphics (TVCG)*. 2021.

HALEY ADAMS. "RESOLVING CUE CONFLICTS IN AUGMENTED REALITY". *IEEE Virtual Reality Abstracts and Workshops*. 2020.

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SARA HANSON, RICHARD A. PARIS, **HALEY ADAMS**, AND BOBBY BODENHEIMER. “IMPROVING WALKING IN PLACE METHODS WITH INDIVIDUALIZATION AND DEEP NETWORKS”. *IEEE Virtual Reality*. 2019.

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HANNAH CHIPMAN, **HALEY ADAMS**, BETSY WILLIAMS SANDERS, D BRIAN LARKINS “EVALUATING COMPUTER SCIENCE CAMP TOPICS IN INCREASING GIRLS’ CONFIDENCE IN COMPUTER SCIENCE”. *Journal of Computing Sciences in Colleges*. 2018.

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Presentations

HALEY ADAMS. “A STRANGE VIEW: USING PERCEPTION TO IMPROVE XR”. *Hi5 Seminar Series, University of Mississippi*. 2020. https://www.youtube.com/watch?v=ZbPsKN4H_nw

HALEY ADAMS, JACK NOBLE, WILLIAM G. MORREL, ALEJANDRO RIVAS, JUSTIN SHINN, ROBERT LABADIE, AND BOBBY BODENHEIMER. “PLAY IT BY EAR: AN IMMERSIVE EAR ANATOMY TUTORIAL”. *In Proceedings of IEEE VR*. 2019.

GAYATHRI NARASIMHAM, **HALEY ADAMS**, JOHN RIESER, SARAH CREEM-REGEHR, JEANINE STEFANUCCI, AND BOBBY BODENHEIMER. “SPATIAL MEMORY OF CHILDREN AND TEENS IN IMMERSIVE VIRTUAL ENVIRONMENTS”. *In Proceedings of the ACM Symposium on Applied Perception (SAP)*. 2018.

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HALEY ADAMS, ALYSSA CRIDER, AND VICTORIA INTERRANTE. "VIRTUAL REALITY IMPLEMENTATION FOR NEUROCOGNITIVE ASSESSMENT". In *Proceedings of Grace Hopper Celebration of Women in Computing*. 2013.

Teaching & Mentorship Experience

Graduate Teaching Assistant

Vanderbilt University

DEPARTMENT OF ELECTRICAL ENGINEERING AND COMPUTER SCIENCE

2016 - 2018

- Evaluated assessments and provided meaningful feedback to 50-100 student classes in short time frames for Discrete Structures and Algorithms (CS 2212)
- Guest lectured on inductive proofs to sophomore undergraduates for Discrete Structures and Algorithms (CS 2212)
- Guest lectured on 3D modeling for Virtual Reality for Interdisciplinary Applications (UNIV 3279)
- Guest lectured on Virtual Reality and Visualization for Introduction to Visualization (CS 5891)
- Instructed multiple class sessions for Augmented Virtual Reality (CS 8395)
- Served as Experienced TA Panelist at Teaching Assistant Orientation, 2017

Graduate Research Mentor

Vanderbilt University

SCHOOL OF SCIENCE AND MATH

2016 - 2019

- Dictated project milestones and facilitated communication with research faculty
- Guided development of fundamental research and software development skills in C# of high schoolers

Students Mentored

CARLOS SALAS · HIGH SCHOOL STUDENT IN SCHOOL FOR SCIENCE AND MATH	2018 - 2020
HANSEN WU · UNDERGRADUATE IN VANDERBILT UNIVERSITY	2018 - 2019
PRIYA RAJAN · UNDERGRADUATE IN VANDERBILT UNIVERSITY	2018 - 2019
NIDHI MEHTA · UNDERGRADUATE IN VANDERBILT UNIVERSITY	2018 - 2019
PETER CHO · UNDERGRADUATE IN VANDERBILT UNIVERSITY	2018 - 2019
NOORIN ASJAD · UNDERGRADUATE IN VANDERBILT UNIVERSITY	2017 - 2018
TAYLOR NYE SMITH · HIGH SCHOOL STUDENT IN SCHOOL FOR SCIENCE AND MATH	2016 - 2017

Leadership & Service

Student Volunteer Chair

IEEE VR

2020

Unity Development Workshop Leader

VANDY HACKS

2018

Founding Member and Officer

ACM-W STUDENT CHAPTERS

2013 - 2018

- Managed resources and mediated between students, faculty, and the ACM-W
- Provided opportunities for advancement and organized events with diverse speakers and recruiters

Event Organizer

EMERGE - EMERGING TECHNOLOGY SYMPOSIUM

2017

- Handled event logistics for half-day symposium, including food, advertisement, and audio/video
- Recruited and arranged accommodation for keynote speakers

Director, Instructor

CAMP CODETTE

2015 - 2016

- Founded a persisting summer coding program for middle and high school girls
- Formulated curriculum, led team of undergraduate counselors, and instructed learning sessions
- Provided insights to Google Education and conferred pedagogical strategies for student retention in computer science

Technical Skills

Programming Languages | C# · PYTHON · MATLAB · LATEX · C++ · HTML5 · CSS

3D and 2D Design | UNITY GAME ENGINE · PHOTOSHOP · BLENDER

Honors & Awards

Microsoft Research Dissertation Grant, **Microsoft**

2021 - present

Academic Merit Scholarship, **Vanderbilt University**

2016 - present

Vanderbilt IBM Fellowship, **Alumni Association**

2016 - 2020

Presidential Scholarship, **Rhodes College**

2011 - 2015

Best Poster, **ACM Symposium on Applied Perception (SAP)**

2015