Lecture 24: Virtual Reality and **Augmented Reality**

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CSC 292/572, Fall 2022 **Mobile Visual Computing**



Logistics

Final project due 12/20, 11:30 AM.

- Provide a write-up describing what you have done, along with the code.
- Submit a Jupyter notebook if you code in Python

have done, along with the code. in Python



The Roadmap

Theoretical Preliminaries

Human Visual Systems

Color in Nature, Arts, & Tech (a.k.a., the birth, life, and death of light)

Digital Camera Imaging

Modeling and Rendering

Applications



Medical Imaging

Cultural Heritage

AR/VR

Research



Virtual Reality

immersive display; everything you see is emitted from the display.

https://fortune.com/2016/11/15/virtual-reality-gaming-entertainment-tech/

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Oculus Quest



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Oculus Rift S



Oculus Rift S



Samsung Gear VR



Google Cardboard











Medical Training







VR Hardware



The Most Important Piece: Lenses





The Most Important Piece: Lenses



Why do we have to have lenses? Can't we just put a display directly in front of eyes?



The Most Important Piece: Lenses

Also called "eye piece"



https://www.amazon.com/Google-87002823-01-Official-Cardboard-Brown/dp/B01MQ5J5J4 https://www.roadtovr.com/sensics-ceo-yuval-boger-dual-element-optics-osvr-hdk-vr-headset/









Viewing distance: ~12 inches

Field of view: ~25°

https://www.dimensions.com/element/apple-iphone-11





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Viewing distance: ~0.53 inches





Viewing distance: ~12 inches

Field of view: ~25°



Viewing distance: ~0.53 inches

Field of view: ~160°







Viewing distance: ~0.53 inches

Field of view: ~160°







Viewing distance: ~0.53 inches



https://www.dimensions.com/element/apple-iphone-11





Ideally: combine the best of both worlds:

Large field of view for immersive experience
Longer viewing distance for eyes to focus



Viewing distance: ~0.53 inches



https://www.dimensions.com/element/apple-iphone-11



Lens in Virtual Reality Display



Virtual display



1: create a wide field of view.







1: create a wide field of view.







1: create a wide field of view.

2: place the display far away from your eyes.







1: create a wide field of view.

2: place the display far away from your eyes.

- ...although the actual display is necessarily very close to your eyes.
- Your eye lenses don't have enough power to focus that close: ~8 cm for teenagers and ~50 cm for elderlies.







VR Rendering



First, mind the difference between VR and 360° videos, which sometimes are called VR videos. We discussed the latter in earlier lectures.





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• Creating and rendering VR videos are light-field imaging/rendering in disguise.





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- rendering (for smartphones, computer displays, etc.)
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 - Need to track motion (rotation and/or translation)

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- Need to track motion (rotation and/or translation)
- Need to render a stereo pair (vergence-accommodation conflict)
- Need to fix lens distortion
- Need to be aware of the low compute power (foveated rendering, eye tracking)





Grossly Simplified, Not-to-Scale End-to-End Pipeline







Grossly Simplified, Not-to-Scale End-to-End Pipeline



Motion to Photon Latency: < 20 ms (ideally < 7 ms)




Grossly Simplified, Not-to-Scale End-to-End Pipeline





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Grossly Simplified, Not-to-Scale End-to-End Pipeline





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VR Rendering Tracking



Motion Tracking

Recall: motion = translation + rotation

$\begin{bmatrix} x, y, z, 1 \end{bmatrix} x \begin{bmatrix} 100 & T01 & T02 \\ T00 & T01 & T02 \\ T10 & T11 & T12 \\ 20 & T21 & T22 \\ T30 & T31 & T32 \end{bmatrix} \begin{pmatrix} R_{3x3} & 0_{3x1} \\ T_{1x3} & 1_{1x1} \end{bmatrix} = [x', y', z', 1]$ Sible for translation



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Rotation has 3 Degrees of Freedom, Not 6!

	1	0	0
Around X R _x :	0	cos θ	sin θ
	0	-sin θ	cos θ

Around Z
 R_z : $\cos \psi \sin \psi$ 0- sin $\psi \cos \psi$ 0

- 0 0

	$\cos \varphi$	0	-sin ϕ
Around Y R _v :	0	1	0
y	$\sin \varphi$	0	$\cos \varphi$

Rotation matrix = $R_x x R_y x R_z$



3 DoF vs. 6 DoF









6 DOF (3 DOF + X - T- Z) Head orientation + Walk around Full VR Object-based audio









3 DOF (Yaw - Pitch - Roll) Head orientation only 360 Video Ambisonics







How to Track?

- Can a sensor directly provide the 6 unknowns?
 - Inertial Measurement Unit (IMU): gyroscope + accelerometer
- essentially an optimization problem.
 - Inside-out tracking
 - Outside-in tracking

Usually combine IMU sensor + computational techniques

Or, cheat using teleportation!

If not (or sensor data only is unreliable), resort to compute vision techniques,



Gyroscope and Accelerometer

Provides angular velocity



to get the rotation and translation.

Provides translational acceleration

Change of capacitance is proportional to acceleration



Given the sampling rate of the sensor and the reading per sample, integrate







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Computational Techniques for Tracking

Ideally: solve the system of equations (6 unknowns: θ , φ , ψ , Δx , Δy , Δz).

- Recall photogrammetry and SLAM in earlier lectures.
- Find the before/after coordinates of 6 points. Assuming rigid objects.
- In reality: find many points (over-determined) and minimize a loss.
- Either way, key is to find corresponding points in different camera captures.







Outside-In vs. Inside-Out Tracking

Outside-in: cameras are outside, matching points are on the user.



Inside-out: cameras are on the user; matching points are in the scene.







Rift DK2: Outside-In Tracking Using IR Lights



40 IR LEDs provide 60 equations. The fixed pattern makes it easier to find correspondences between camera captures.





Inside-Out Tracking

Windows MR (2x front cameras)

Oculus Quest (4x corner cameras)





Oculus Rift S (5x spaced cameras)





Valve Room, 2014. Use markers to simplify corresponding matching.







VR Teleportation

https://www.engadget.com/2016-10-07-why-teleportation-makes-sense-in-virtual-reality.html

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VR Rendering

• Tracking

• Stereo rendering (vergenceaccommodation conflict)





Right Image







Right Image













Object depth is inversely proportional to the disparity on the images.

Large







Object depth is inversely proportional to the disparity on the images.

• This logic is "hard-wired" in your brain (evolution).



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- This logic is "hard-wired" in your brain (evolution). • If the disparity of an object is smaller than that of what you currently focus on, you know it's farther away; vice versa.

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VR rendering ideally should render a stereo pair with the correct pixel disparities to provide the correct sense of depth.

Large disparity





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VR rendering ideally should render a stereo pair with the correct pixel disparities to provide the correct sense of depth.

• If not you will still get some sense of depth but weaker (other depth cues: occlusion, size, blur, etc.)

Large disparity







Stereo Rendering Small disparity



Large disparity

The stereo disparity drives the vergence state of the eyes.

https://www.roadtovr.com/oculus-new-stereo-shading-reprojection-brings-big-performance-gains-certain-vr-scenes/







Rotating eye balls so that images are formed on the fovea (highest acuity).



CONVERGENCE

DIVERGENCE







Accommodation

Vergence itself isn't enough. The object on the fovea might be blurred because it's out-of-focus.

Change eye len's convexity (refractive power) so that the object on the fovea is sharp.

• Controlled by ciliary muscle inside eye.

Retinal (foveal) blur drives accommodation.







Vergence and Accommodation are Coupled



Focus on far objects:

- Diverge
- Relax lenses

Focus on near objects:

- Converge
- Contract lenses

It's a reflex action (accommodationconvergence reflex)

Gordon Wetzstein



Vergence and Accommodation are Coupled



Object distance dictates:

- the stereo disparity, which drives the vergence state θ.
- the retinal blur, which drives the accommodate state **R**.
- θ and **R** are correlated.

Distance decreases (increases):

- **θ** increases (decreases)
- **R** increases (decreases)



Problem with VR: Vergence-Accommodation Conflict

Virtual objects at difference distances are emitted from the same fixed distance!

- The physical display and the lenses don't move.
- The accommodation distance (e.g., 1.4 m in Oculus Rift DK2) if fixed.
- So the accommodate state **won't** change as you focus on different objects at different depths.

But the stereo disparities of different objects do change with the depths.

- Stereo rendering generates correct disparities
- So your vergence state **does** change.







Problem with VR: Vergence-Accommodation Conflict

- Given the rendered stereo disparity of an object you want to focus on, you eyes will settle for a vergence state, θ .
- Your brain will try to impose the accommodate state **R** coupled with θ .
- But that **R** won't focus on the virtual object. The object is now actually blurred. Fighting the VAC creates discomfort and fatigue.
- Given enough time, your brain will learn to decouple vergence with accommodation, but when going back to the real world, you get the discomfort again.







Accommodation Distance > Vergence Distance.

Looking at object close up. More severe.



Vergence Distance > Accommodation Distance. VAC less of an issue, because accommodation cue is less important for farther objects.





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Light-Field Display



OLEDs

assembled HMD. (See Appendix A of the supplement fry material for an extended discussion of the prototype construction.)

Microlens Arrays (with the stand-offs)

Figure 7: Constructing a near-eye light field HMD. (Leff) A custom head-mounted enclosure, comprising the plastic parts shown on the left, was fabricated to hold the Sony HMZ-T1 driver electronics and our modified eyepieces, shown on the right. (Middle) Each modified eyepiece contains a Fresnel Technologies #630 microlen's array, mounted in front of a Sony ECX332A OLED microdisplay. (Right) A user wearing the







Light-Field Display









Light-Field Display







Goal: Reproducing 4D Light Field from a 2D Display



These are lights we ideally want to generate, but we have only a 2D display!

If only we could put three display pixels at these places!

Systematic characterization and optimization of 3D light field displays, Optic Express 2017


Goal: Reproducing 4D Light Field from a 2D Display As long as each display pixel emits lights in the Retinal image desired direction, we can reproduce the lightfield.

Eye



Reconstruction of 4D Light Fields

But each pixel emits lights to the hemisphere. How can we control the direction of each pixel?



Generating Light Field Using Pinhole Array



Put a pinhole array in front of the display!

4D Light Fields

Systematic characterization and optimization of 3D light field displays, Optic Express 2017





Put a pinhole array in front of the display!





Put a pinhole array in front of the display!

Two steps:

- Record the light field.
- Reproduce the light field.





Put a pinhole array in front of the display!

Two steps:

- Record the light field.
- Reproduce the light field.

Both can be done using the pinhole array.















These "elemental images" are essentially photos of the scene taken at different perspectives. Note how these elemental images are not exactly the same.





Is this the correct reproduction?









































Recording Light Field Using Microlens Array



Disadvantages: Pinholes are very small, which increases noise and gives rise to diffraction effects.

Replace each pinhole with a microlens.



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Recording Light Field Using Microlens Array



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Recording Light Field Using Microlens Array





Disadvantages: Pinholes are very small, which increases noise and gives rise to diffraction effects.

Replace each pinhole with a microlens.

Downside: the lightfield sampling has lower resolution.



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3D Display Using Microlens Array

- Idea of recording light field first theorized by Gabriel Lippmann (Nobel laureate in physics, 1908, for color photography). He didn't get to implement it.
- We could either use a light field camera to record the light field or, in the case of VR rendering, render/simulate the different elemental images.







VR Rendering

- Tracking
- Stereo rendering (vergence
 - accommodation conflict)

• Foveated rendering (+eye tracking)



Recall: Spatial Resolution of Human Visual System



- black and white is one cycle.
- Cycle per degree (CPD) quantifies the spatial resolution in the scene.
- Human perception limit is 60 CPD (based on the sampling theory).

Assuming the display displays alternating black and white pixels. One pair of





How Many Pixels to Render?



- Vertical FOV at a viewing distance of 12" is 25.0° • CPD = 25 * 60 = 1,500• # of pixels (height) = 3,000
- Horizontal FOV is 12.2°

 - # of pixels (width) = 1464

To approach human spatial resolution limit, the CPD should be at least 60.

• CPD = 12.2 * 60 = 732

Actual iPhone 11 resolution: 1792 x 828



How Many Pixels to Render?





To maintain retinal resolution:

- assuming horizontal/vertical FOV is 160°
- # of pixels = $(160 * 60)^2 = 9600 \times 9600$
- If FOVs is 200° , # of pixels = $110K \times 110K$
- This is per eye!

Today's VR headset resolution per eye:

- Oculus Quest 2: 1832 x 1920
- Valve Index: 1440 x 1600



Recall: Photoreceptor Density

The area on the retina with the highest cone density is called fovea.

Fovea angle is about 2°. Peripheral vision has very low acuity.











Periphery



How?

Intuition: peripheral rendering can be of low quality (e.g., low resolution).

One common approach:

- Render with different resolutions.
- Stack and blend them together.
- Patch boundaries will have clear edge artifacts. Use low-pass filter.
- Enhance contrast as a final pass. Empirically peripheral vision needs high contrast.



Towards Foveated Rendering for Gaze-Tracked Virtual Reality, SIGGRAPH Asia 2016 63



What to Render for Peripheral?

nature neuroscience

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nature > nature neuroscience > articles > article

Published: 14 August 2011

Metamers of the ventral stream

Jeremy Freeman 🖂 & Eero P Simoncelli

Nature Neuroscience 14, 1195–1201 (2011) Cite this article

10k Accesses | 313 Citations | 17 Altmetric | Metrics

Abstract

The human capacity to recognize complex visual patterns emerges in a sequence of brain areas known as the ventral stream, beginning with primary visual cortex (V1). We developed a population model for mid-ventral processing, in which nonlinear combinations of V1 responses are averaged in receptive fields that grow with eccentricity. To test the model, we generated novel forms of visual metamers, stimuli that differ physically but look the same. We developed a behavioral protocol that uses metameric stimuli to estimate the receptive field sizes in which the model features are represented. Because receptive field sizes change along the ventral stream, our behavioral results can identify the visual area corresponding to the representation. Measurements in human observers implicate visual area V2, providing a new functional account of neurons in this area. The model also explains deficits of peripheral vision known as crowding, and provides a quantitative framework for assessing the capabilities and limitations of everyday vision.







Ventral Metarism





Ventral Metarism



Ground truth





Gaze Tracking

Foveated rendering requires tracking gaze. Gaze tracking is just in general very useful (in AR/VR)



3 Natural eye movements, Gaze Vector called saccades, are used to predict where your eye Ctor 1 4 Eye-interaction enables fast, easy hands-free control of a user interface.



king/mobile/ https://venturebeat.com/2015/11/11/eyefluence-raises-14m-for-eye-popping-eye-tracking-technology-for-vr/



Gaze Tracking Hardware



Near-eye camera

A ring of (IR) light sources

VIVE Pro Eyes

https://panora.tokyo/panora.tokyo/84223/HPC-index.html 68



Near-Eye Images





(e)

https://www.sciencedirect.com/science/article/pii/S0165027019301578 69

(f)





Gaze Tracking Algorithm

Segment the pupil from the eye



Estimating the orientation (gaze)

Deep Pictorial Gaze Estimation, ECCV 2018 DeepVOG: Open-source pupil segmentation and gaze estimation in neuroscience using deep learning, Journal of Neuroscience Methods 2019 70



FOVEATED RENDERING

- We can only see clearly where we are looking at
- Shading at full rate everywhere is a waste of computation

Steps

- Create a density map
- Ray trace 1 sample for each area
- Reconstruct full resolution image







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FOVEATED RENDERING

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Neural Reconstruction







DeepFovea: Neural Reconstruction for Foveated Rendering and Video Compression using Learned Statistics of Natural Videos, SIGGRAPH Asia 2019 74



VR Rendering

- Tracking
- Stereo rendering (vergence
 - accommodation conflict)
- Lens distortion correction

• Foveated rendering (+eye tracking)



Lens Distortion (in VR)



A photo of my cardboard



Lens Distortion Correction





LCD Display

Warped "fisheye"-like image required to match optics enlarged in the center and compressed in the periphery

Transforms light from display to a wide field of view focused on the eye

https://www.anandtech.com/show/9305/nvidia-announces-gameworks-vr-branding-adds-multires-shading 77





Optics

User's view

User sees correctly proportioned (not fisheye) scene with wide field of view



Augmented Reality

what you see = real world light + light projected from display.



Optical See-Through vs. Video See-Through







AR on Smartphone: Video See-Through



https://www.cnet.com/news/google-tango-dead-arcore-arkit-apple/

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Microsoft Hololens: Optical See-Through

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s://www.bbc.com/news/technology-47350884 http





Google Glass: Optical See-Through

https://www.techradar.com/reviews/gadgets/google-glass-1152283/review 82

Waveguide



https://www.intechopen.com/books/state-of-the-art-virtual-reality-and-augmented-reality-knowhow/waveguide-type-head-mounted-display-system-for-ar-application 83





Optical See-Through Schematic



Beam splitter is often used as a combiner







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FG/BG Discounting Model

- Physics: sum of FG & BG:

$XYZ = XYZ_{FG} + XYZ_{BG}$



FG/BG Discounting Model

- $\alpha \& \beta$ depend on task, complexity, and luminance
- $\alpha > \beta$ for FG color matching
- $\alpha < \beta$ for BG brightness matching

Perceptual: weighted sum of FG & BG: (Physical $\alpha = \beta = 1$)

$XYZ_{effective} = \alpha XYZ_{FG} + \beta XYZ_{BG}$

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