

**Lecture 24/25:**

# **Intro to Virtual Reality**

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**Computer Graphics and Imaging**  
**UC Berkeley CS184/284A**

# Ivan Sutherland's Virtual Reality Research in 1968

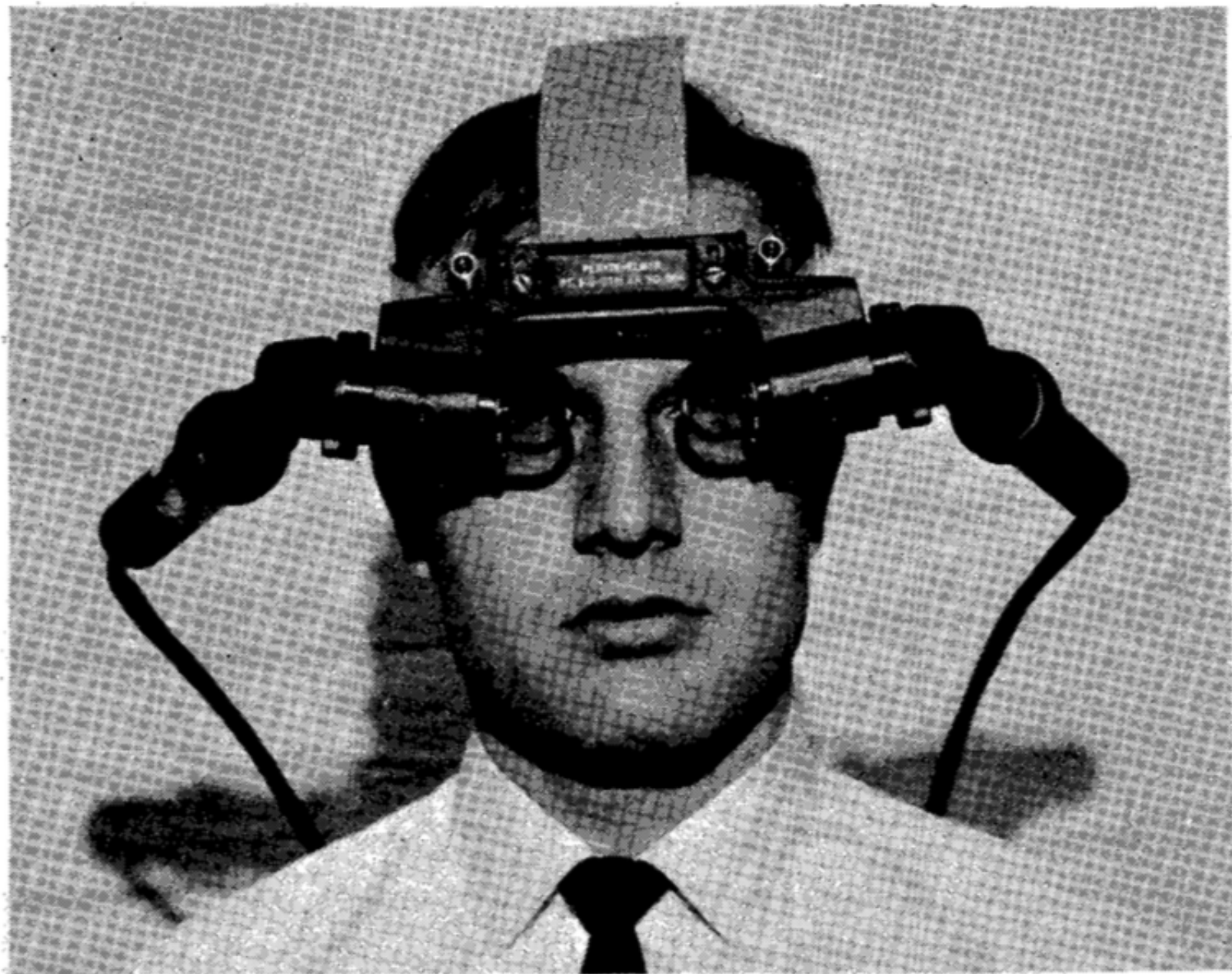


FIGURE 2—The head-mounted display optics with miniature CRT's



FIGURE 4—The ultrasonic head position sensor in use

# VR Head-Mounted Displays (HMDs)

Oculus Quest



Sony



HTC Vive



Google Daydream



Flow



Cardboard

Also Valve Index, HP Reverb, etc...

# Virtual Reality (VR) vs Augmented Reality (AR)

VR = virtual reality

- User is completely immersed in virtual world (sees only light emitted by display)

AR = augmented reality

- Display is an overlay that augments user's normal view of the real world (e.g., Terminator)



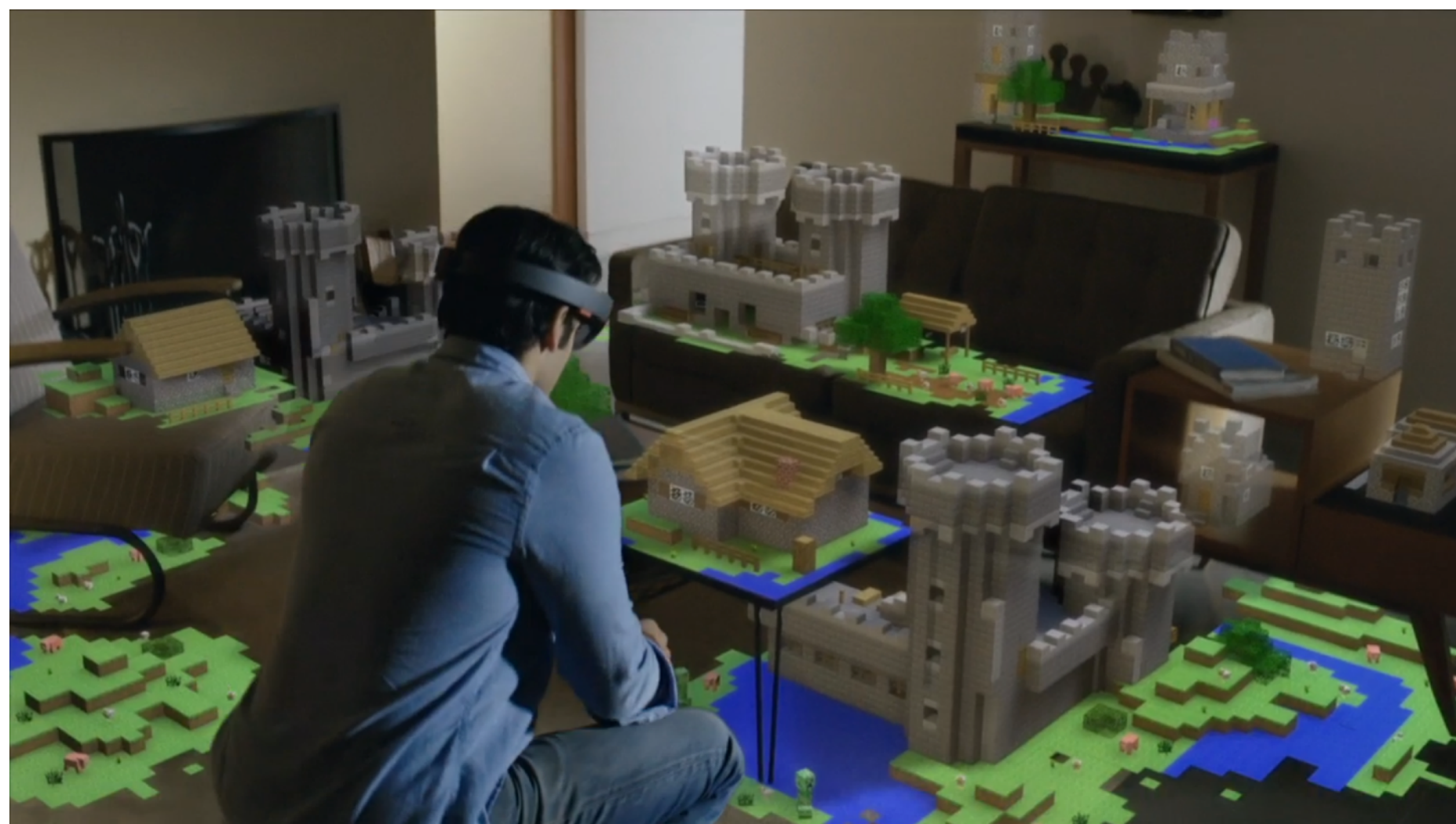
Image credit: Terminator 2 (naturally)

# AR Headsets

Microsoft HoloLens



Magic Leap



Also Snap Spectacles

# **VR Applications**

# VR Gaming



Star Wars Squadrons (EA)

# VR Painting



Tilt Brush

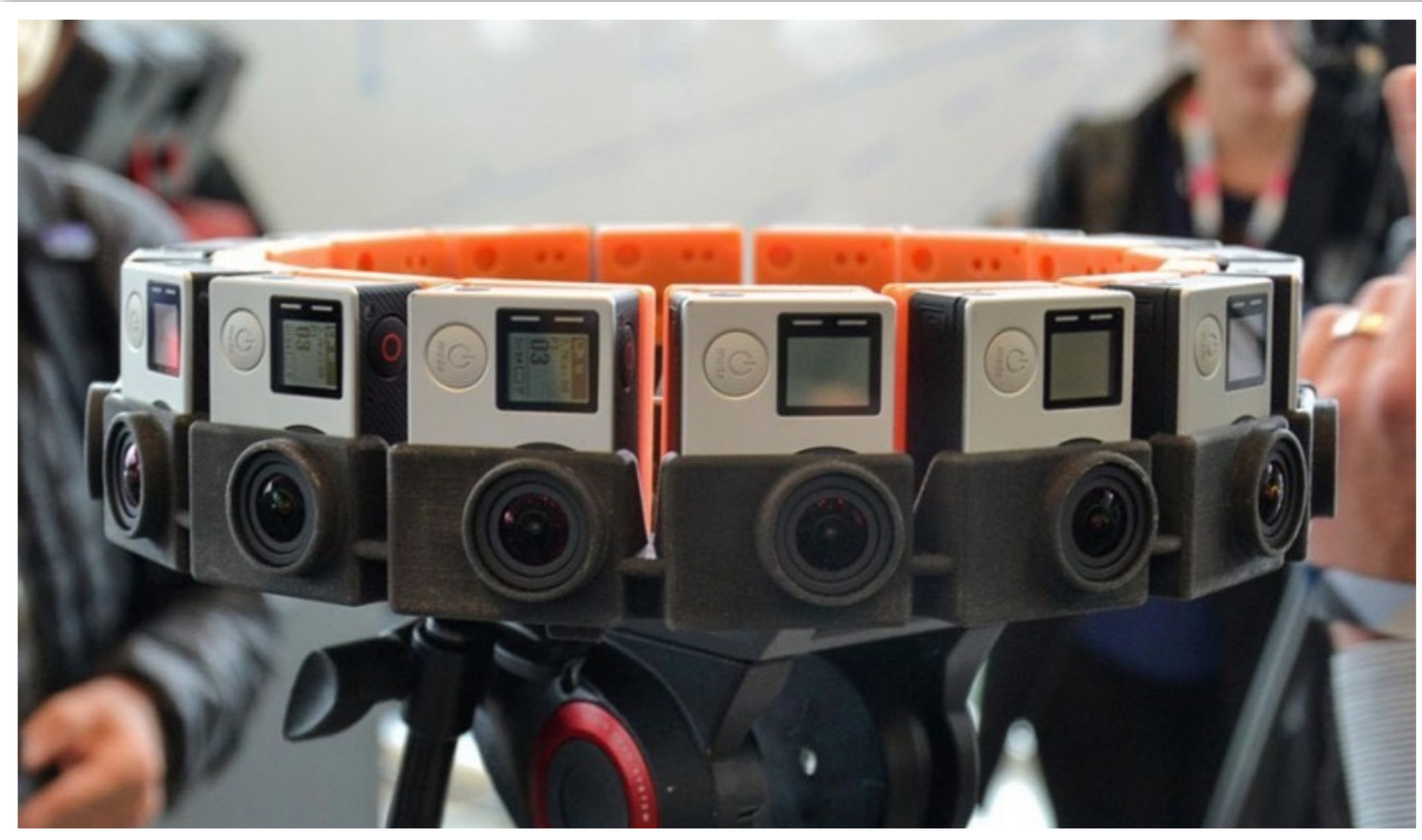


# VR Video

Jaunt VR (Paul McCartney concert)



# VR Video



# VR Teleconference / Video Chat



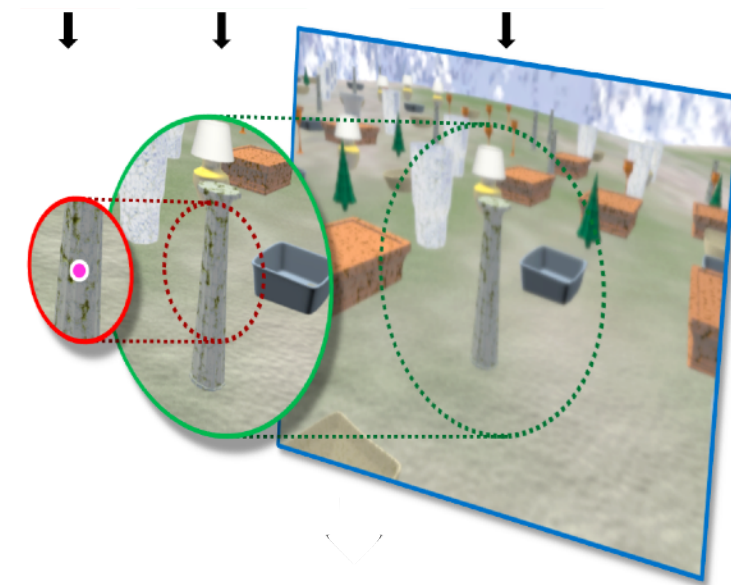
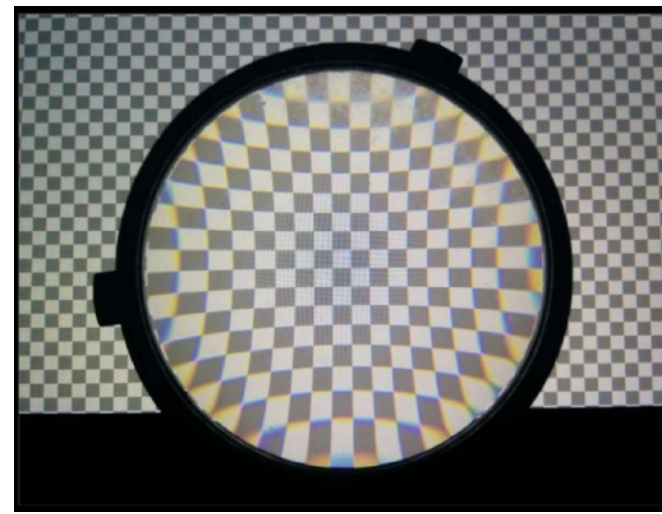
trial version

# Overview of VR Topics

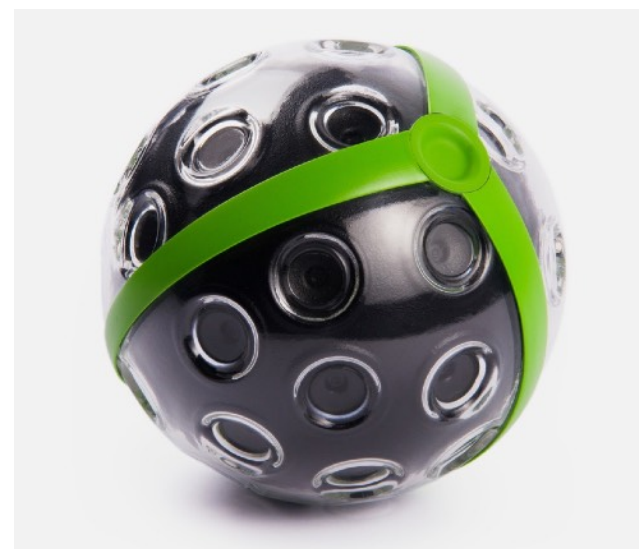
- VR Displays



- VR Rendering



- VR Imaging



# **VR Displays**

# Field of View

Regular 2D panel displays have windowed FOV

- User orients themselves to the physical window of the display

VR/AR displays provide 360 degree FOV

- Displays attached to head
- Head orientation is tracked physically
- Rendered view synchronized to head orientation in realtime (much more on this later)

# 3D Visual Cues

Panel displays give 3D cues from monocular rendering

- Occlusion, perspective, shading, focus blur, ...
  - Uses z-buffer, 4x4 matrices, lighting calculation, lens calculations...

VR/AR displays add further 3D cues

- Stereo: different perspective view in left/right eyes
  - Physically send different images into each eye
- Parallax (user-motion): different views as user moves
  - Uses head-tracking technology coupled to perspective rendering

# **VR Headset Components**



# Oculus Quest 2 Headset (2020)



**CS184/284A**

**Ren Ng**

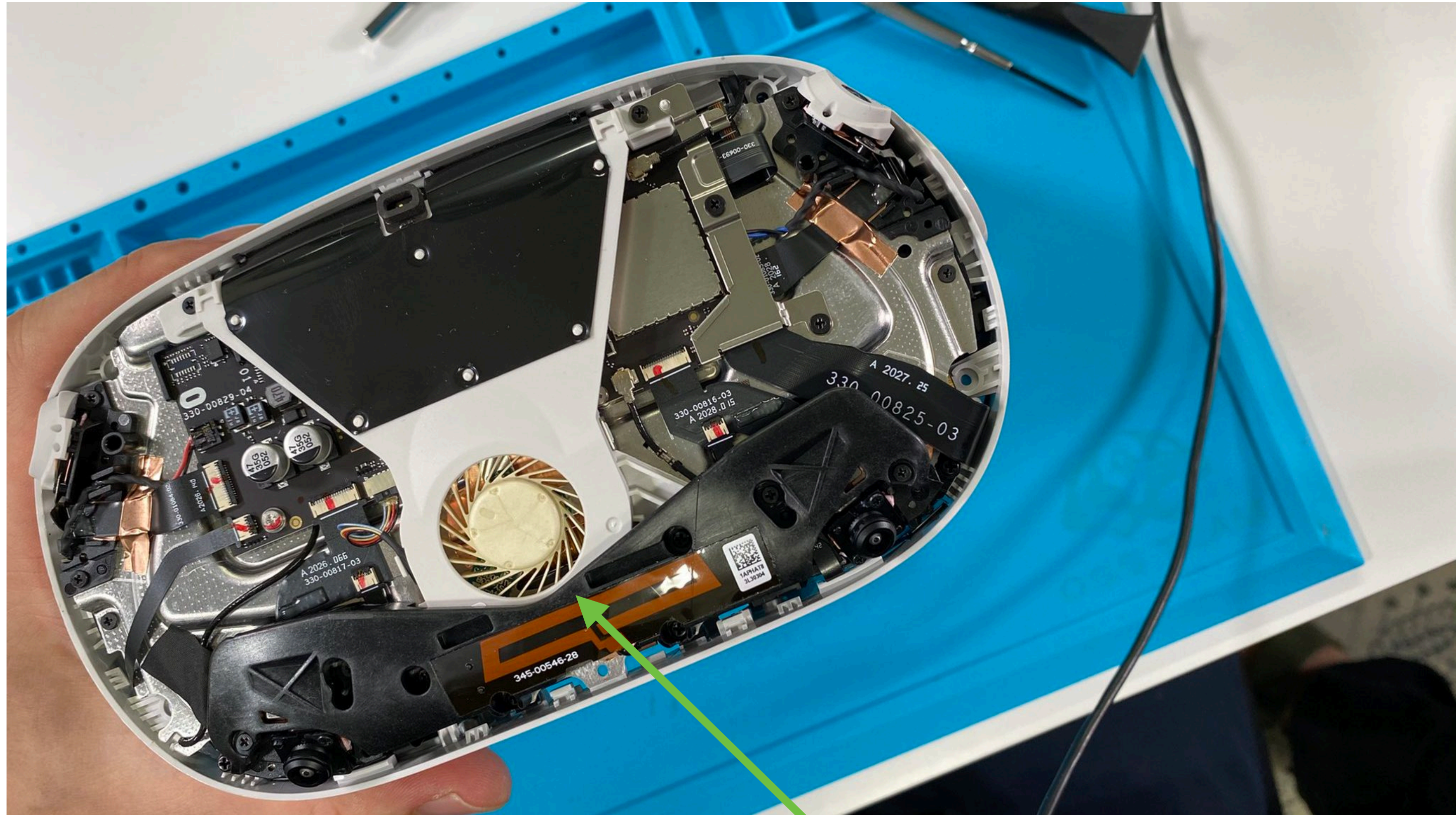
# Oculus Quest 2 Headset



CS184/284A

Ren Ng

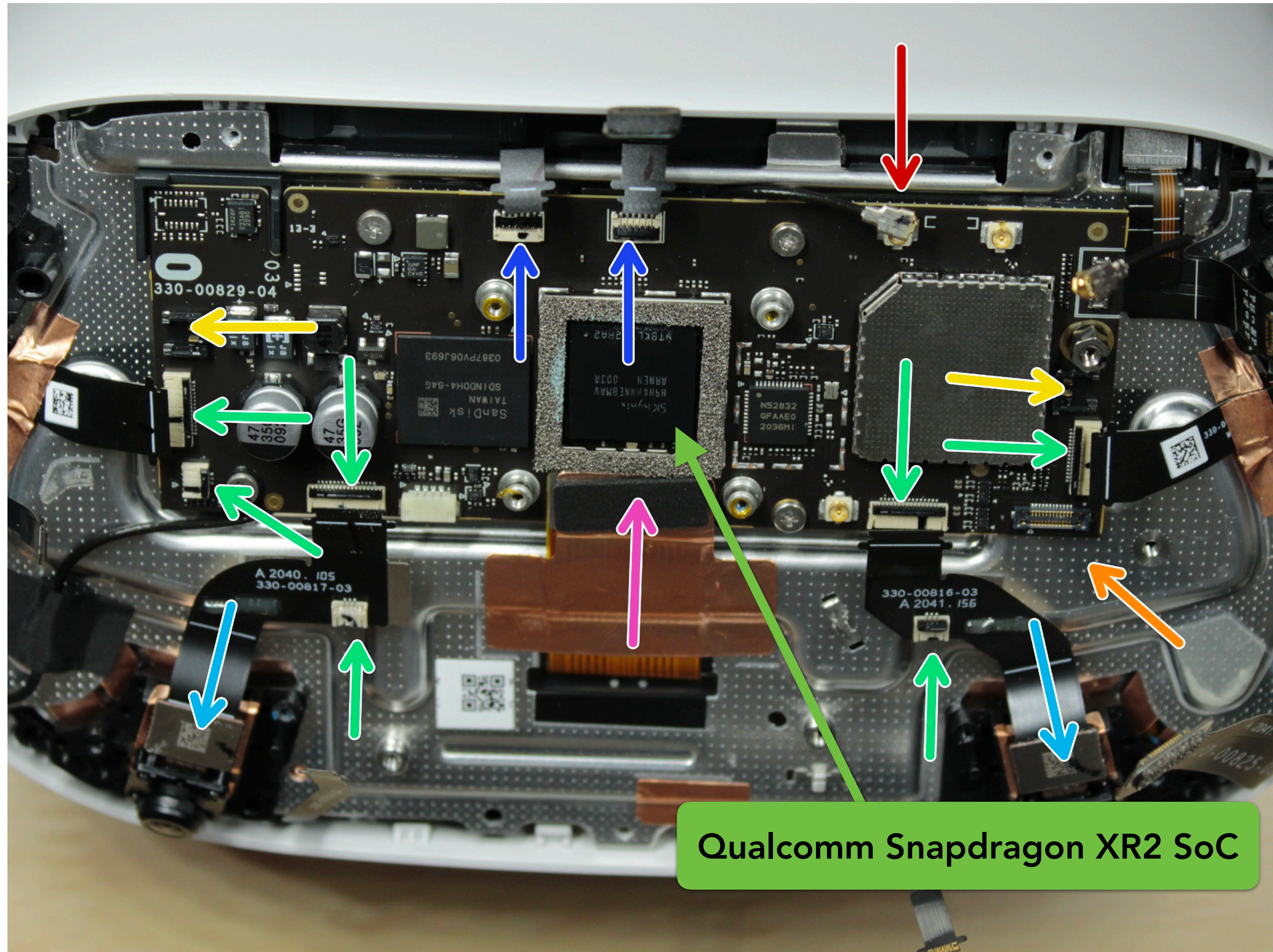
# Oculus Quest 2 Headset



Fan

Image credit: ifixit.com

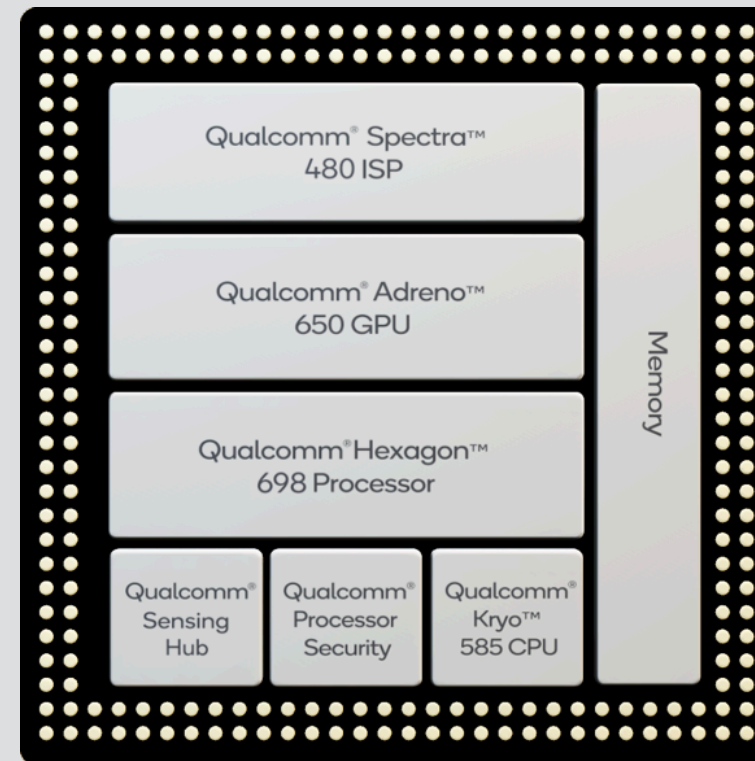
# Oculus Quest 2 Headset



Qualcomm Snapdragon XR2 SoC

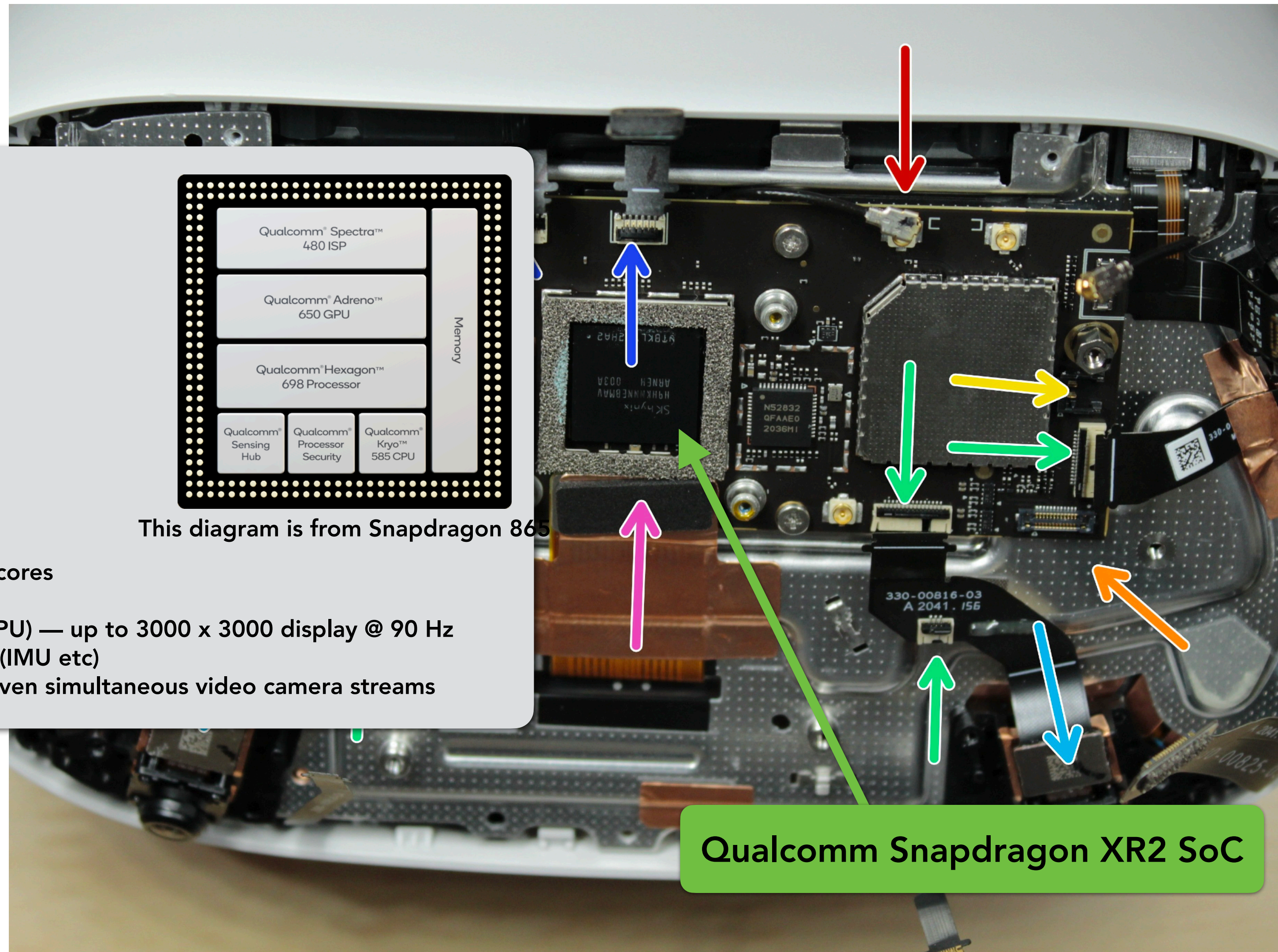
Image credit: ifixit.com

# Oculus Quest 2 Headset (Snapdragon SoC)



- 4 high-performance cores
- 4 low-performance (low energy) cores
- Image processor + DSP
- Multi-core graphics processor (GPU) — up to 3000 x 3000 display @ 90 Hz
- Additional processor for sensors (IMU etc)
- Can process inputs from up to seven simultaneous video camera streams

This diagram is from Snapdragon 865



Qualcomm Snapdragon XR2 SoC

Image credit: ifixit.com

# Oculus Quest 2 Headset

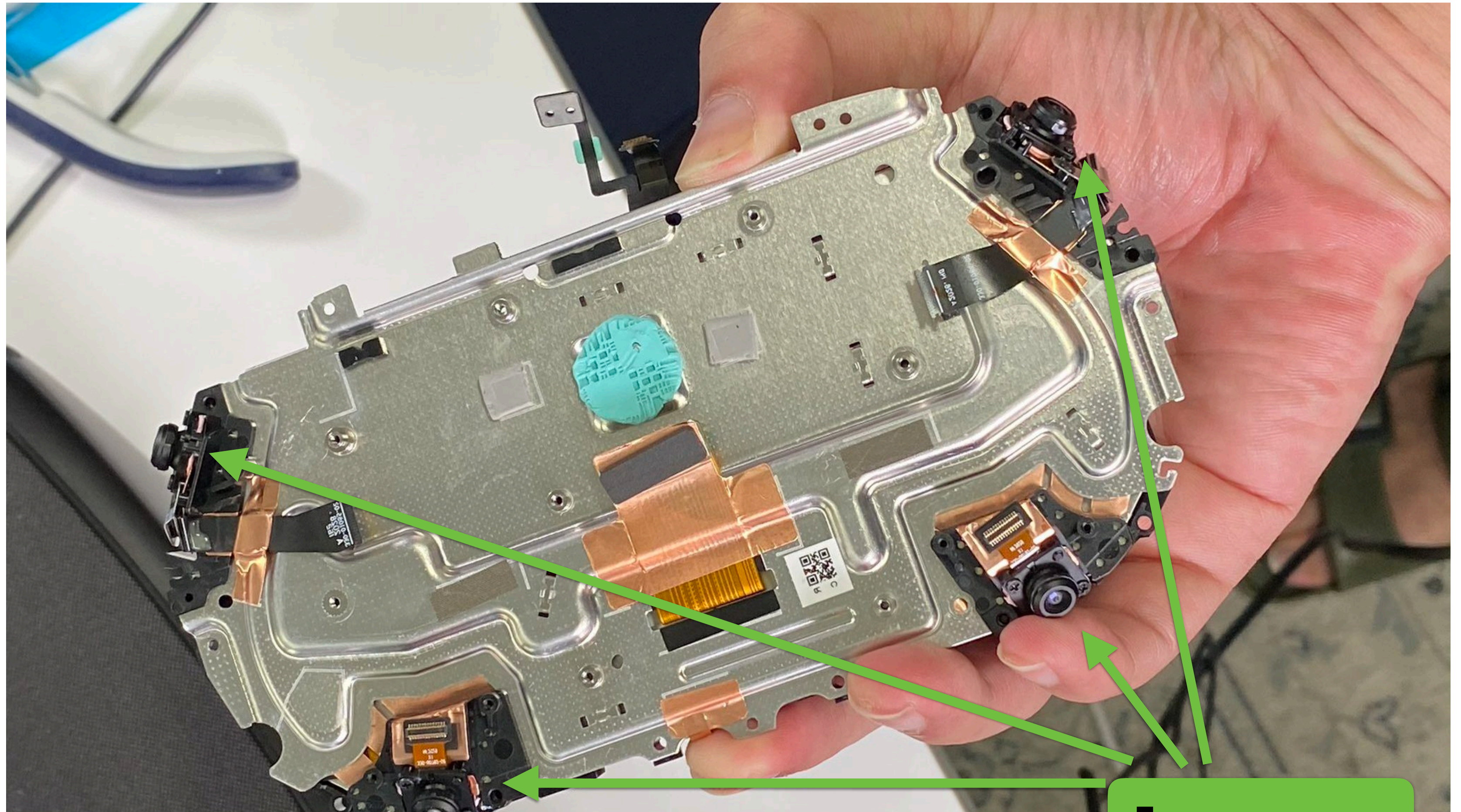


Image credit: ifixit.com

**Four cameras**

# Oculus Quest 2 Headset (Lens Assembly)



Image credit: ifixit.com

# Oculus Quest 2 Display + Lens Assembly

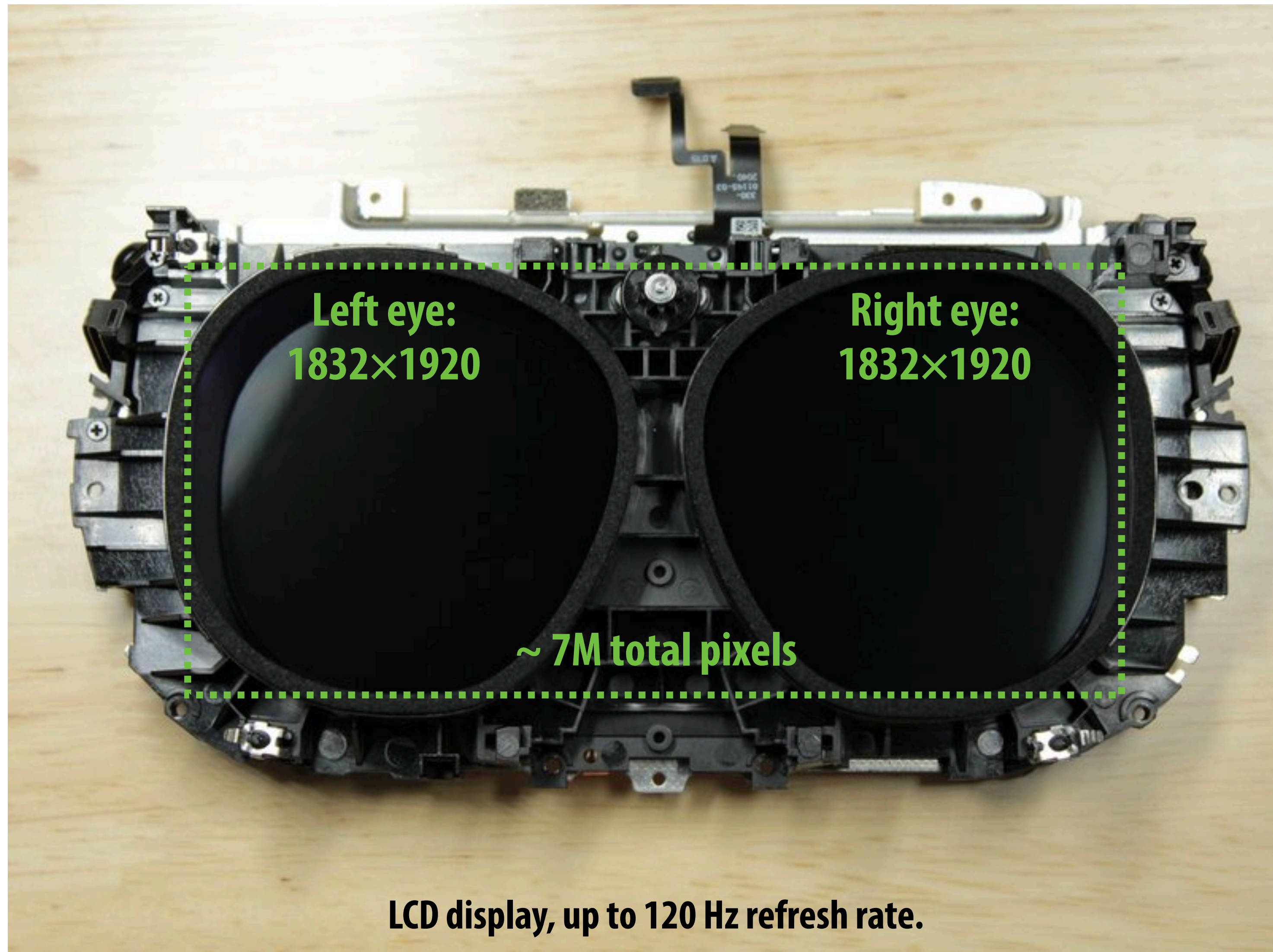
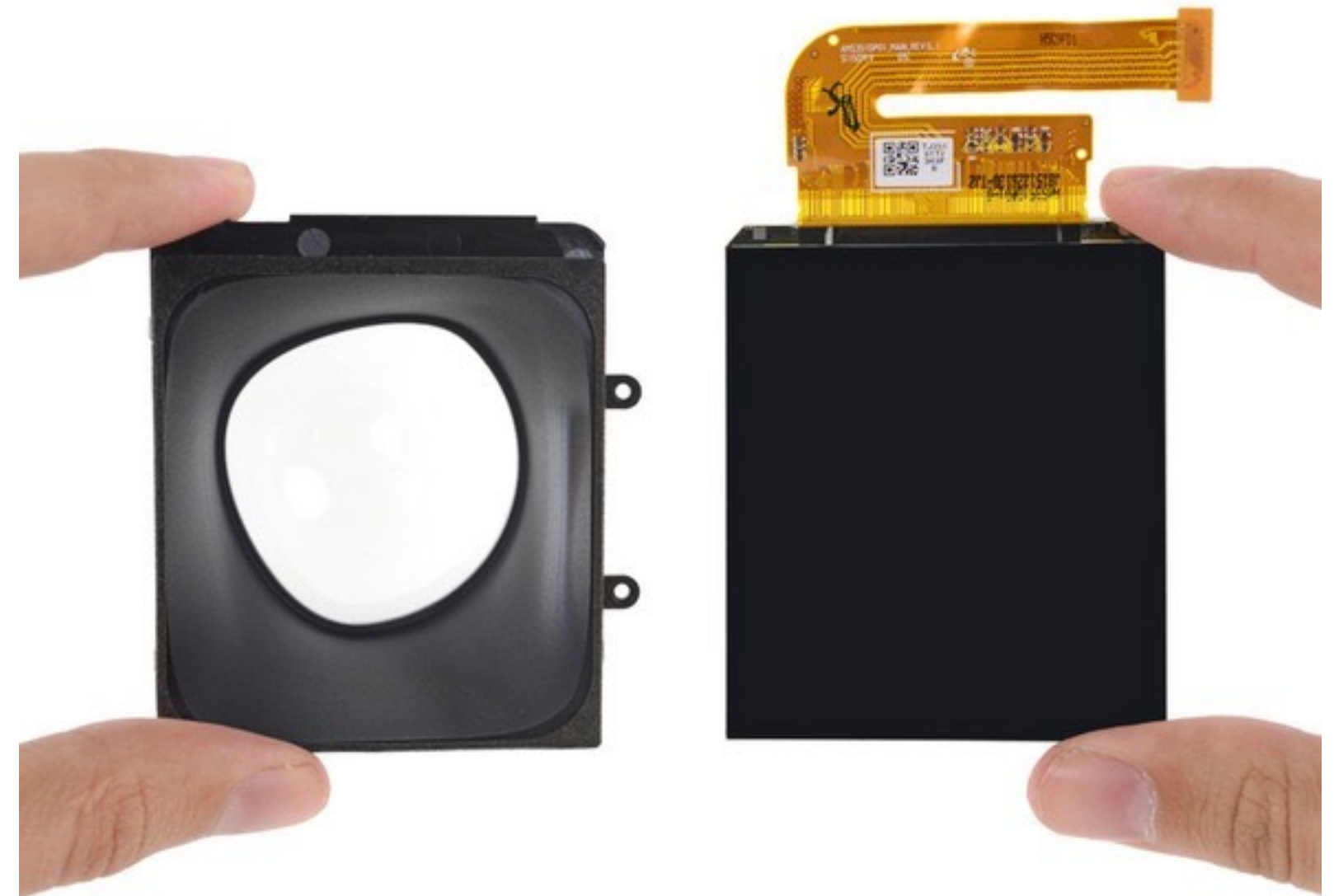


Image credit: ifixit.com



# Oculus Rift (2016)



# Oculus Rift (2016)



**Intra-ocular distance adjustment**

# Oculus Rift (2016)



# Oculus Rift (2016)



**Fresnel eyepiece lens**



**1080x1200 display, 90 Hz**

# Oculus Rift Lenses



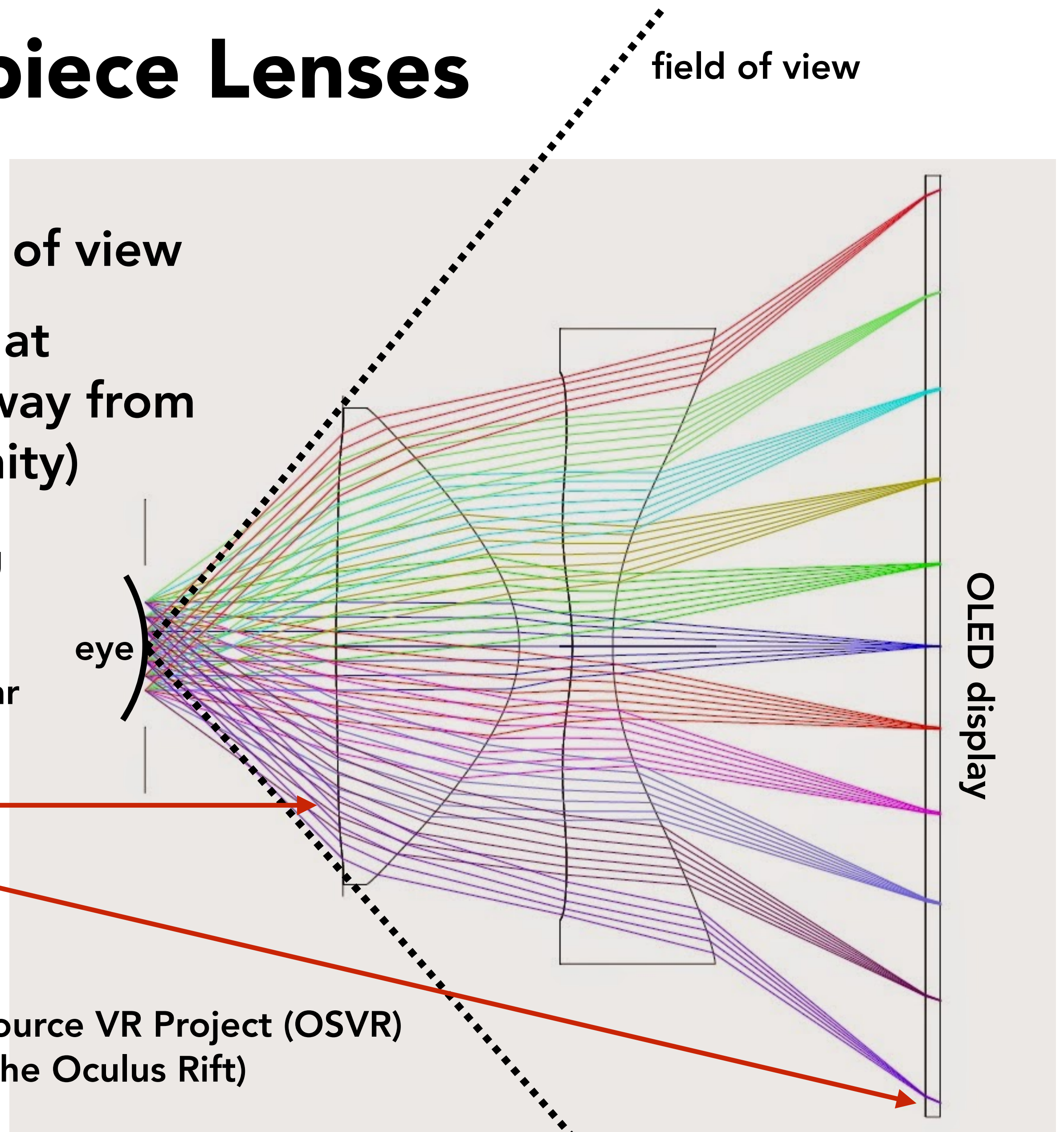
**Fresnel eyepiece lens**



# Role of Eyepiece Lenses

1. Create wide field of view
2. Place focal plane at several meters away from eye (close to infinity)

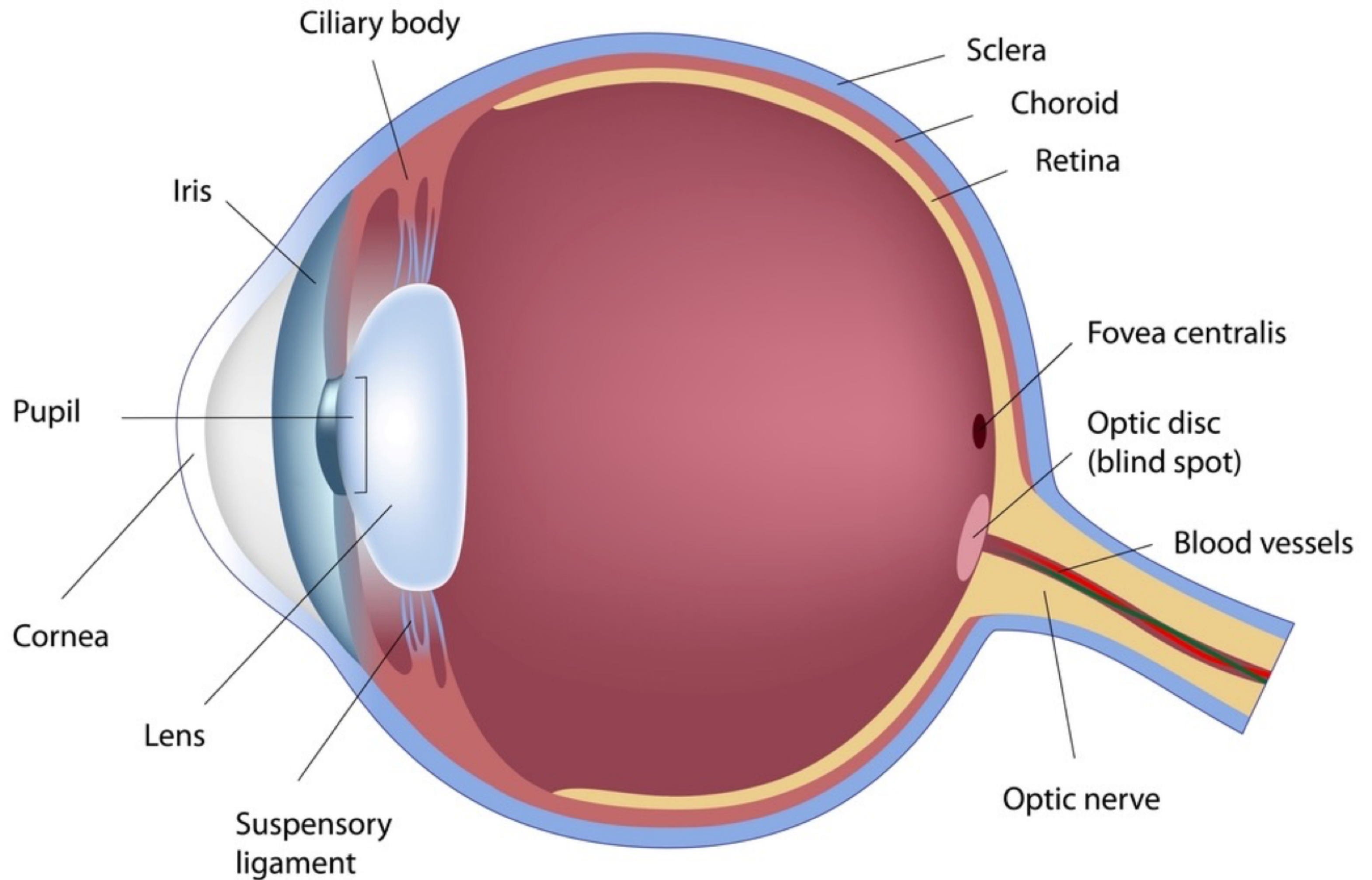
Note: parallel lines reaching eye converge to a single point on display (eye accommodates to plane near infinity)



Lens diagram from Open Source VR Project (OSVR)  
(Not the lens system from the Oculus Rift)  
<http://www.osvr.org/>

# **Display Requirements Derive From Human Perception**

# Anatomy of The Human Eye





# **Display Requirements Derive From Human Perception**

## **Example 1: Color**

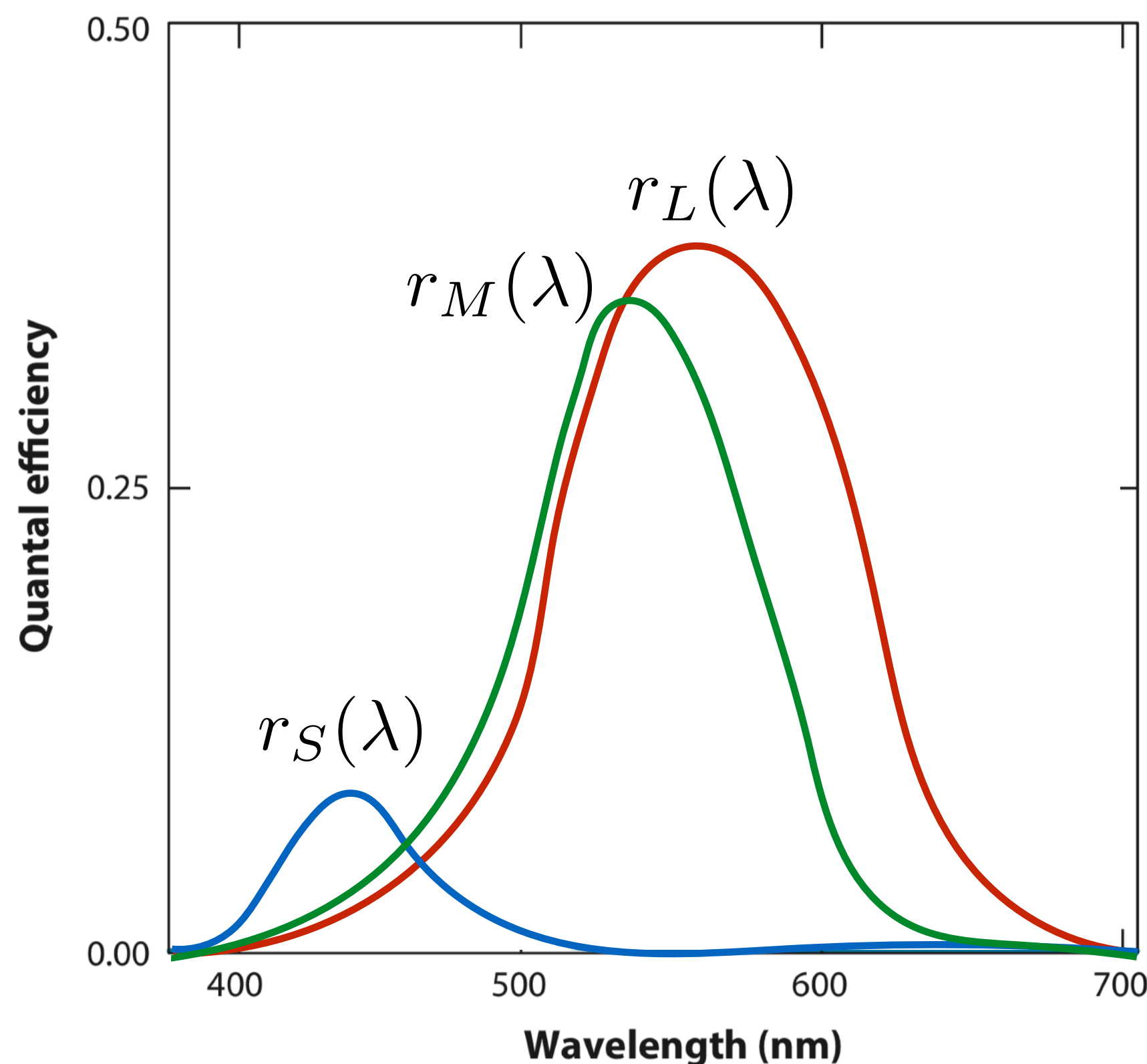
# Recall: Spectral Response of Human Cone Cells

Instead of one detector as before, now we have three detectors (S, M, L cone cells), each with a different spectral response curve

$$S = \int r_S(\lambda) s(\lambda) d\lambda$$

$$M = \int r_M(\lambda) s(\lambda) d\lambda$$

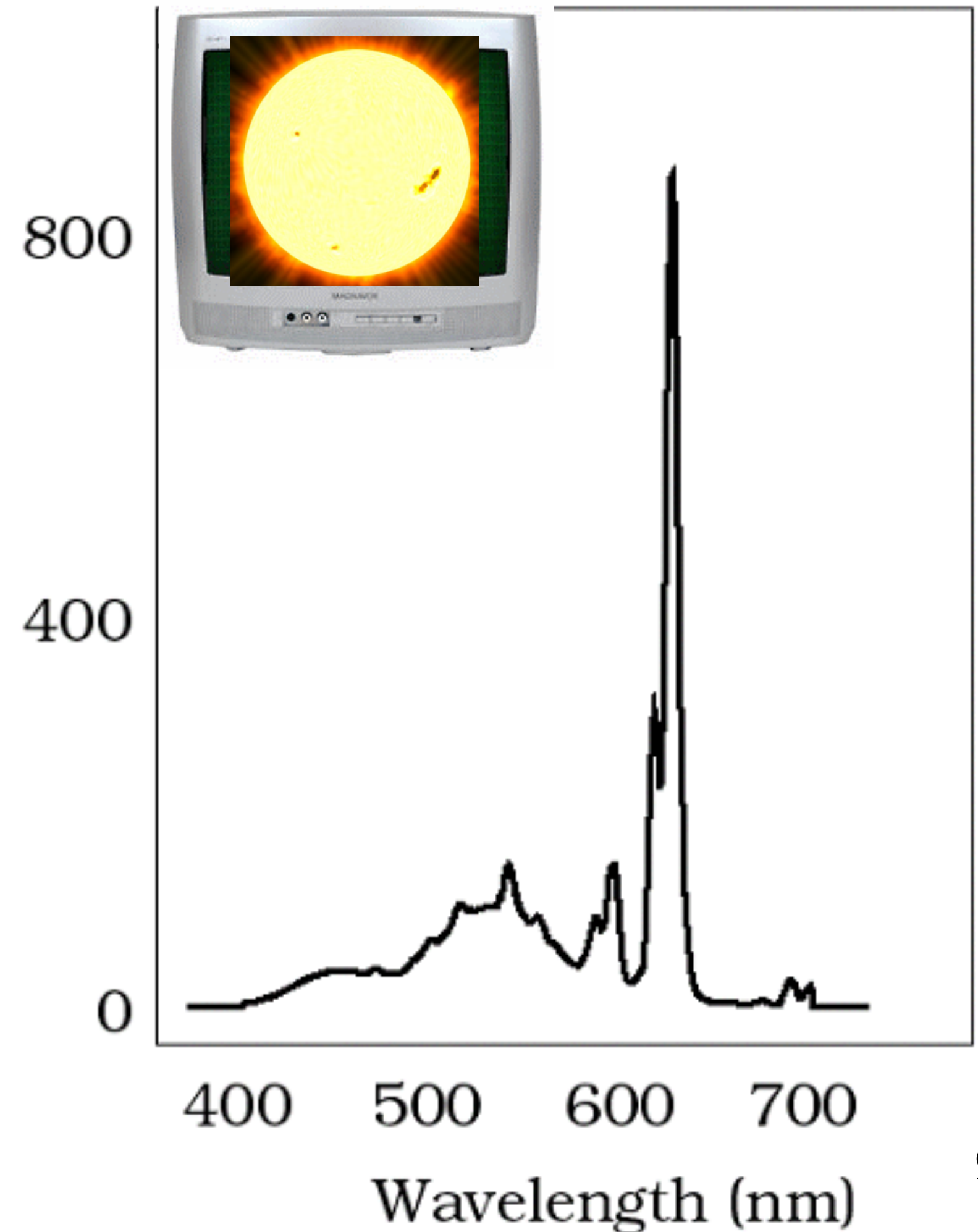
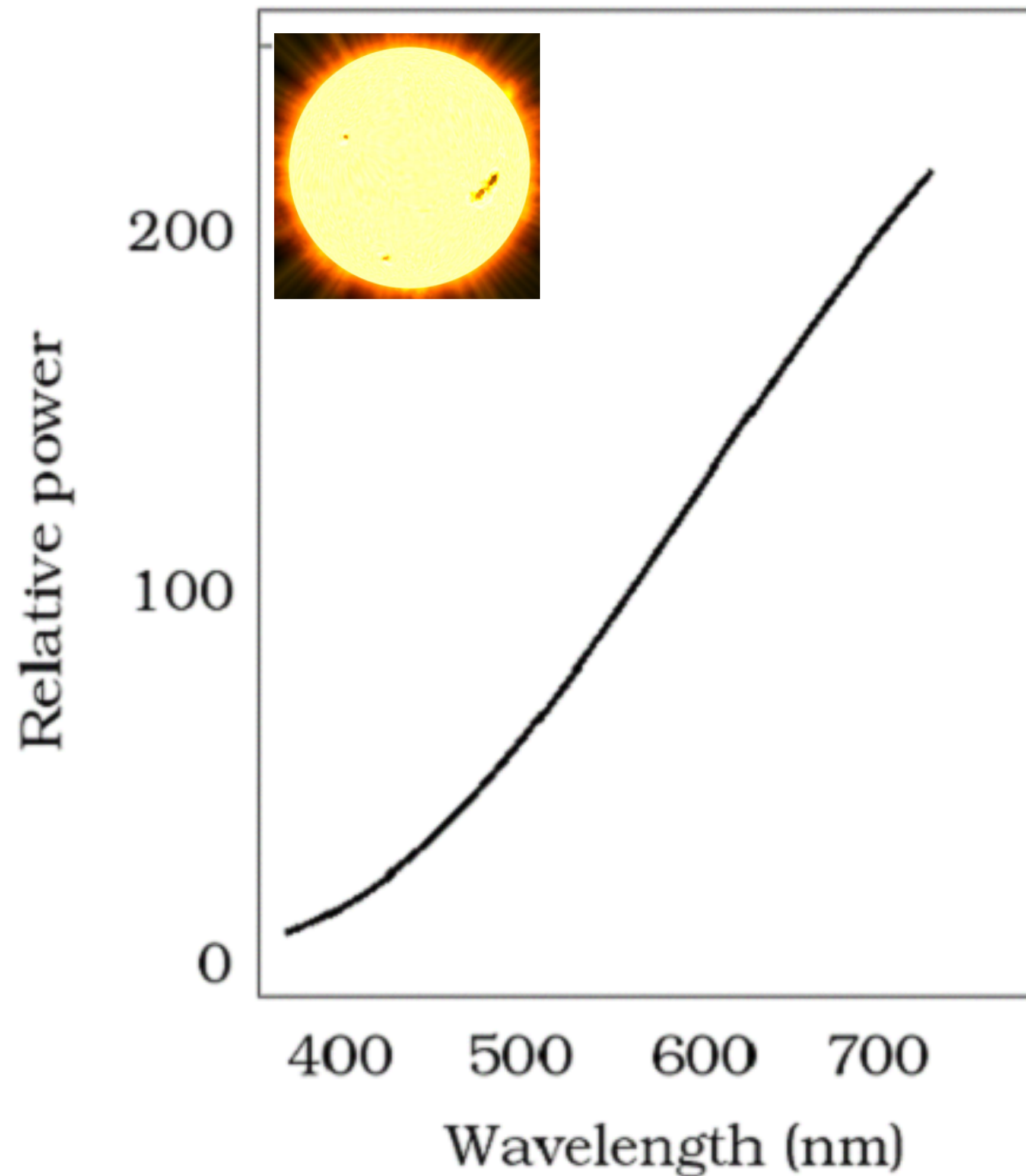
$$L = \int r_L(\lambda) s(\lambda) d\lambda$$



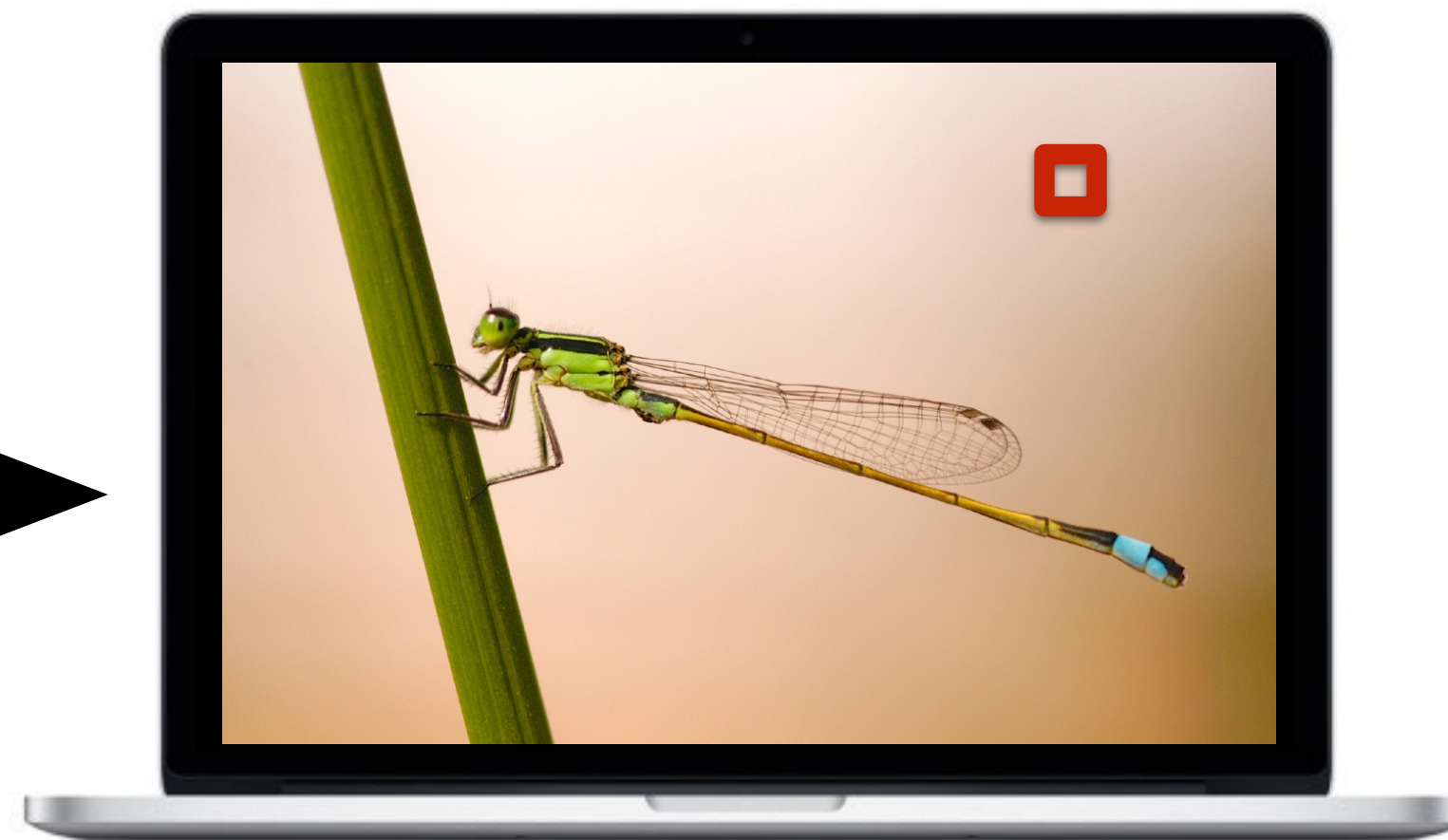
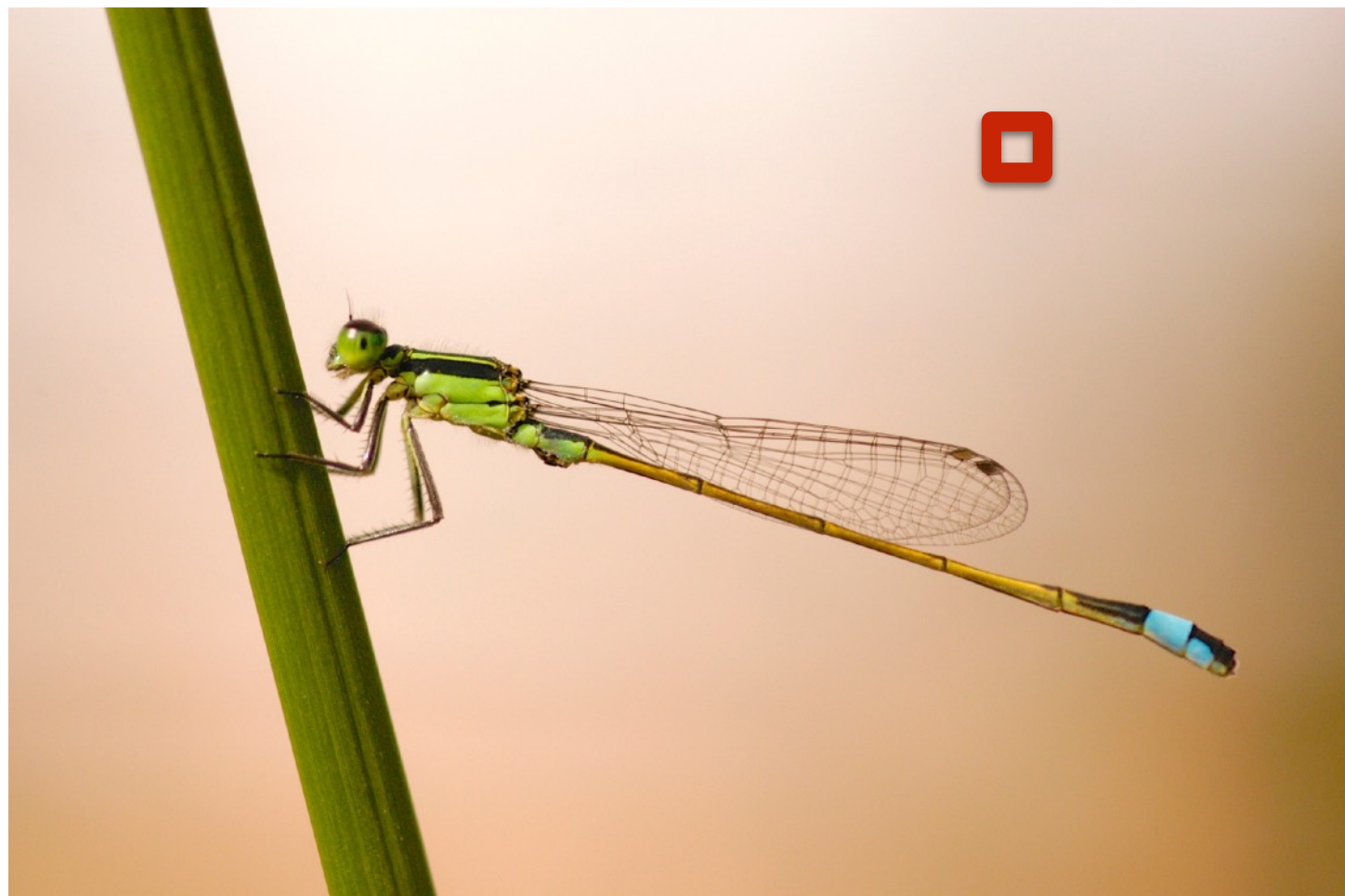
Brainard, Color and the Cone Mosaic, 2015.

# Recall: Metamerism

Color matching is an important illusion that is understood quantitatively



# Recall: Color Reproduction



Target real spectrum  $s(\lambda)$

Display outputs spectrum

$$R s_R(\lambda) + G s_G(\lambda) + B s_B(\lambda)$$

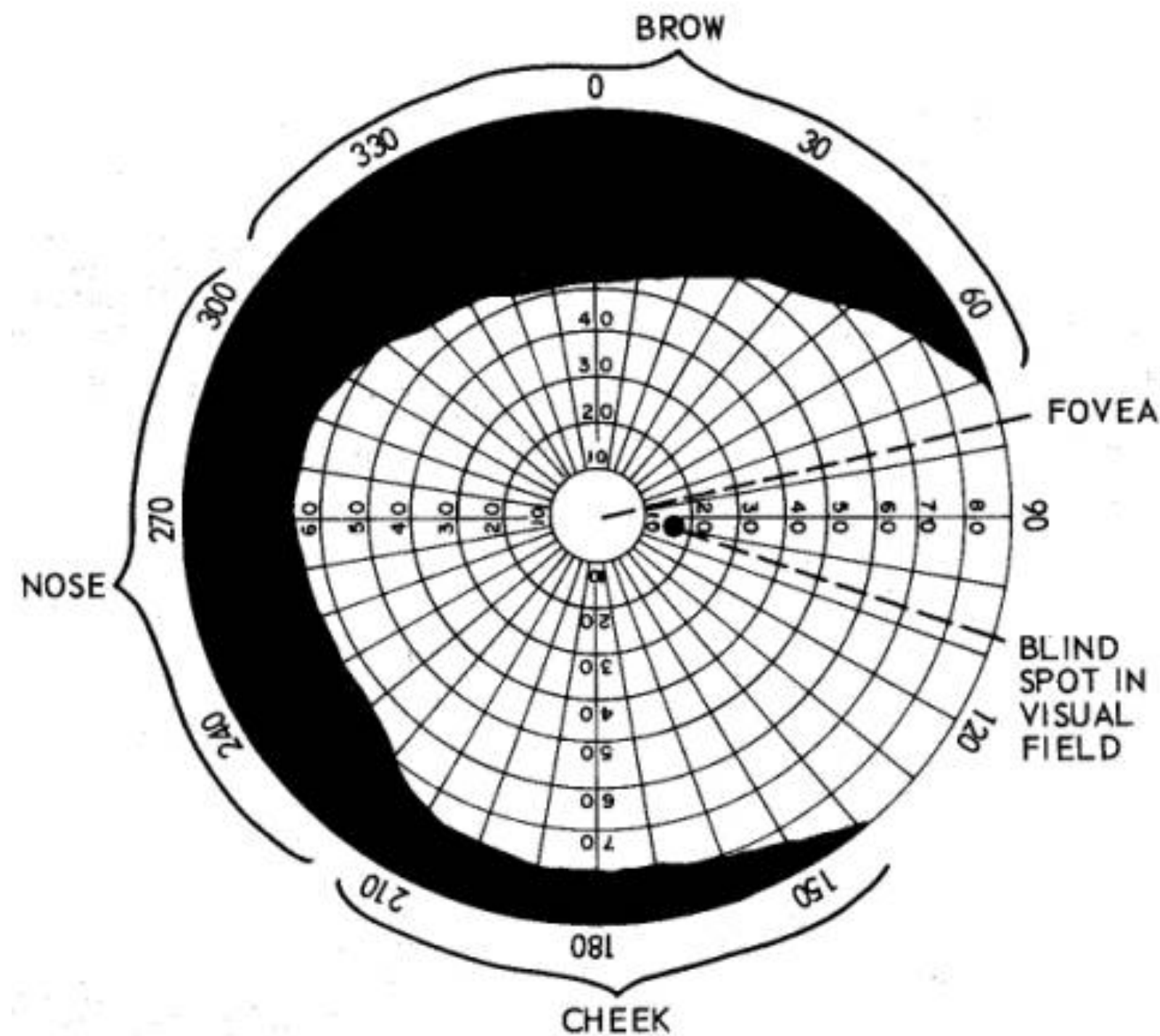
**Goal: at each pixel, choose R, G, B values for display so that the output color matches the appearance of the target color in the real world.**

# **Display Requirements Derive From Human Perception**

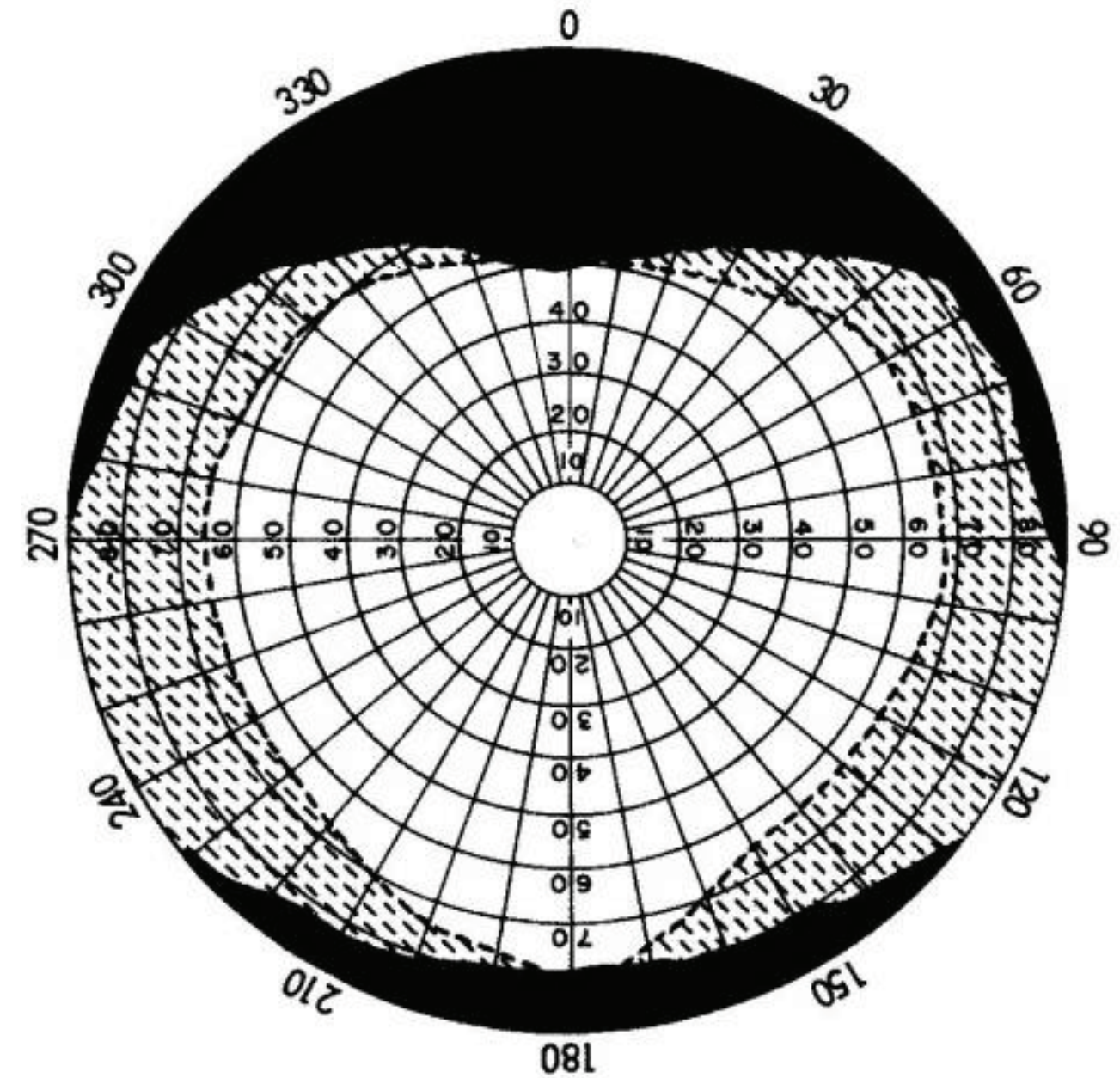
## **Example 2: Field of View & Resolution**

# Human Visual Field of View

Ruch & Fulton, 1960



monocular visual field

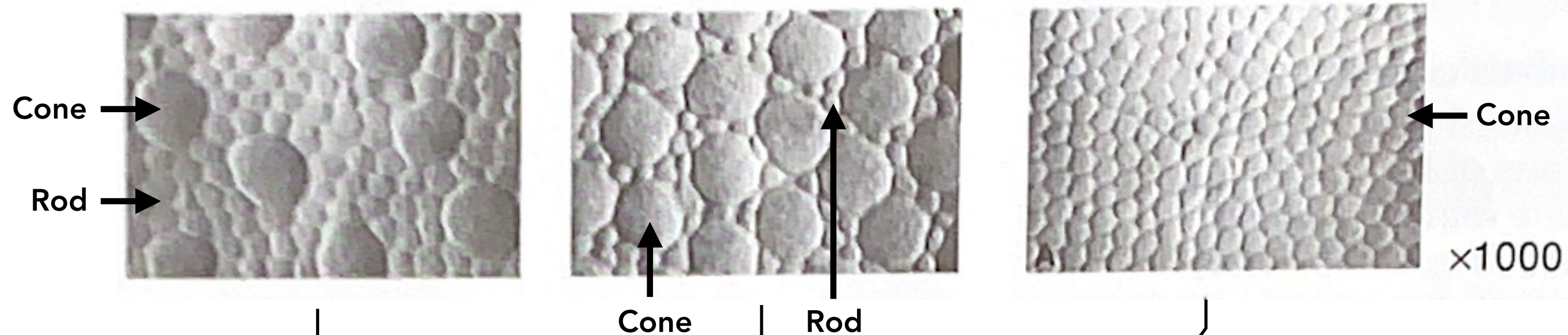


binocular visual field

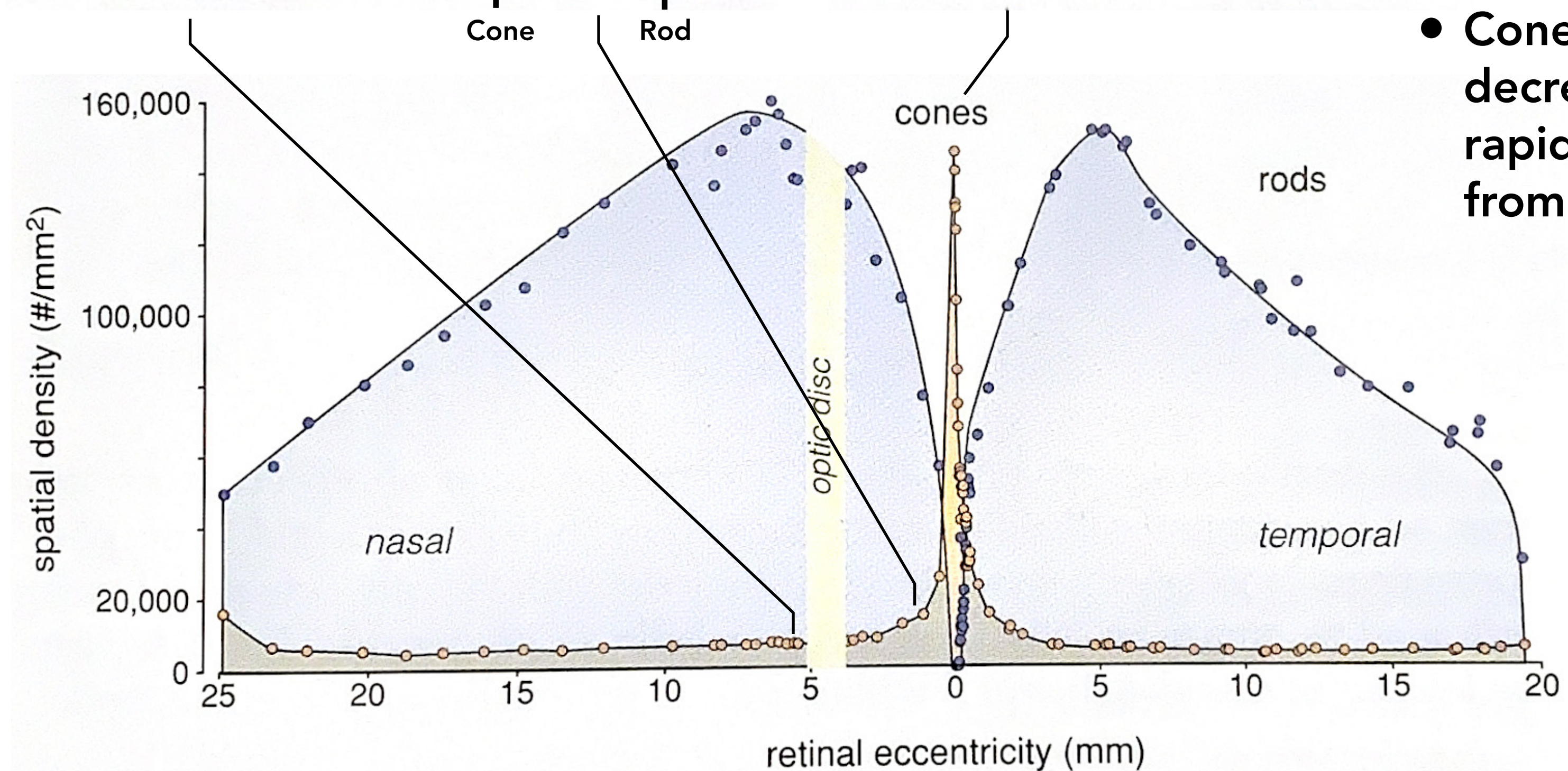
**Human: ~160° view of field per eye (~200° overall)**

**(Note: does not account for eye's ability to rotate in socket)**

# Recall: Photoreceptor Size and Distribution Across Retina



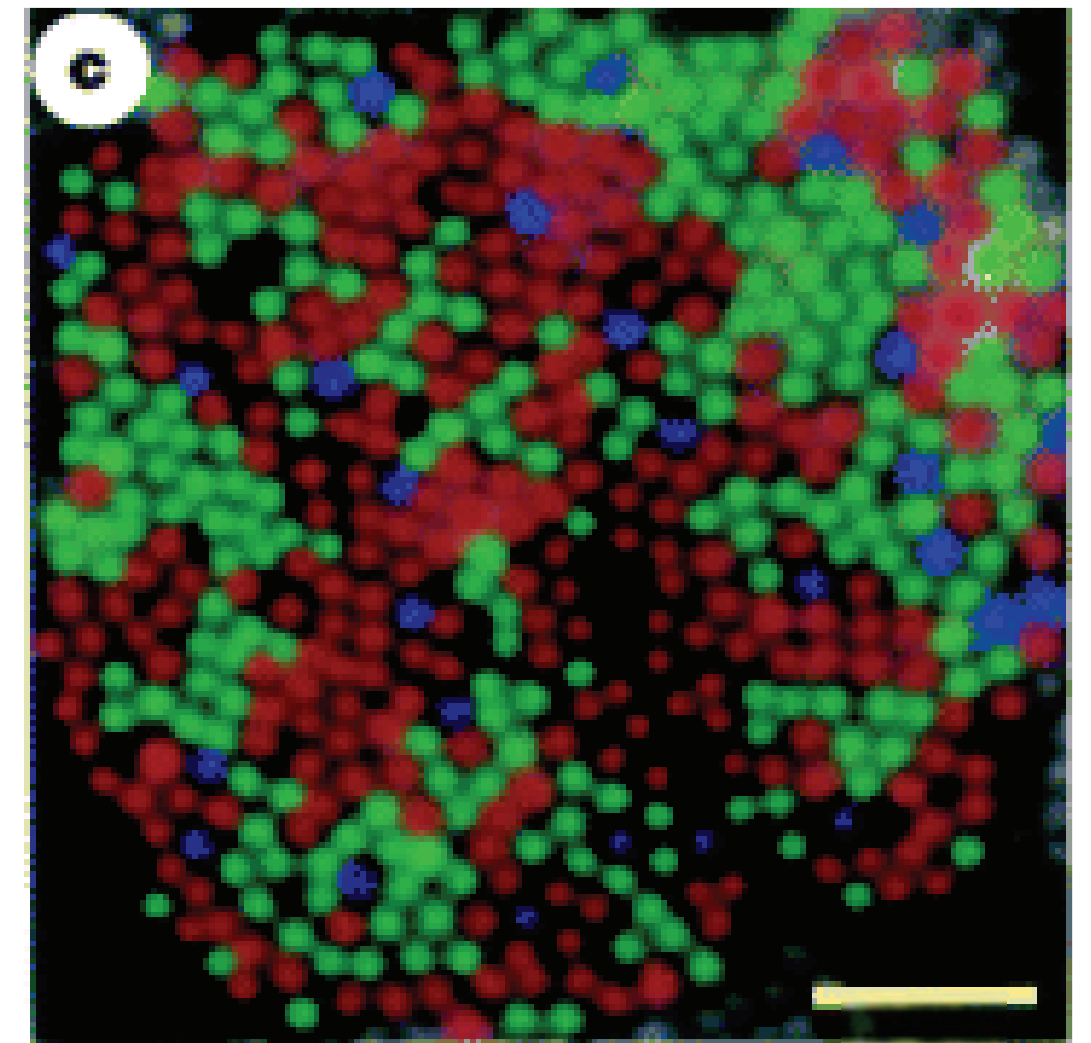
- Highest density of cones in fovea
- Cone density decreases rapidly away from fovea



after Østerberg, 1935; as modified by Rodieck, 1988

# Visual Acuity

each photoreceptor  
 $\sim$  1 arc min (1/60 of a degree)



↑  
5 arcmin visual angle



# Visual Acuity

Snellen chart

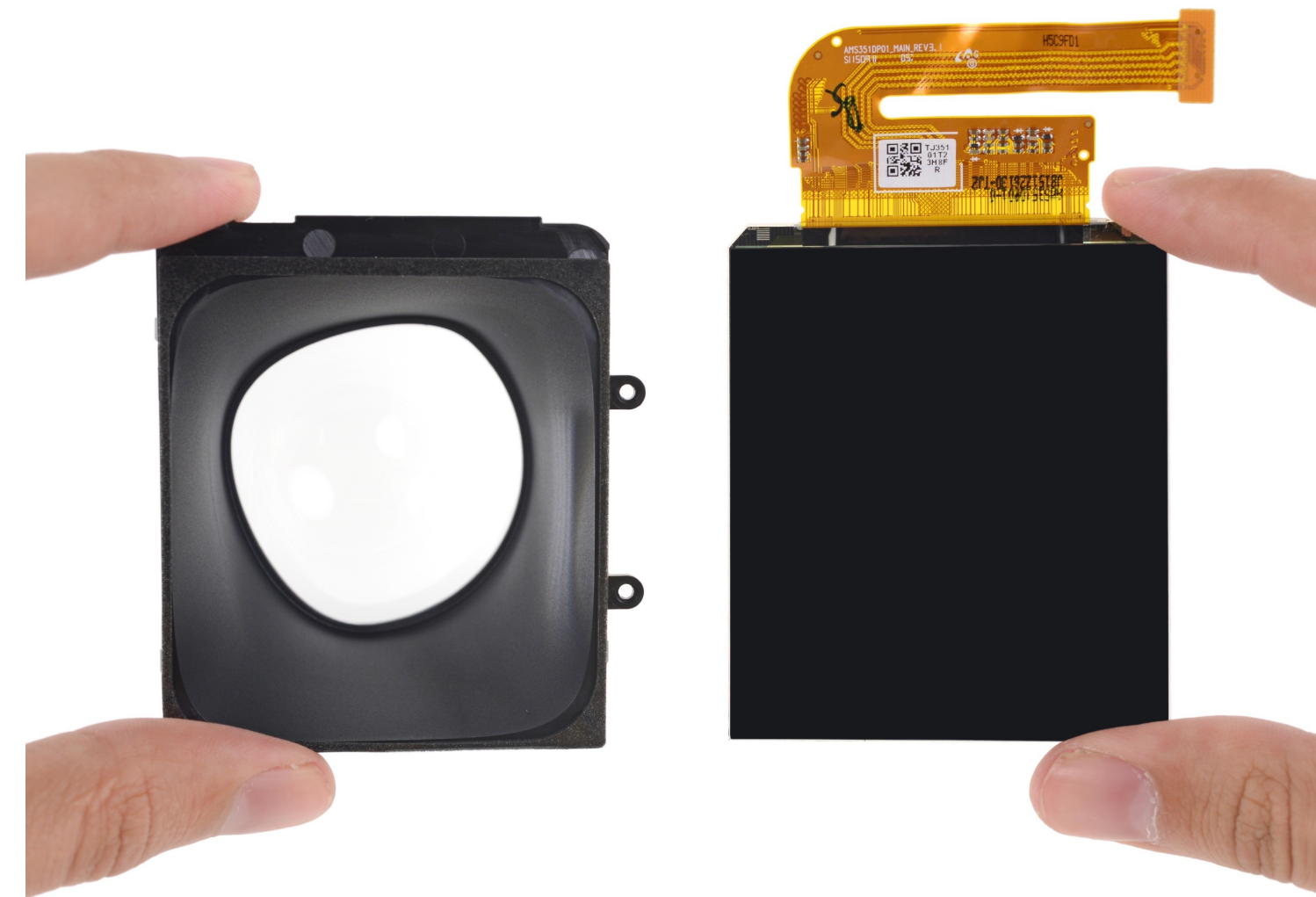
<b>E</b>	1	20/200
<b>F P</b>	2	20/100
<b>T O Z</b>	3	20/70
<b>L P E D</b>	4	20/50
<b>P E C F D</b>	5	20/40
<b>E D F C Z P</b>	6	20/30
<b>F E L O P Z D</b>	7	20/25
<b>D E F P O T E C</b>	8	20/20
<b>L E F O D P C T</b>	9	
<b>F D P L T C E O</b>	10	
<b>F E Z O L C F T D</b>	11	

← characters are 5 arc min, need to resolve 1 arc min to read

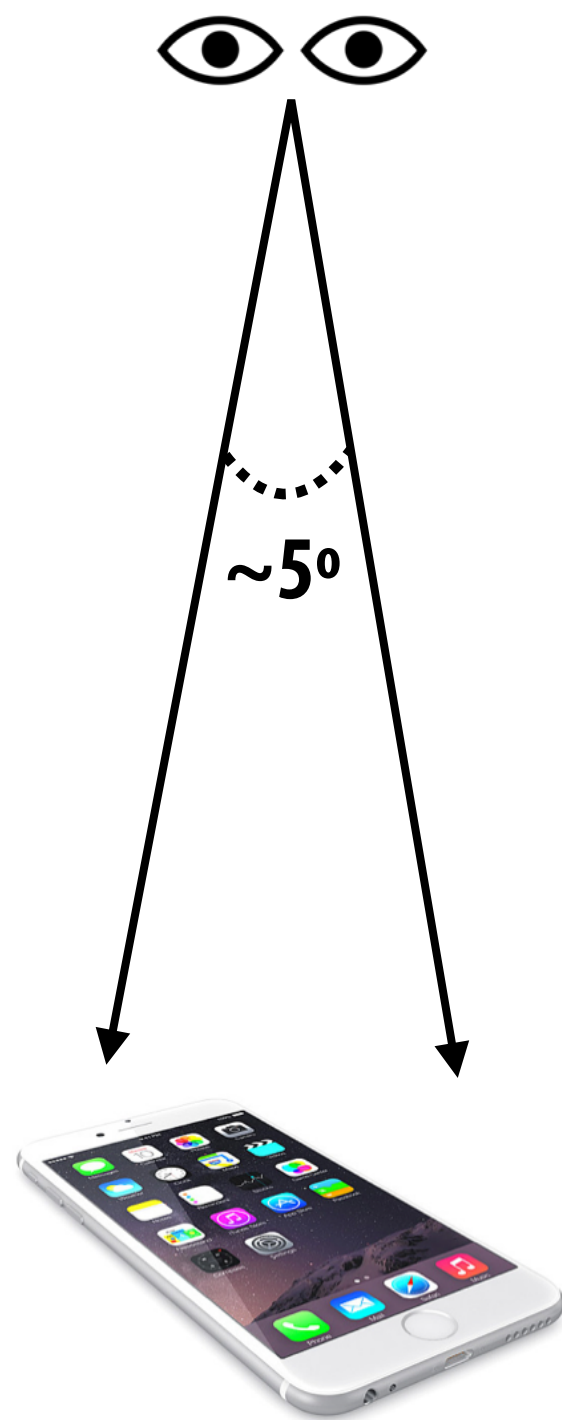
# Current VR Headset Field of View and Resolution

## Example: HTC Vive Pro 2

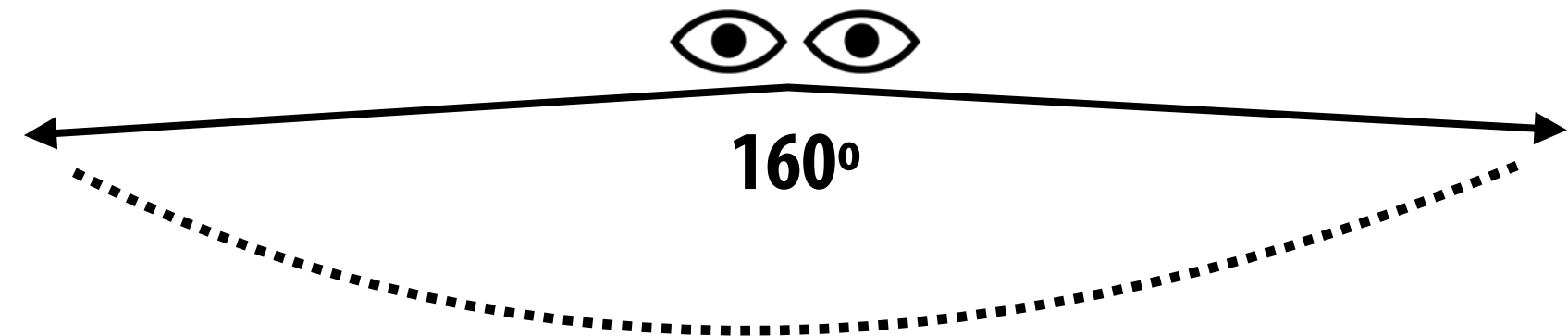
- Field of view: approximately  $100^\circ$  per eye
- Resolution:  $2448 \times 2448$  (6MP) pixel display
- About 24 pixels per degree (as opposed to  $\sim 60$  samples for 20/20 vision)
- [Note: VR headsets exist up to  $2880 \times 2720$  (7.8MP) now]



# A VR Display at Human Visual Acuity



iPhone 6: 4.7 in "retina" display:  
1.3 MPixel  
326 ppi → ~60 ppd



Human: ~160° view of field per eye (~200° overall)  
(Note: does not account for eye's ability to rotate in socket)

Future "retina" VR display:  
~ 8K x 8K display per eye (50 ppd)  
= 128 MPixel

Strongly suggests need for eye tracking and  
foveated rendering (eye can only perceive  
detail in 5° region about gaze point)

# **Display Requirements Derive From Human Perception**

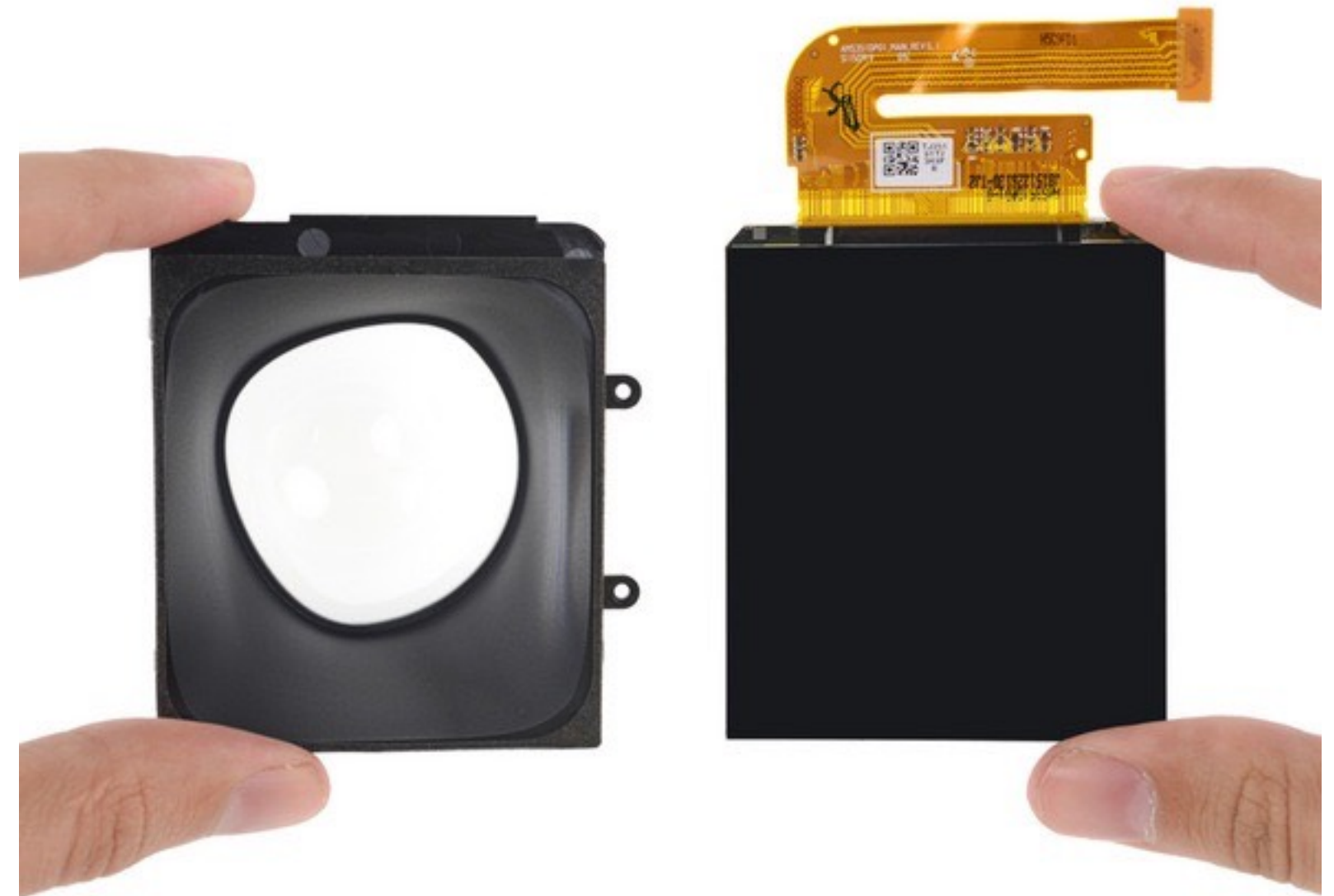
**Example 3: Binocular Stereo and  
Eye Focus ("Accommodation")**

# Two Eyes: Two Views



**Charles Wheatstone stereoscope, 1838**

# Recall: Current VR HMD Optical Design



# Stereo Vergence

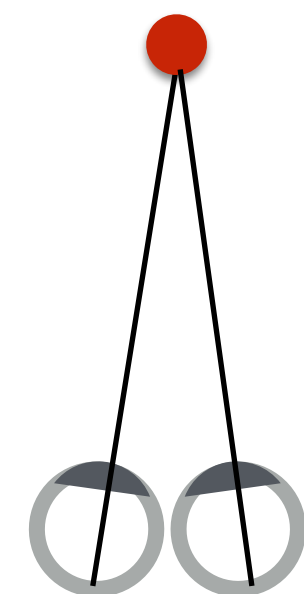
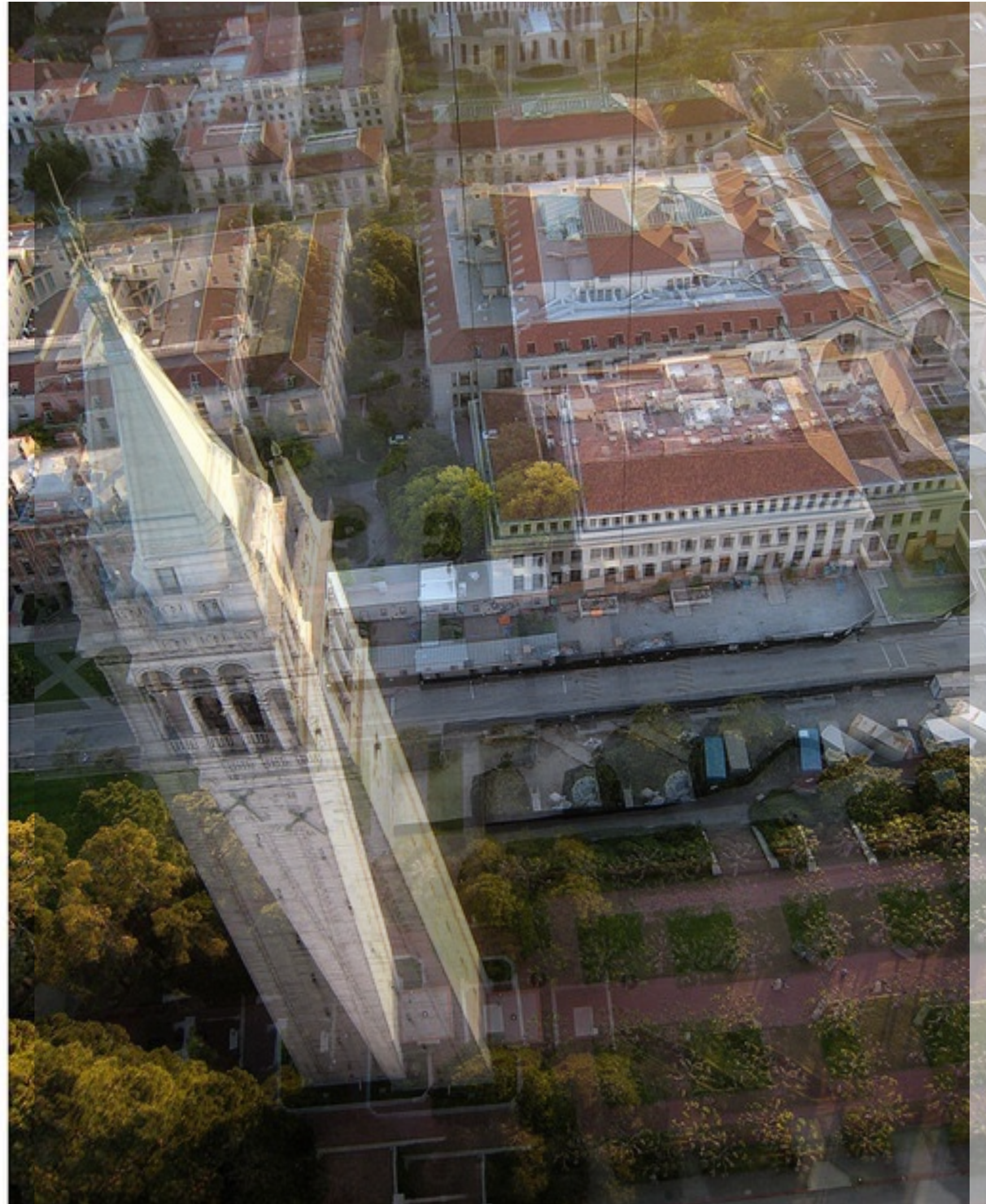


Left-eye perspective



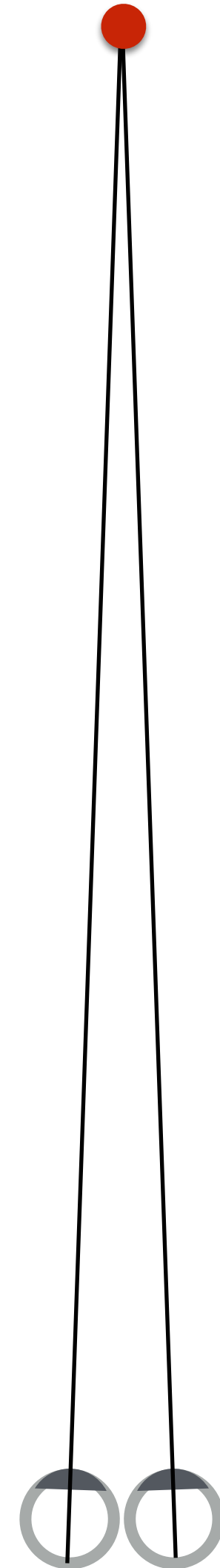
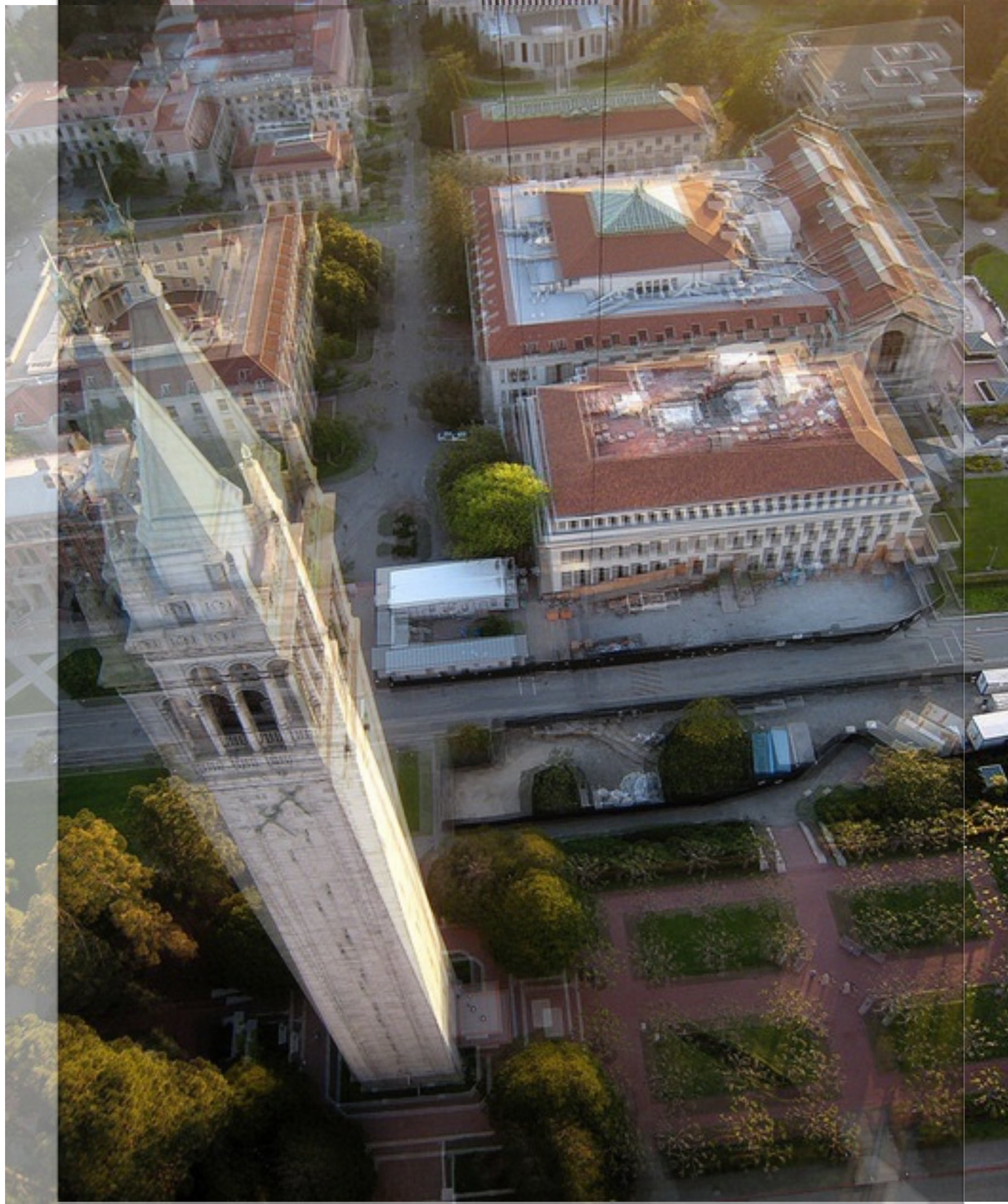
Right-eye perspective

# Stereo Vergence





# Stereo Vergence

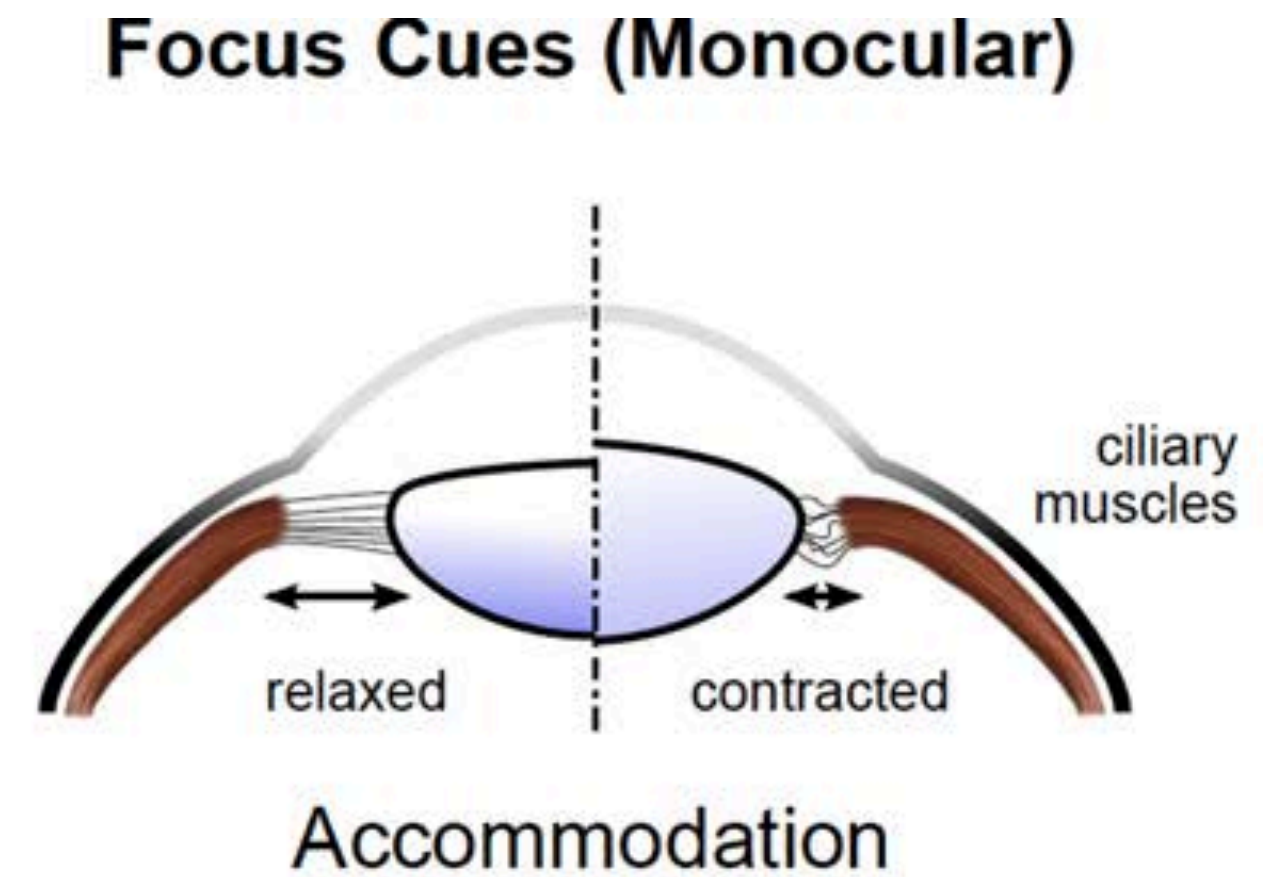
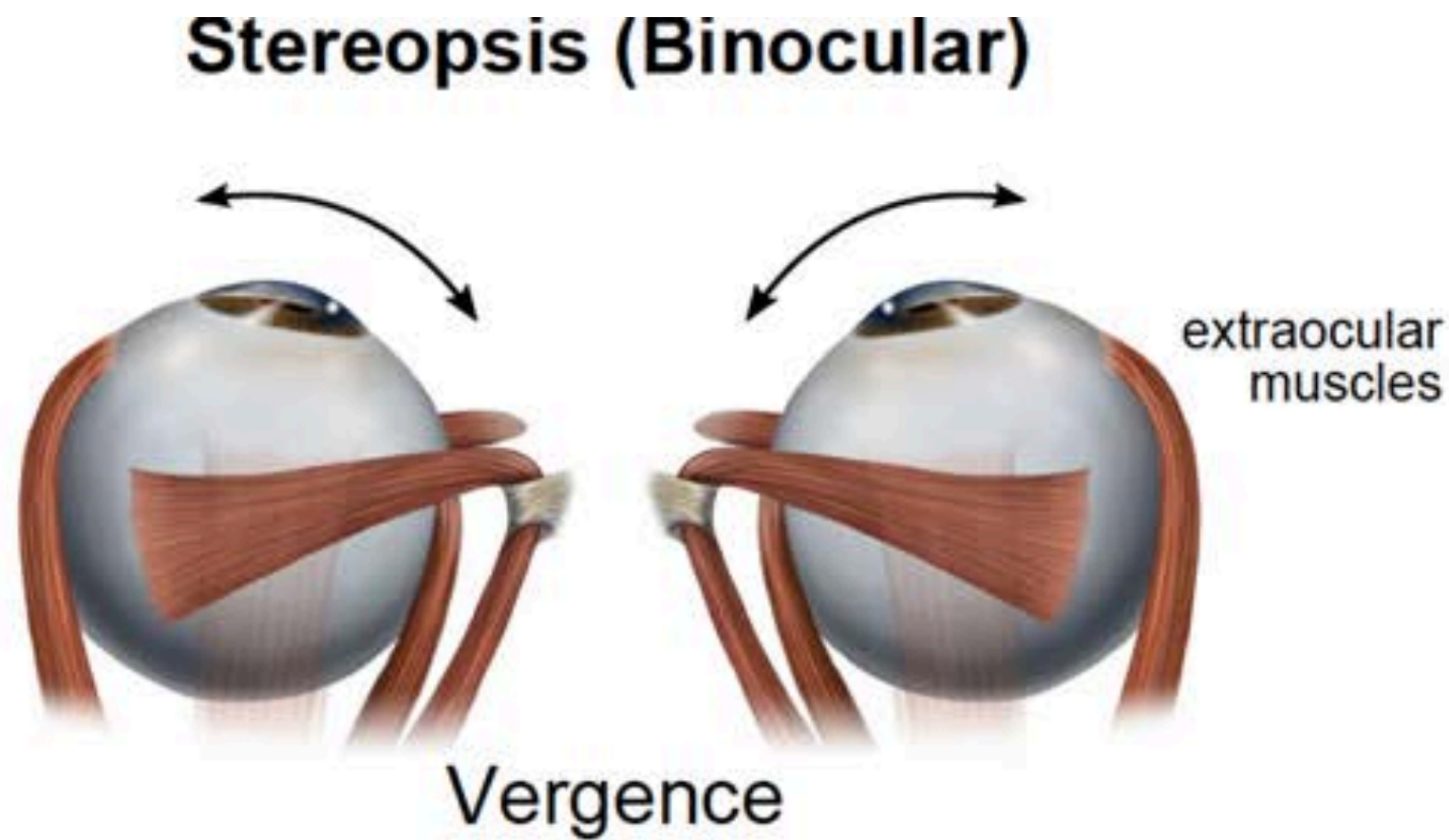


# Stereo

- **Passive (no tracking of eyes)**
- **Present each eye with perspective view corresponding to that eye's location relative to the other eye**
- **Eyes will con(verge) by rotating physically in sockets in order to bring closer and further objects into physical alignment on retina**

# Human Eye Muscles and Optical Controls

Oculomotor Cue



Visual Cue

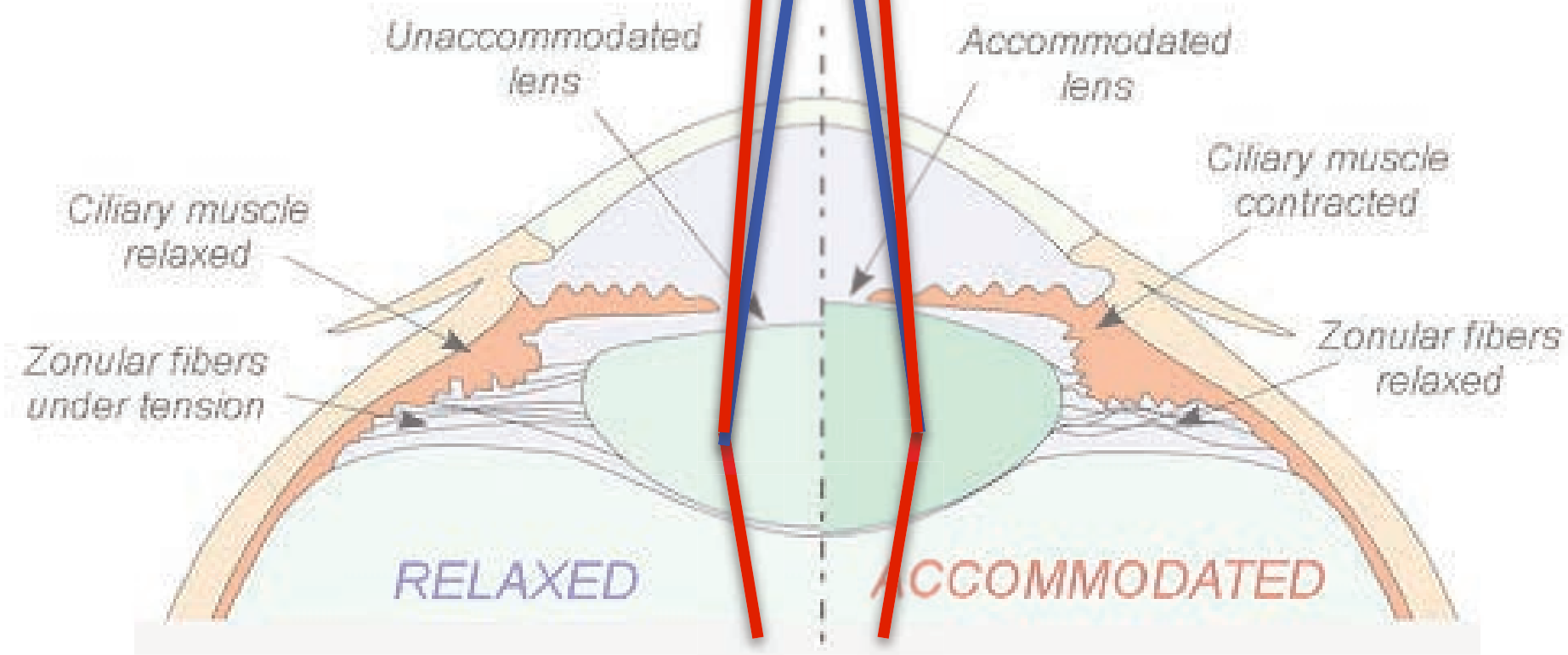


# Human Eye Muscles and Optical Controls

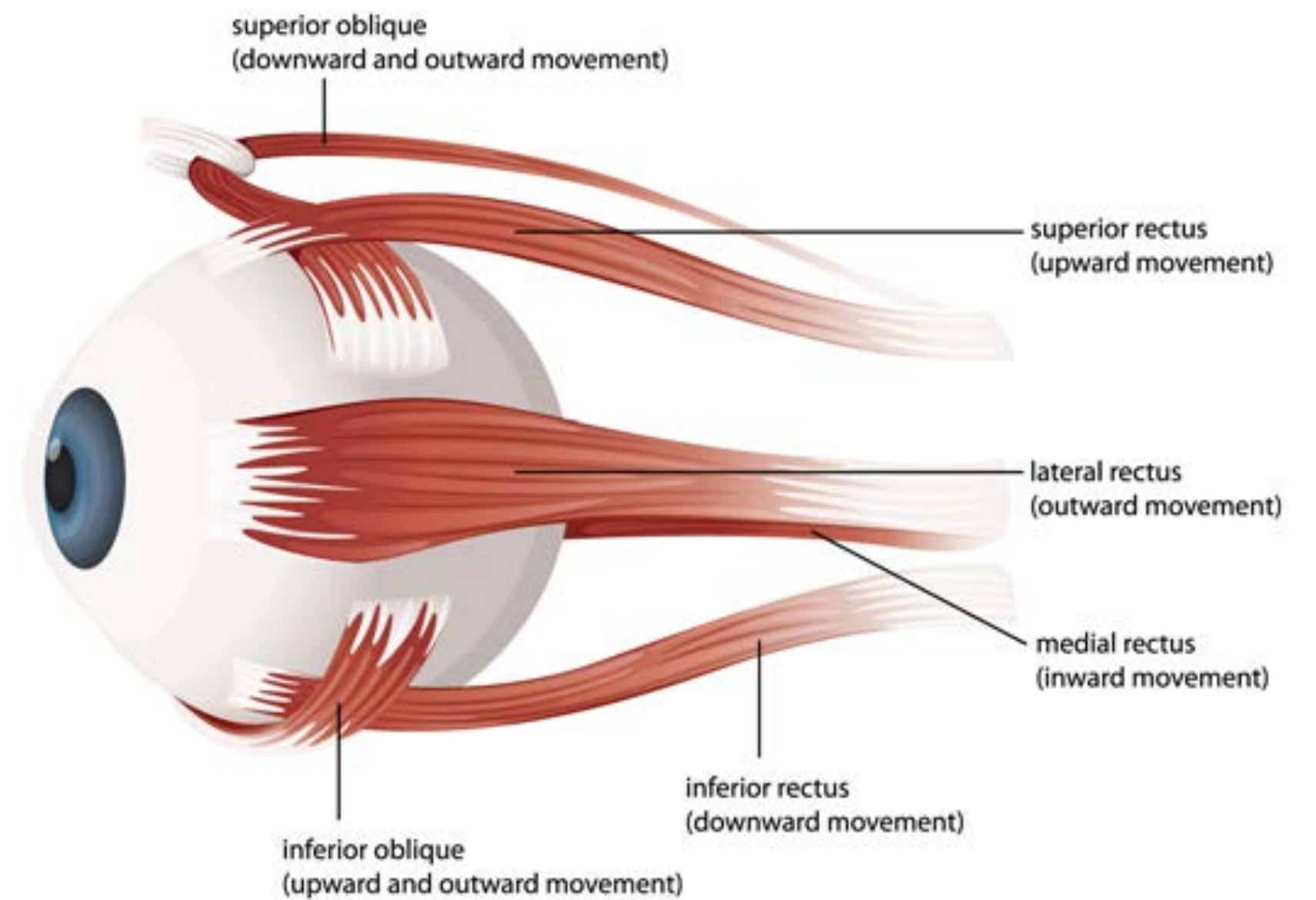
far focus →

16 years: ~8cm to ∞  
50 years: ~50cm to ∞ (mostly irrelevant)

near focus →



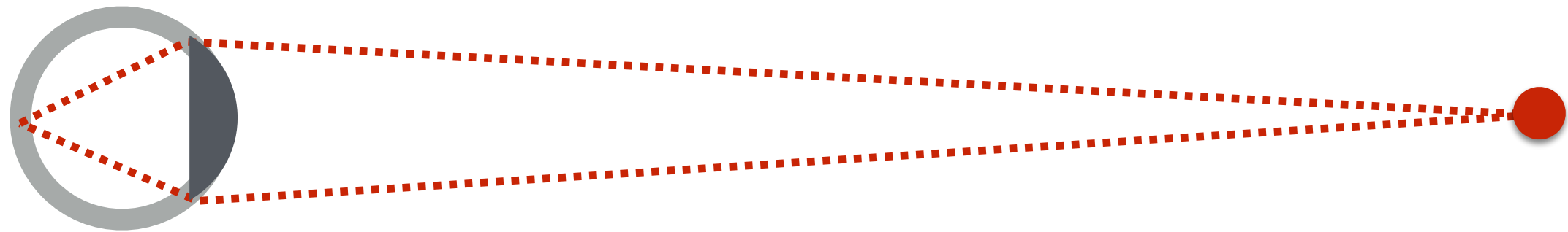
adithyakiran.wordpress.com



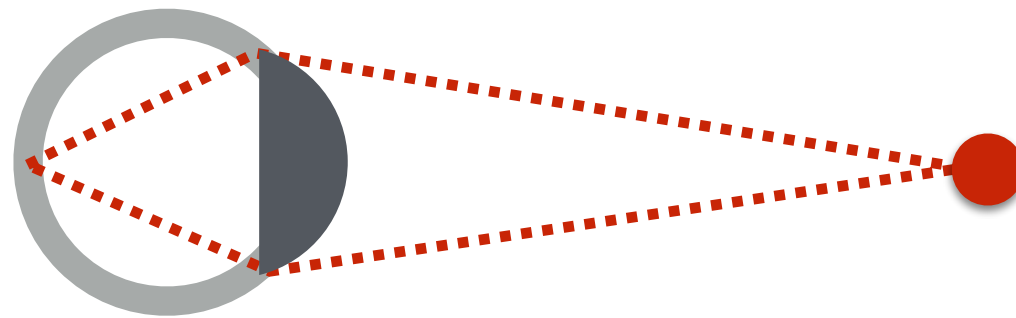
# Accommodation and Vergence

**Accommodation:** changing the optical power of the eye (lens) to focus at different distances

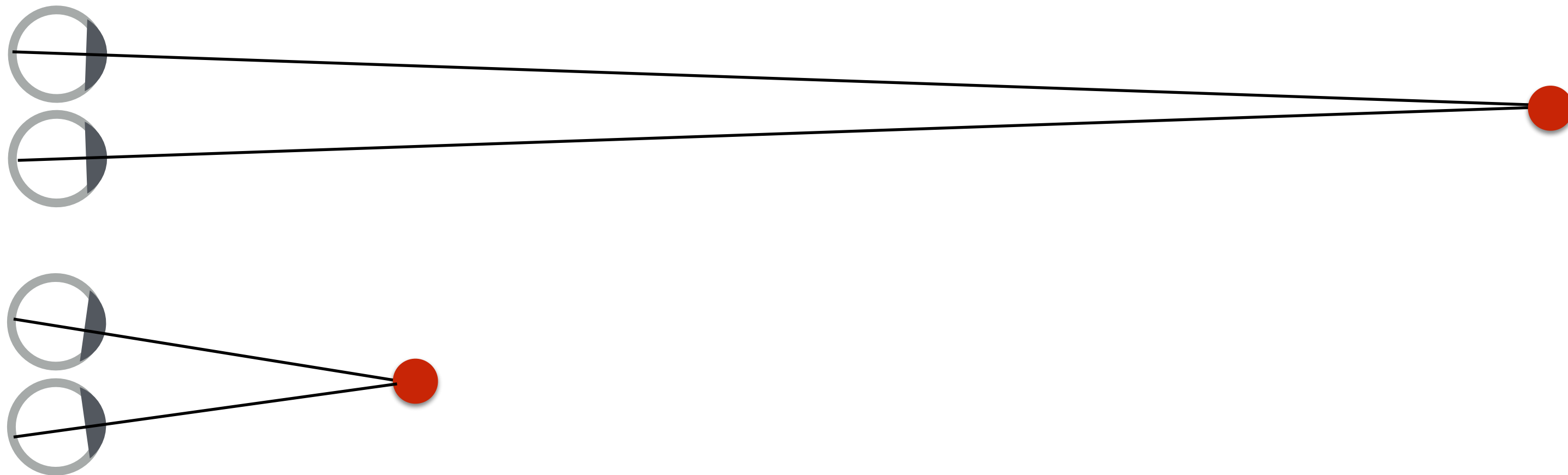
**Eye accommodated to focus on a distant object**



**Eye accommodated to focus on a nearby object**



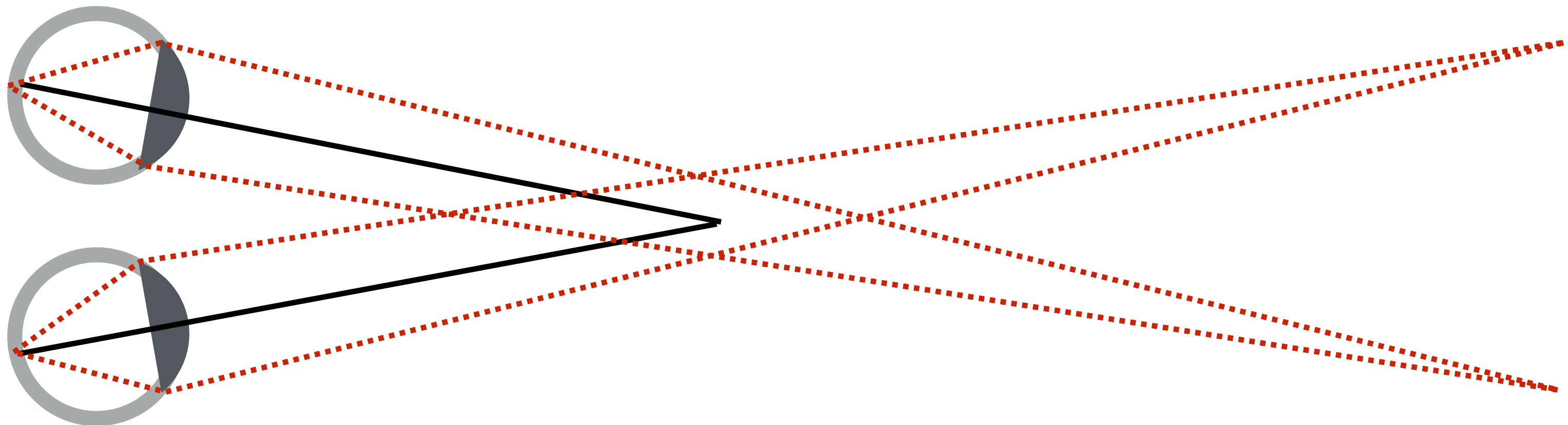
**Vergence:** rotation of the eye in its socket to ensure projection of object is centered on the retina



# Accommodation – Vergence Conflict

Given design of current VR displays, consider what happens when objects are up-close to eye in virtual scene

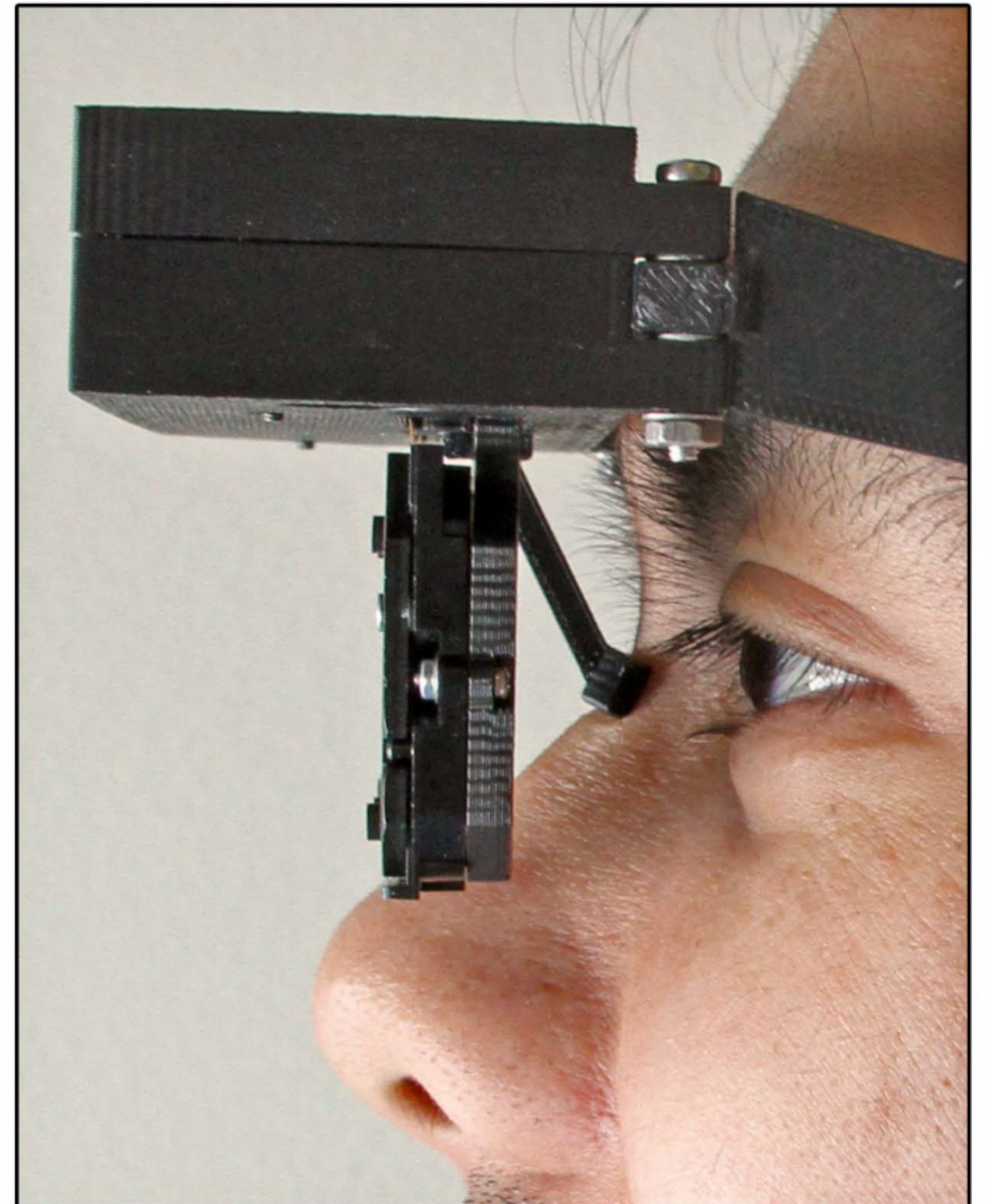
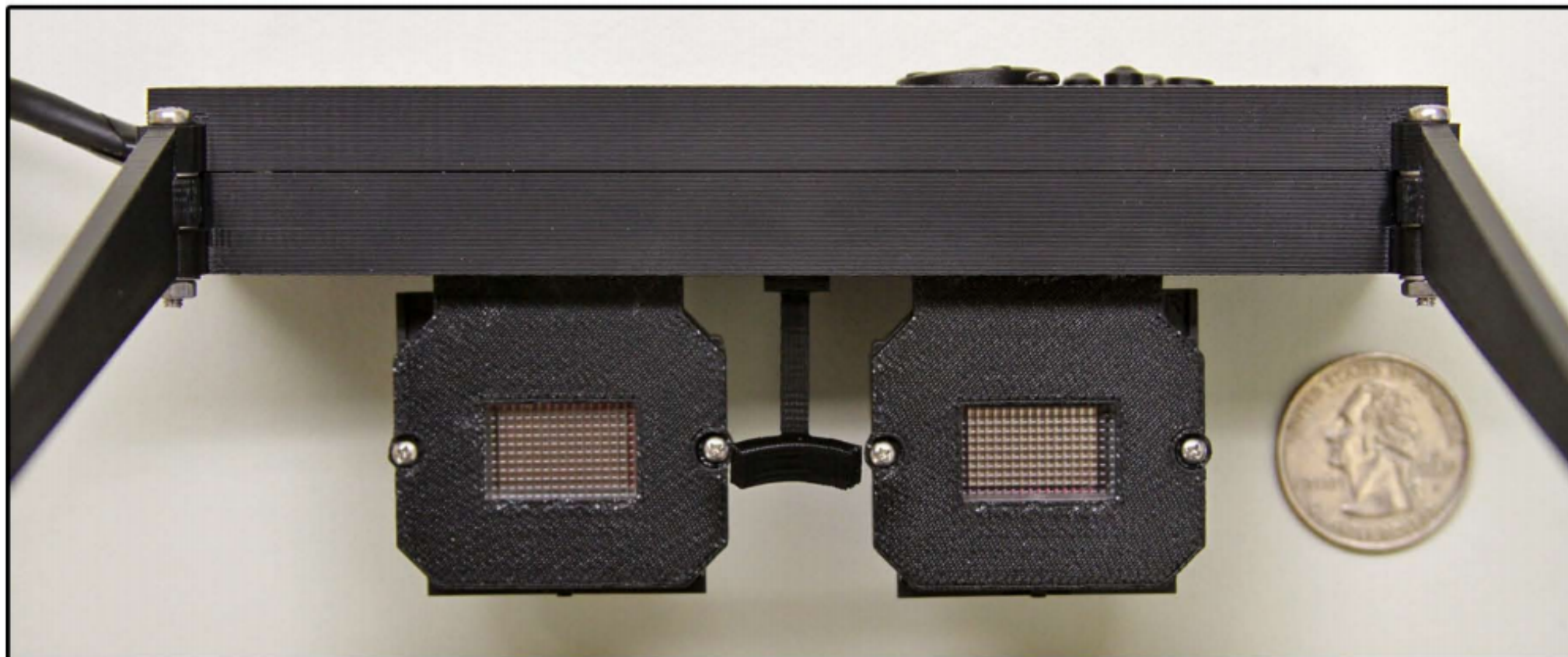
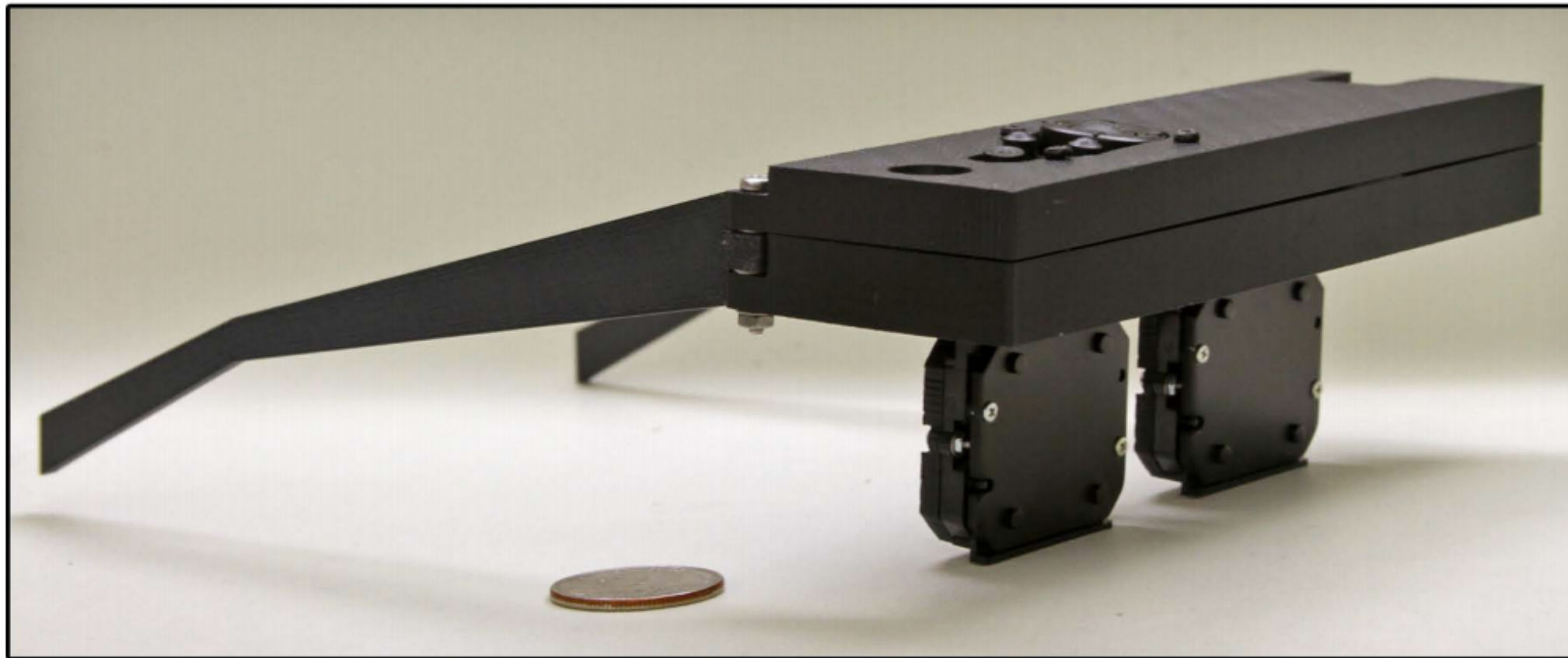
- Eyes must remain accommodated to far distance (otherwise image on screen won't be in focus)
- But eyes must converge in attempt to fuse stereoscopic images of object up close
- Brain receives conflicting depth clues... (discomfort, fatigue, nausea)



This problem stems from nature of display design. If you could just make a display that emits the light field that would be produced by a virtual scene, then you could avoid the accommodation - vergence conflict...

# Aside: Research on Near-Eye Light Field Displays

Goal: recreate light field in front of eye



Lanman and Luebke, SIGGRAPH Asia 2013.

# **Display Requirements Derive From Human Perception**

**Example #4: Motion Parallax from  
Eye Motion**



# Google Cardboard: Tracking Using Headset Camera

Tracking uses gyro / rear-facing camera to estimate user's viewpoint

- 2D rotation tracking generally works well
- 3D positional tracking a challenge in general environments



# Environment-Supported Vision-Based Tracking?



Image credit: gizmodo.com

**Early VR test room at Valve, with markers positioned throughout environment**

# Oculus Rift IR LED Tracking System



**Oculus Rift + IR LED sensor**

# Oculus Rift IR LED Tracking Hardware



Photo taken with IR-sensitive camera

<https://www.ifixit.com/Teardown/Oculus+Rift+Constellation+Teardown/61128>

# Oculus Rift LED Tracking System (DK2)



External 60Hz IR Camera

Headset contains:

40 IR LEDs  
Gyro +  
accelerometer  
(1000Hz)



Photo taken with IR-sensitive camera (IR LEDs not visible in real life)

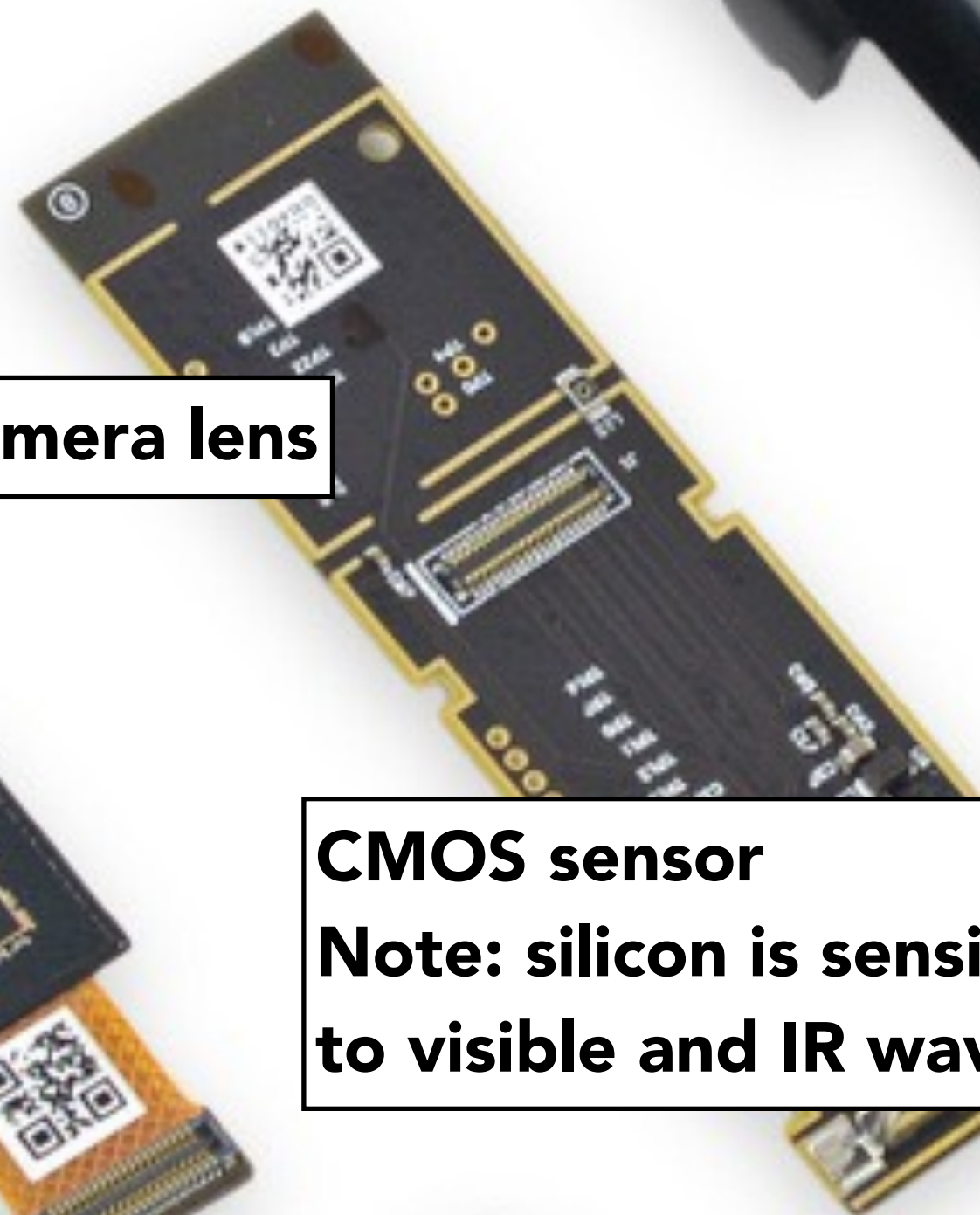
# Oculus Rift IR Camera



**IR filter**  
(blocks visible spectrum)



**Camera lens**



**CMOS sensor**  
Note: silicon is sensitive  
to visible and IR wavelengths

# Recall: Passive Optical Motion Capture



**Retroreflective markers attached to subject**

**IR illumination and cameras**

- Markers on subject
- Positions by triangulation from multiple cameras
- 8+ cameras, 240 Hz, occlusions are difficult

**Slide credit: Steve Marschner**

# Active Optical Motion Capture

- Each LED marker emits unique blinking pattern (ID)
- Reduce marker ambiguities / unintended swapping
- Have some lag to acquire marker IDs



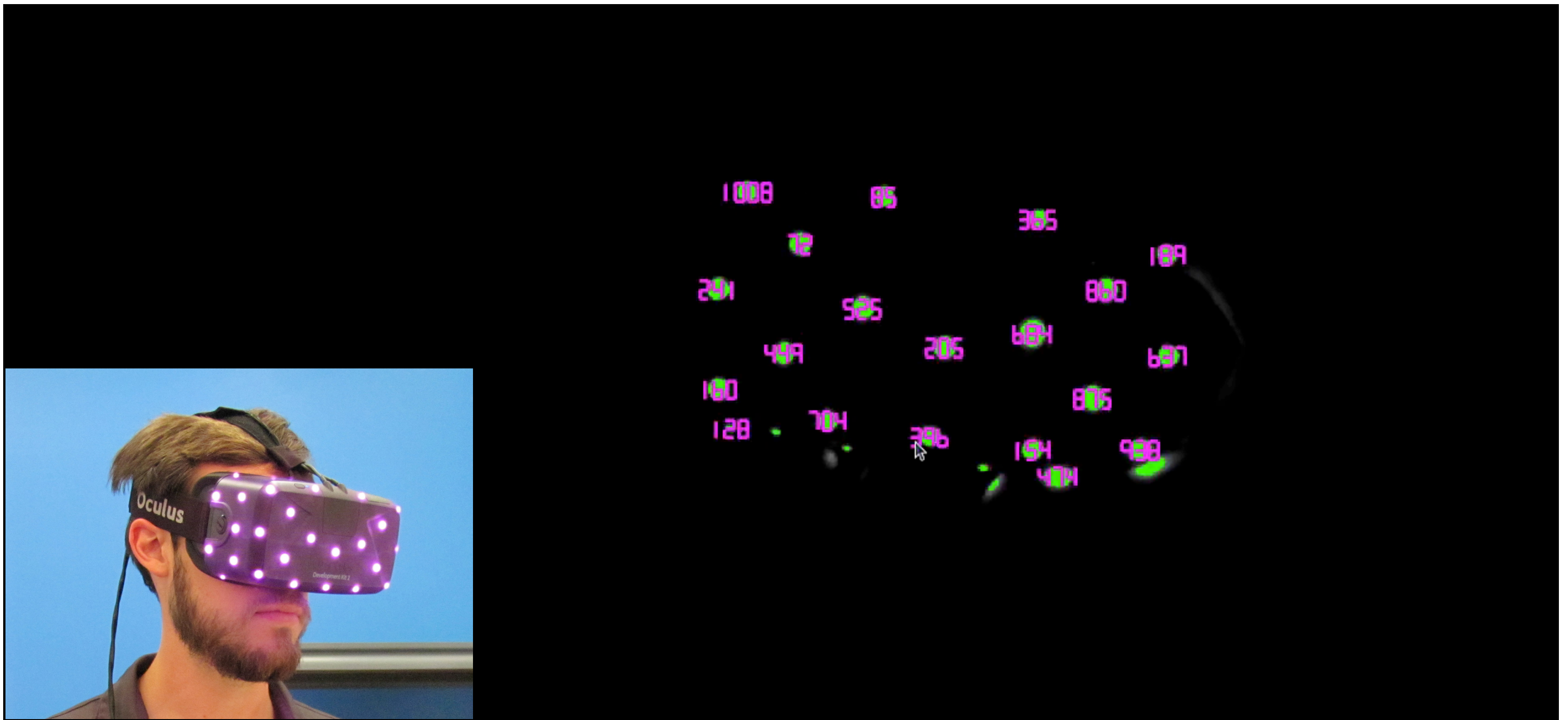
Phoenix Technology



Phase Space



# Oculus Rift Uses Active Marker Motion Capture



Credit: Oliver Kreylos, <https://www.youtube.com/watch?v=O7Dt9Im34OI>

- Motion capture: unknown shape, multiple cameras
- VR head tracking: known shape, single camera

# 6 DOF Head Pose Estimation

Head pose: 6 degrees of freedom (unknowns)

- 3D position and 3D rotation of headset (e.g. can represent as 4x4 matrix)

Inputs:

- Fixed: relative 3D position of markers on headset (e.g. can represent each marker offset as 4x4 matrix)
- Fixed: camera viewpoint (ignoring distortion, also a 4x4 projective mapping of 3D scene to 2D image)
- Each frame: 2D position of each headset marker in image

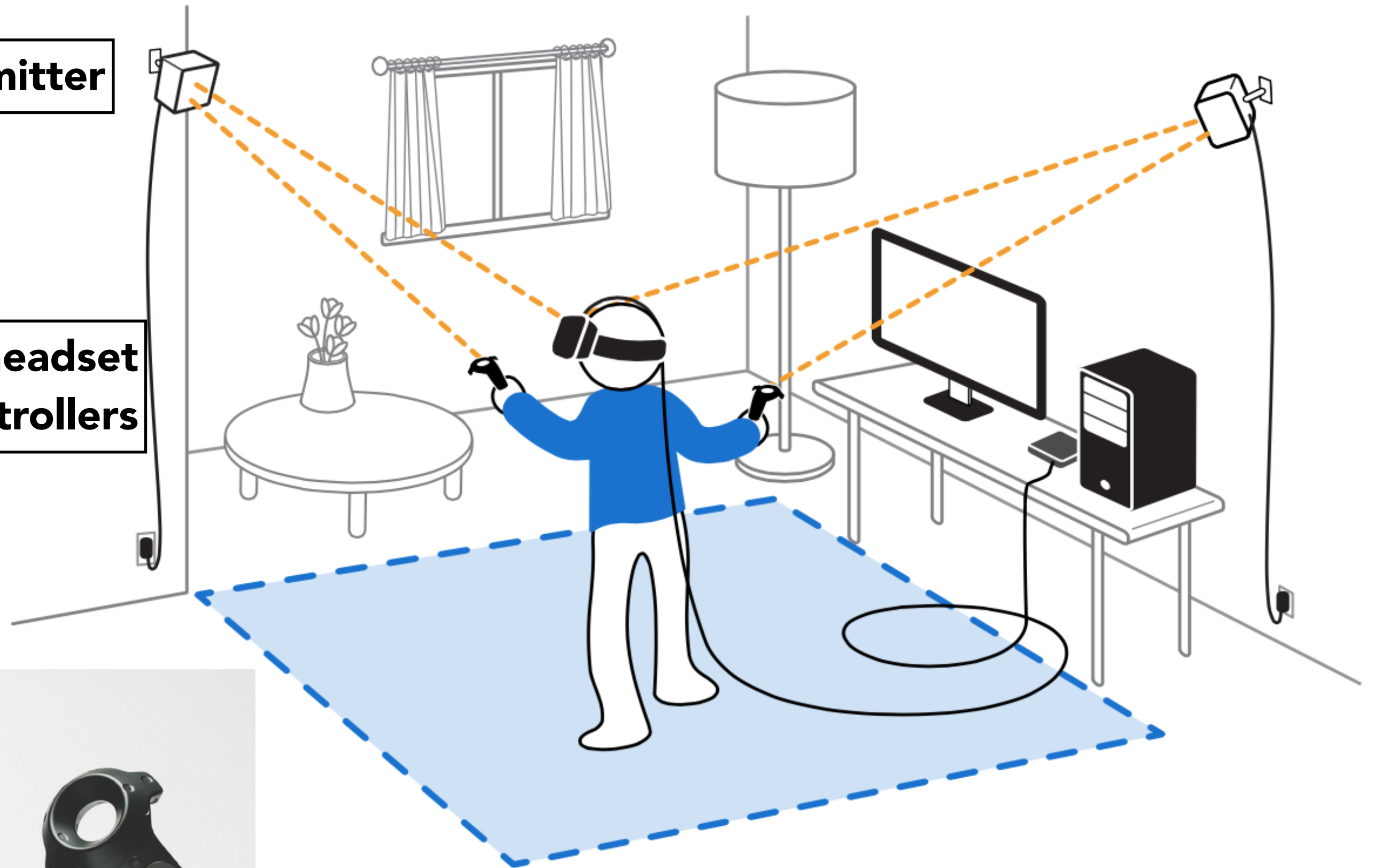
Pose calculation:

- Write down equations mapping each marker to image pixel location as a function of 6 degrees of freedom
- Solve for 6 degrees of freedom (e.g. least squares)

# HTC Vive Tracking System ("Lighthouse")

Structured light transmitter

Photodiode arrays on headset and hand-held controllers



# Vive Headset & Controllers Have Array of IR Photodiodes



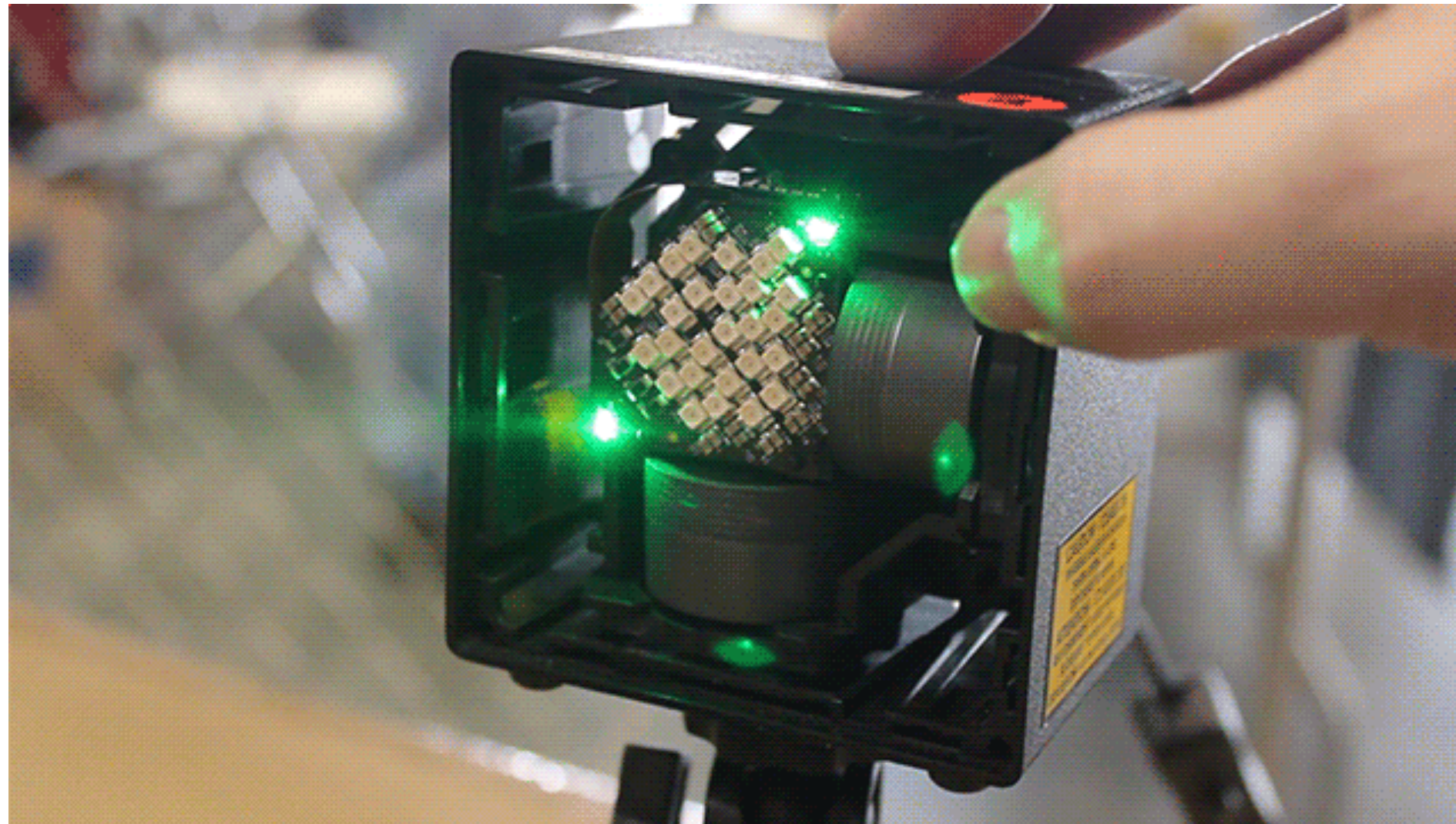
IR photodiode



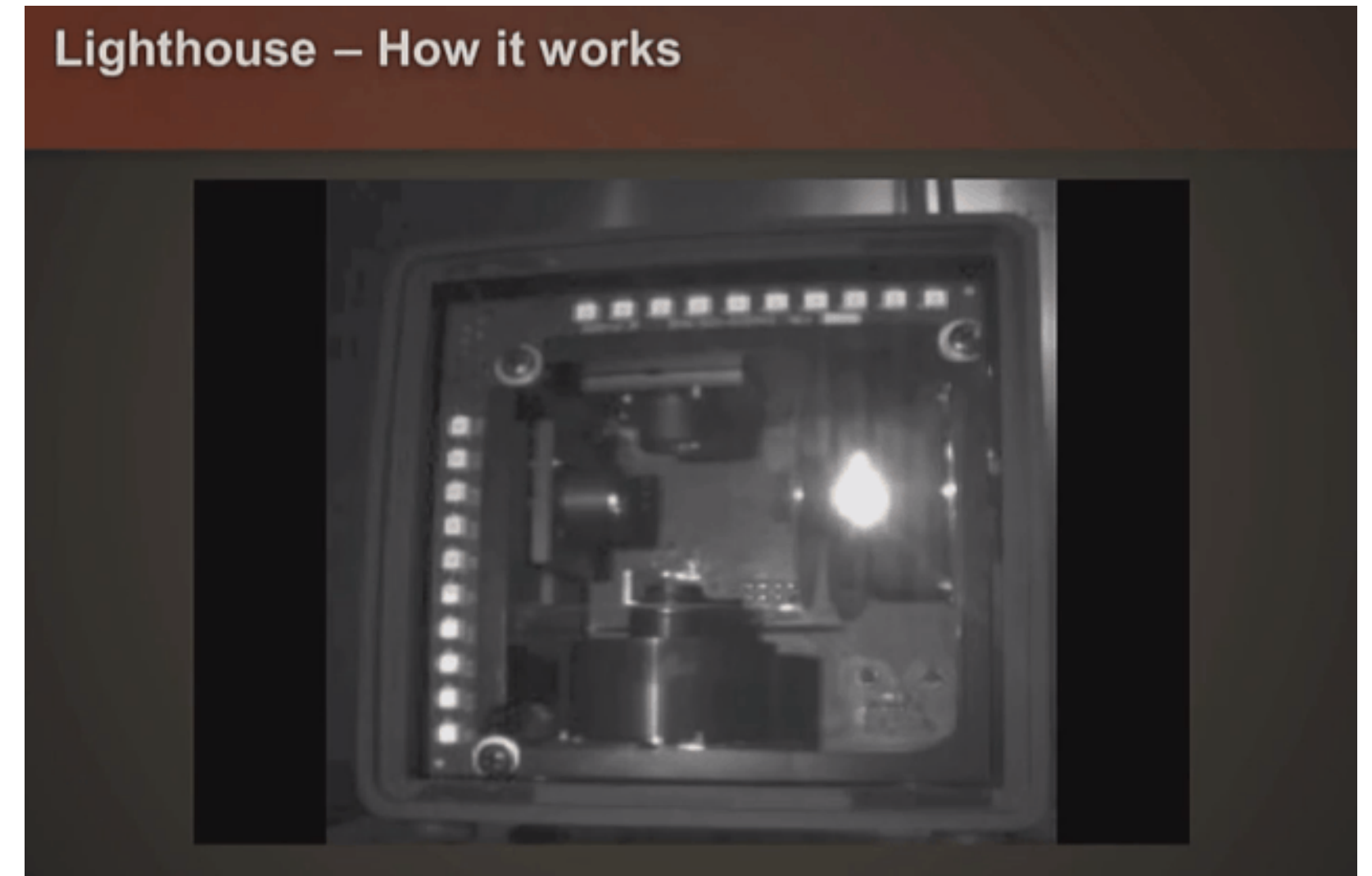
Image credit: uploadvr.com

**(Prototype) Headset and controller are covered with IR photodiodes**

# HTC Vive Structured Light Emitter ("Lighthouse")



**Light emitter contains array of LEDs (white)  
and two spinning wheels with lasers**



**Sequence of LED flash and laser sweeps  
provide structured lighting throughout room**

# HTC Vive Tracking System

For each frame, lighthouse does the following:

- LED pulse, followed by horizontal laser sweep
- LED pulse, followed by vertical laser sweep

Each photodiode on headset measures time offset between pulse and laser arrival

- Determines the x and y offset in the lighthouse's field of view
- In effect, obtain an image containing the 2D location of each photodiode in the world
  - (Can think of the lighthouse as a virtual "camera")

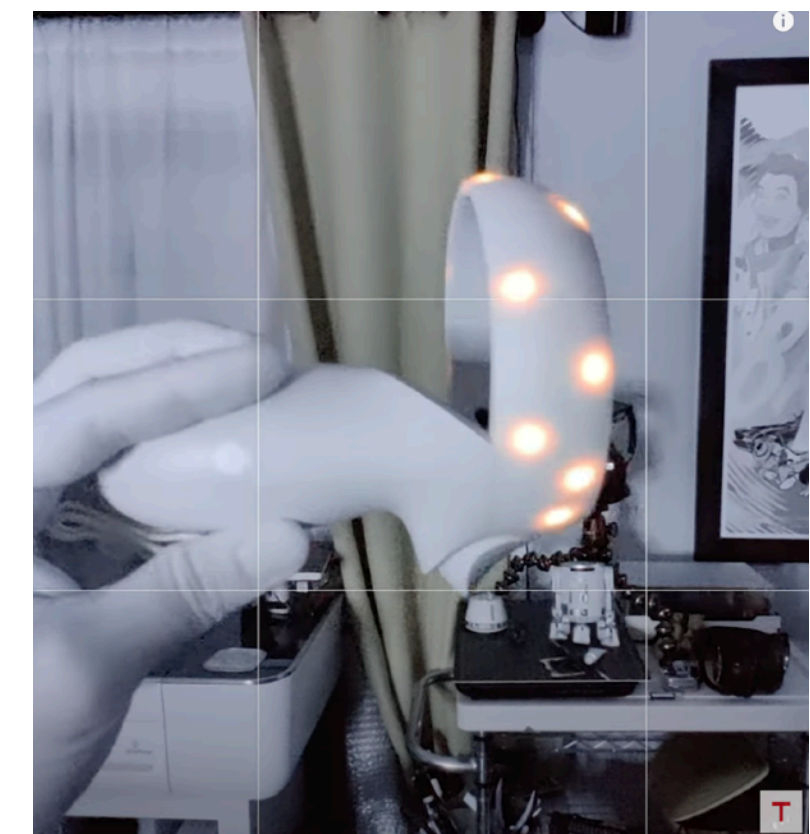
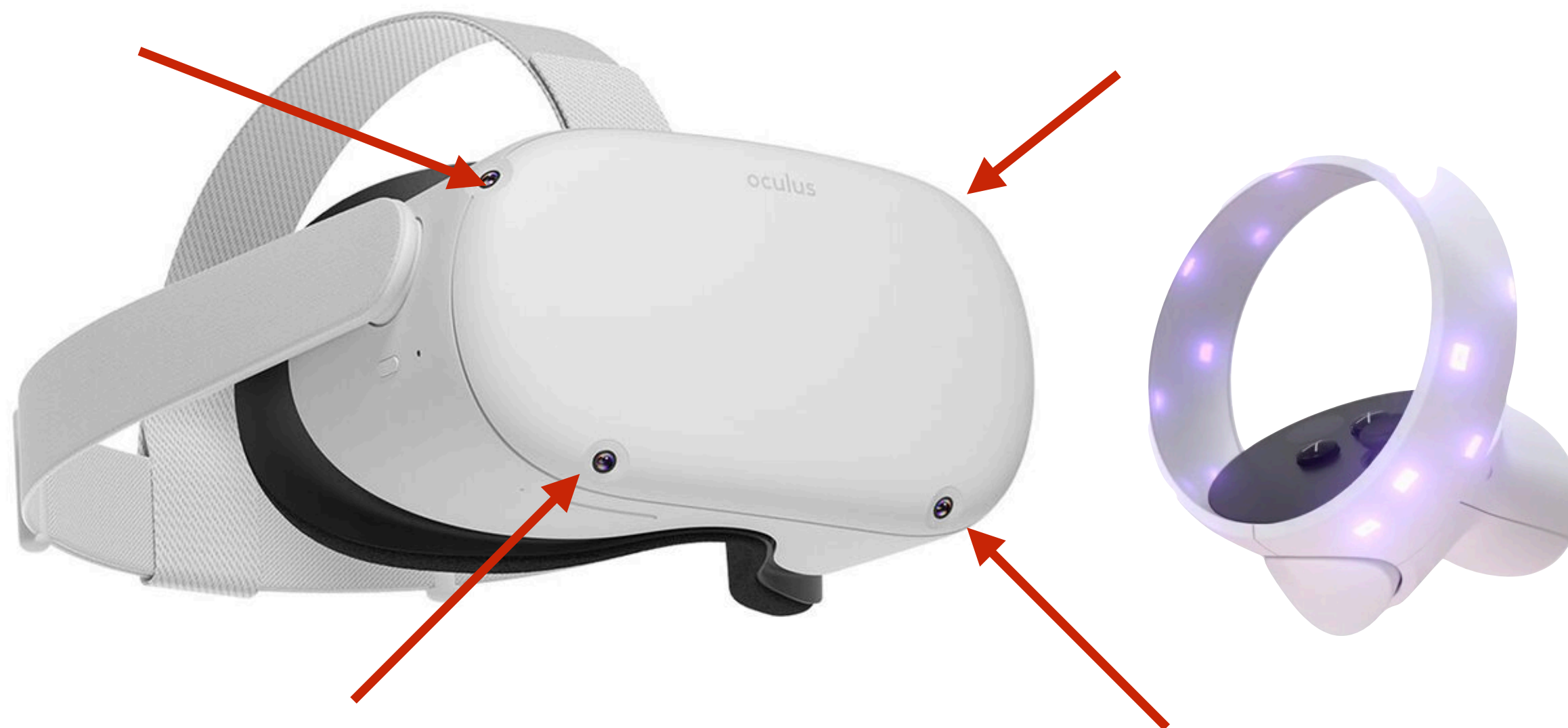
# HTC Vive Tracking System ("Lighthouse")



Credit: rvd88 / youtube. <https://www.youtube.com/watch?v=J54dotTt7k0>

# Many Modern Systems Use “Inside Out” Tracking

- Wide-angle cameras look outward from headset
- Use computer vision (SLAM) to estimate 3D structure of world and position/orientation of camera in the world
- These cameras also track the position/orientation of the controllers
  - Quest 2 controllers have 15 infrared LEDs to aid tracking



View of controller through infrared camera  
(credit Adam Savage's Testbed)



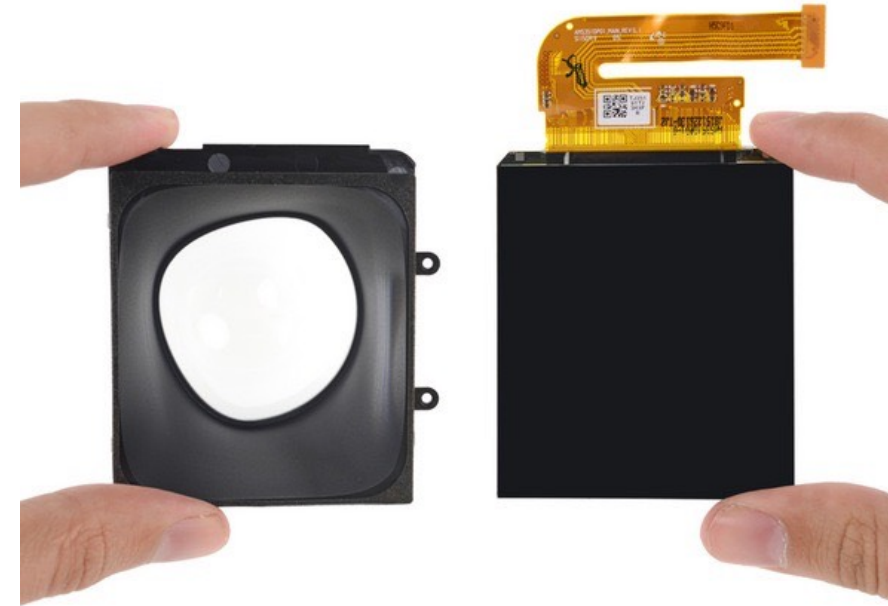
# Tracking Summary

Looked at a few tracking methods

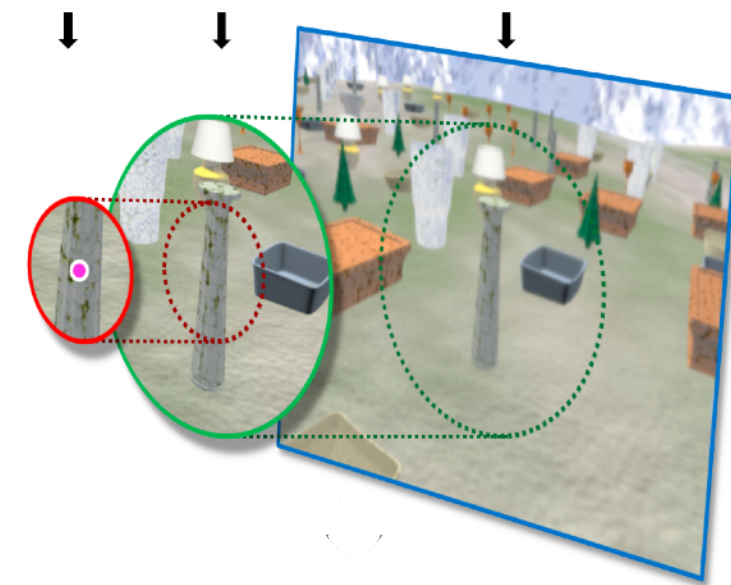
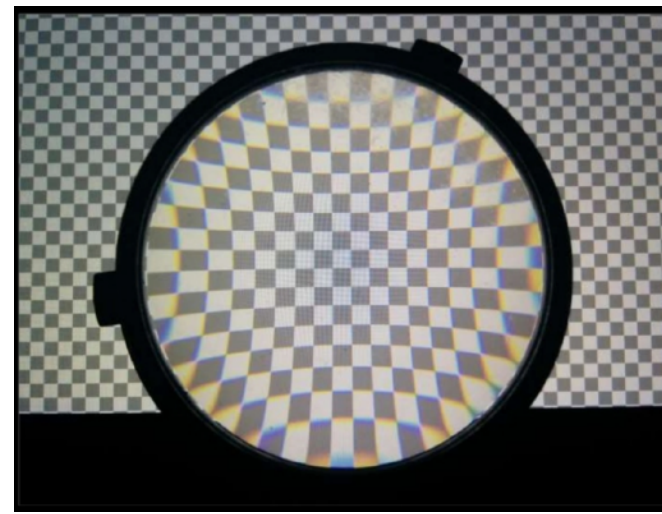
- Camera on headset + computer vision + gyro
- External camera + marker array on headset
- External structured light + sensor array on headset
- “Inside out” tracking

# Overview of VR Topics

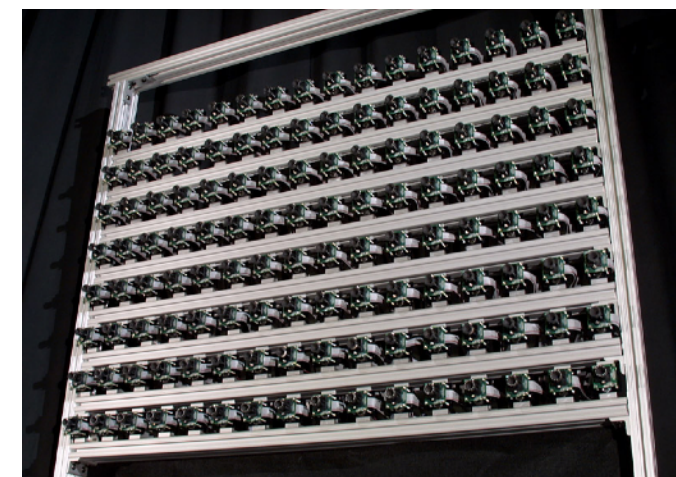
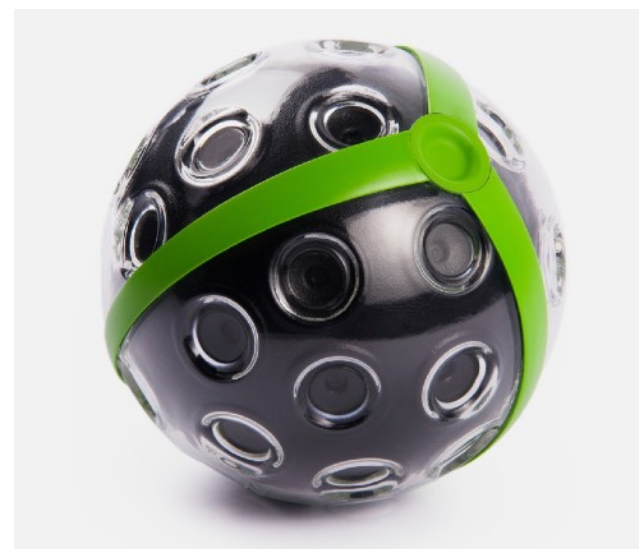
- VR Displays



- VR Rendering

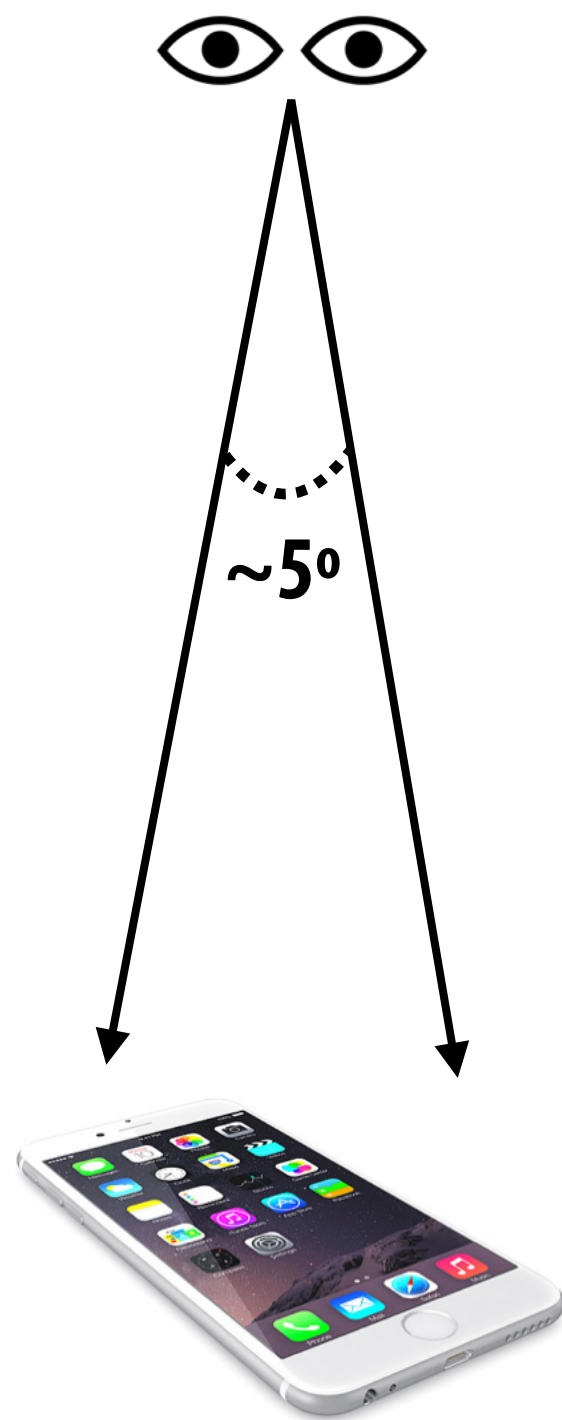


- VR Imaging

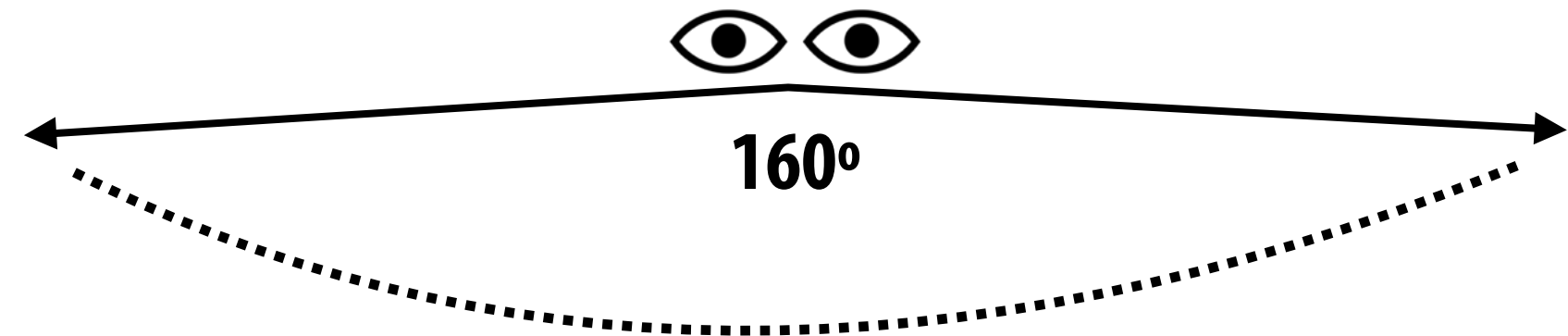


# Rendering Latency in VR

# A VR Display at Human Visual Acuity



iPhone 6: 4.7 in "retina" display:  
1.3 MPixel  
326 ppi → ~60 ppd



Human: ~160° view of field per eye (~200° overall)  
(Note: does not account for eye's ability to rotate in socket)

Future "retina" VR display:  
~ 8K x 8K display per eye (50 ppd)  
= 128 MPixel

Strongly suggests need for eye tracking and  
foveated rendering (eye can only perceive  
detail in 5° region about gaze point)

# Latency Requirements in VR Are Challenging

The goal of a VR graphics system is to achieve “presence”, tricking the brain into thinking what it is seeing is real

Achieving presence requires an exceptionally low-latency system

- What you see must change when you move your head!
- **End-to-end latency: time from moving your head to the time new photons hit your eyes**
  - Measure user’s head movement
  - Update scene/camera position
  - Render new image
  - Transfer image to headset, then transfer to display in headset
  - Actually emit light from display (photons hit user’s eyes)
- **Latency goal of VR: 10-25 ms**
  - **Requires exceptionally low-latency head tracking**
  - **Requires exceptionally low-latency rendering and display**

# **Thought Experiment: Effect of Latency**

**Consider 2,000 x 2,000 display spanning 100° field of view**

- **20 pixels per degree**

**Assume:**

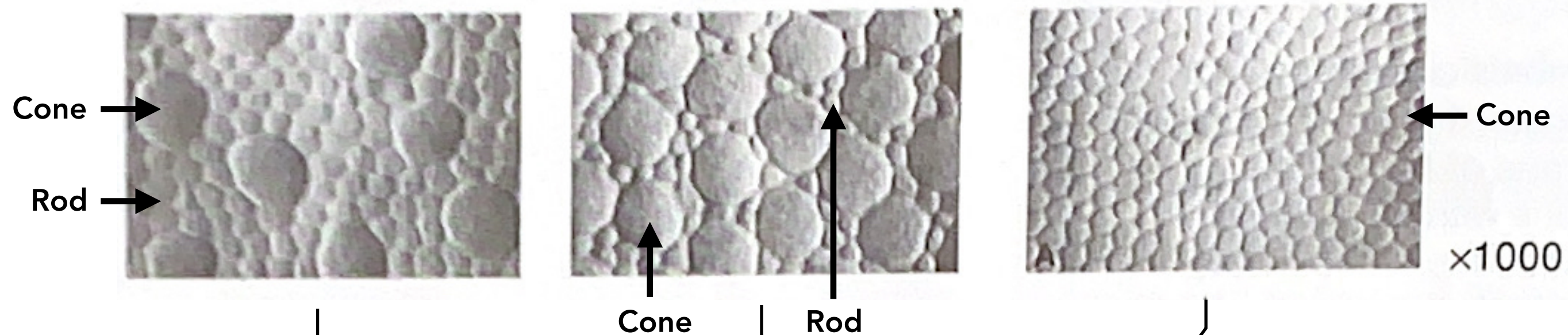
- **You move your head 90° in 1 second (only modest speed)**
- **End-to-end latency of system is a slow 33 ms (1/30 sec)**

**Result:**

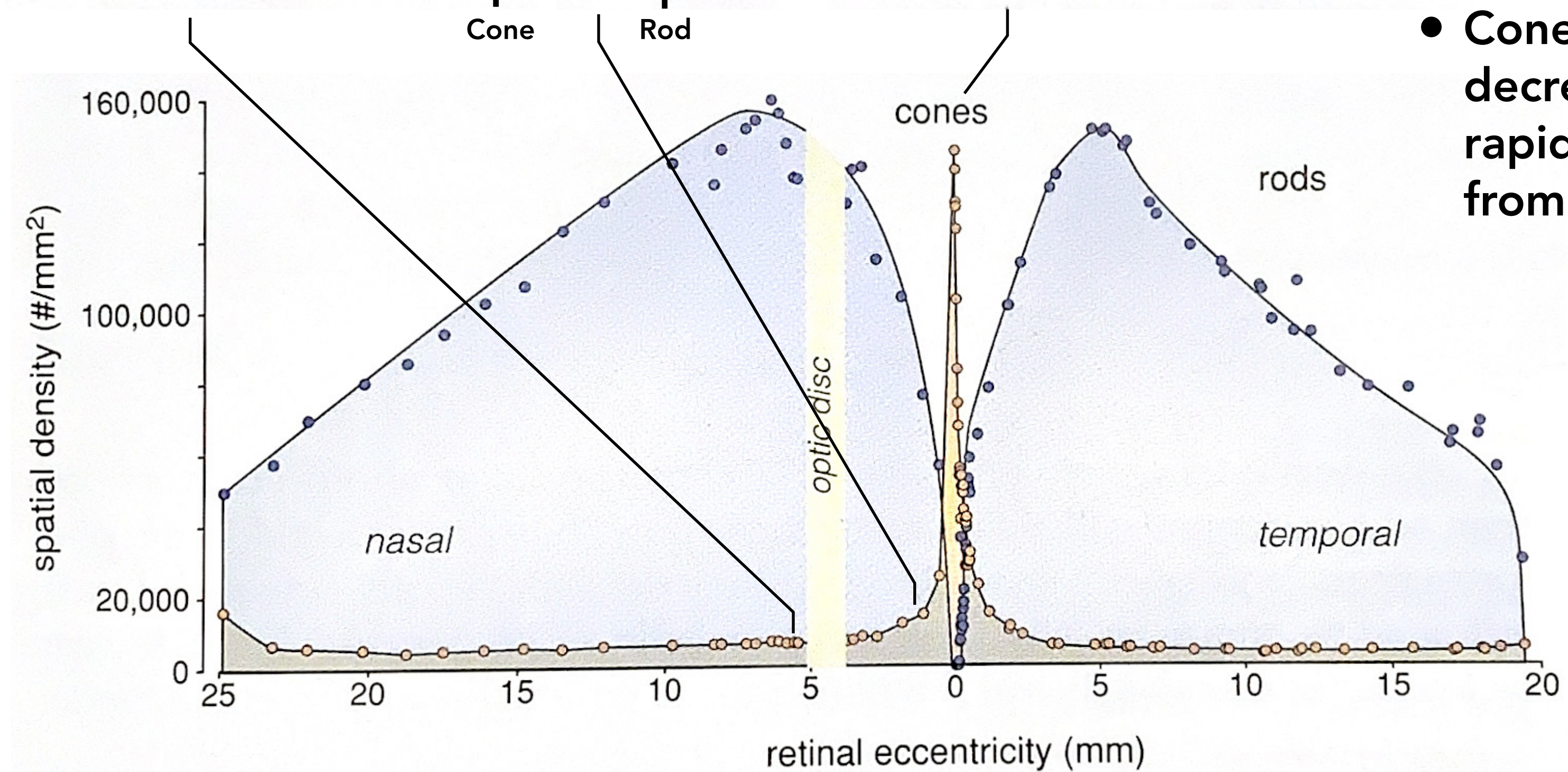
- **Displayed pixels are off by 3.0° ~ 60 pixels from where they would be in an ideal system with 0 latency**

**Rendering Challenge:**  
**Low Latency and High Resolution**  
**Require High Rendering Speed**

# Recall: Photoreceptor Size and Distribution Across Retina



- Highest density of cones in fovea
- Cone density decreases rapidly away from fovea



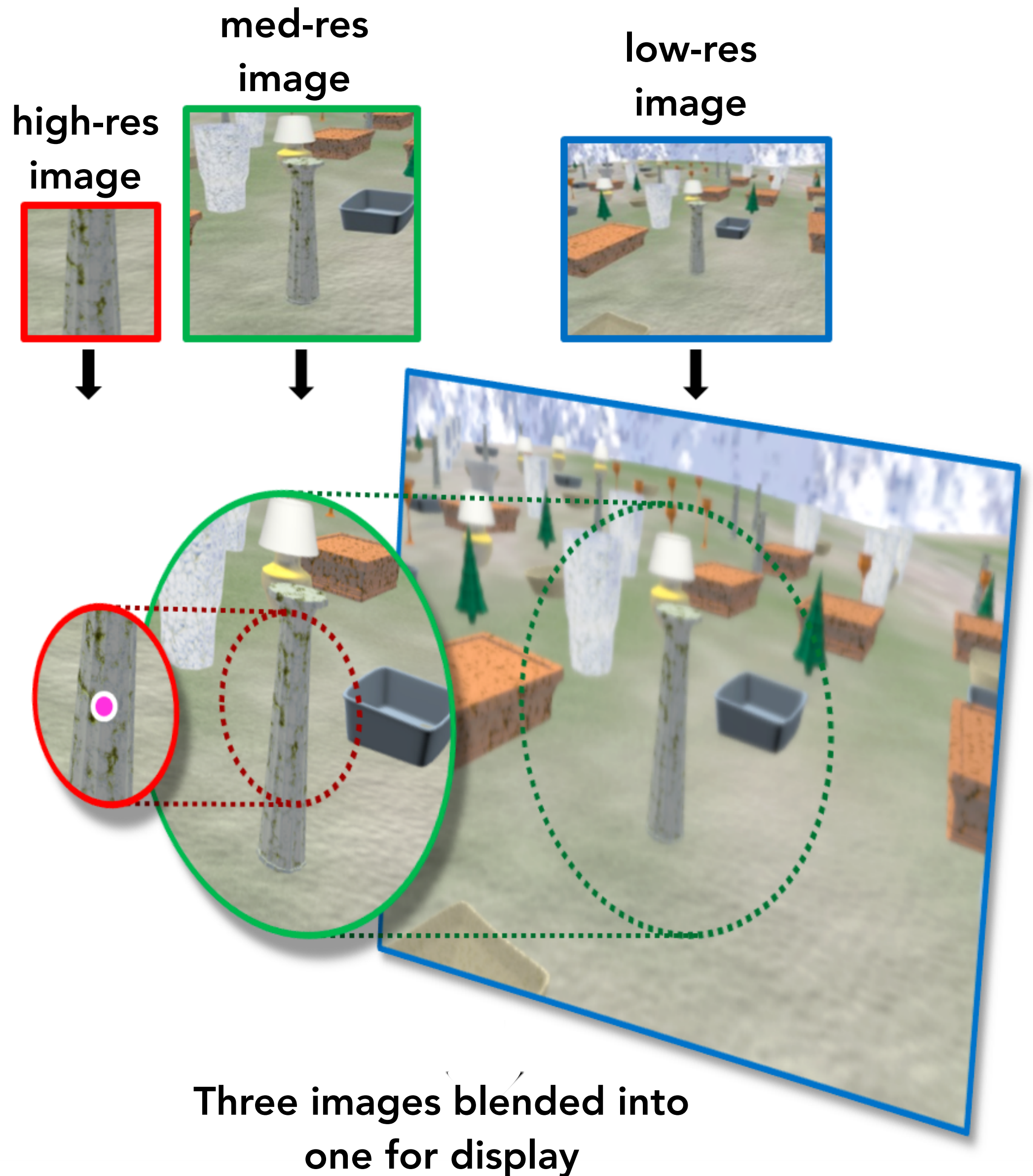
after Østerberg, 1935; as modified by Rodieck, 1988



# Foveated Rendering

Idea: track user's gaze, render with increasingly lower resolution farther away from gaze point

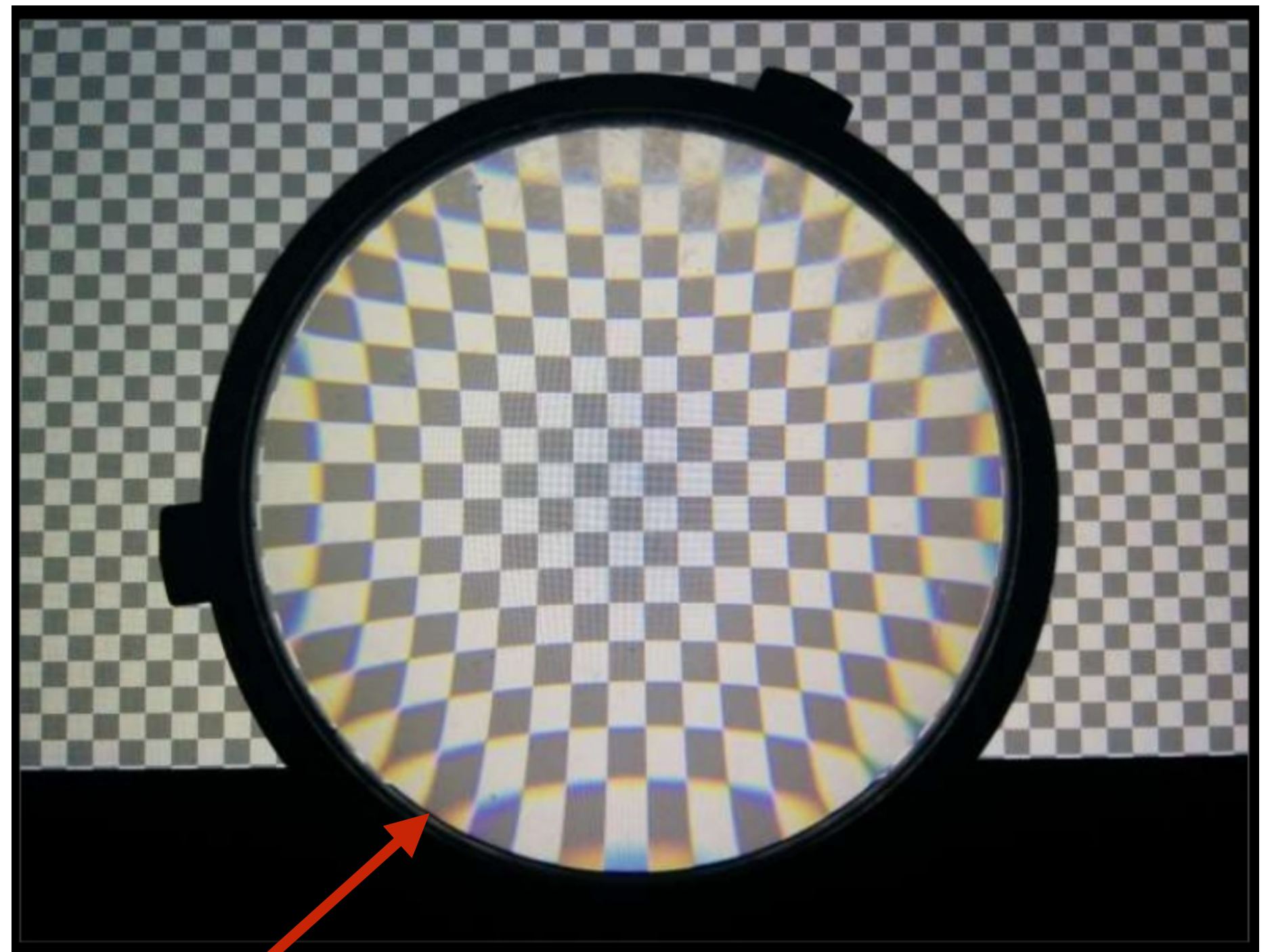
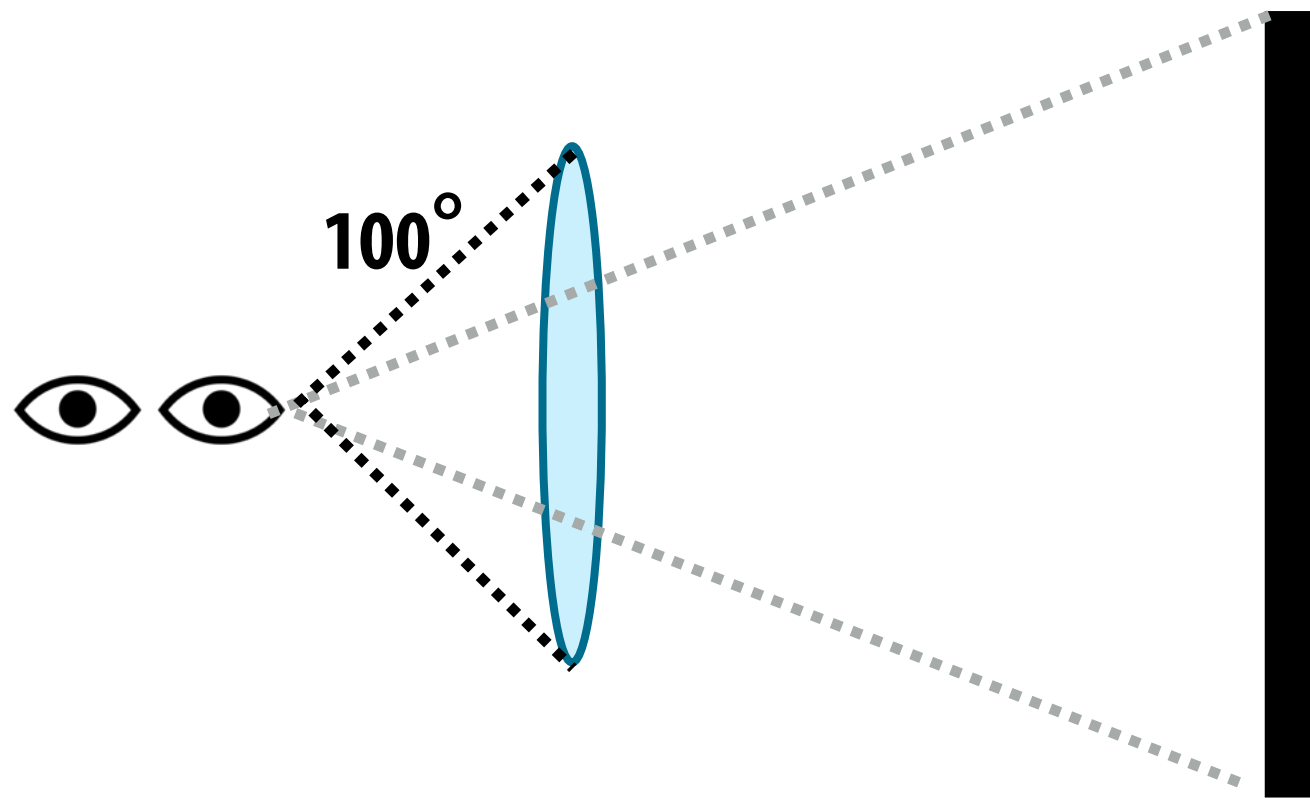
VR headset with eye tracker:  
HTC Vive Pro Eye



# **Rendering Challenge: Optical Distortion in VR Headset Viewing**

# Requirement: Wide Field of View

View of checkerboard through Oculus Rift (DK2) lens



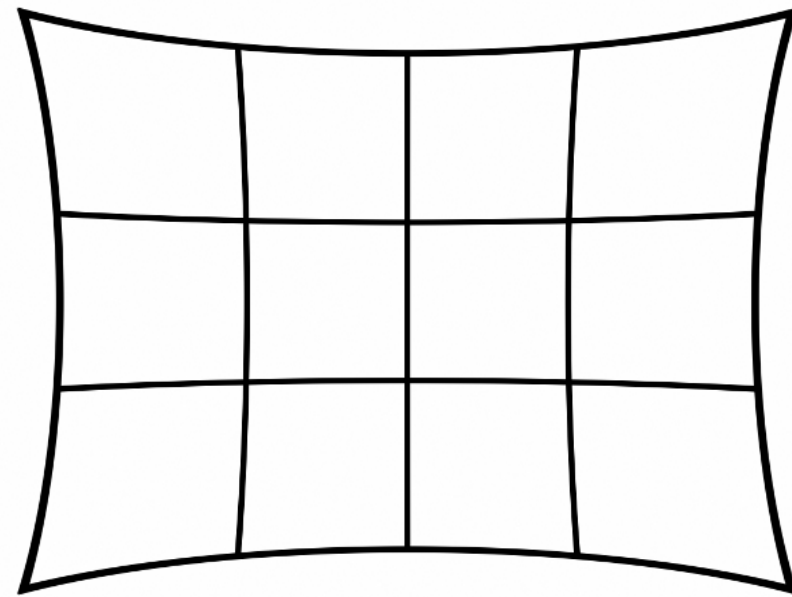
Lens introduces distortion

- Pincushion distortion
- Chromatic aberration (different wavelengths of light refract by different amount)

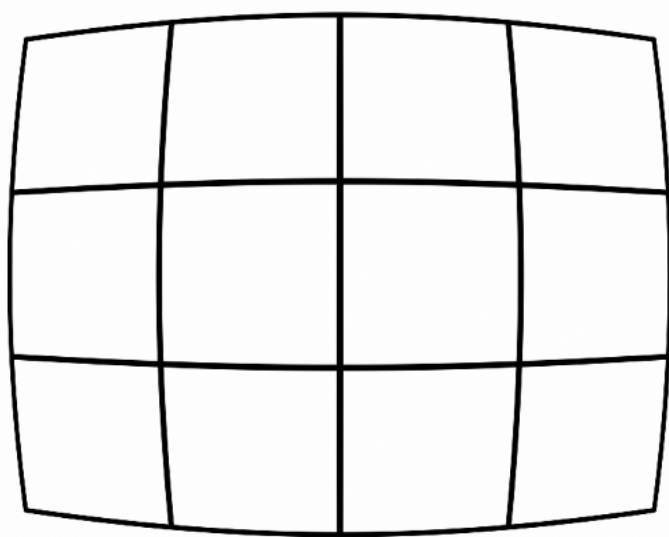
Icon credit: Eyes designed by SuperAtic LABS from the [thenounproject.com](http://thenounproject.com)

Image credit: Cass Everitt

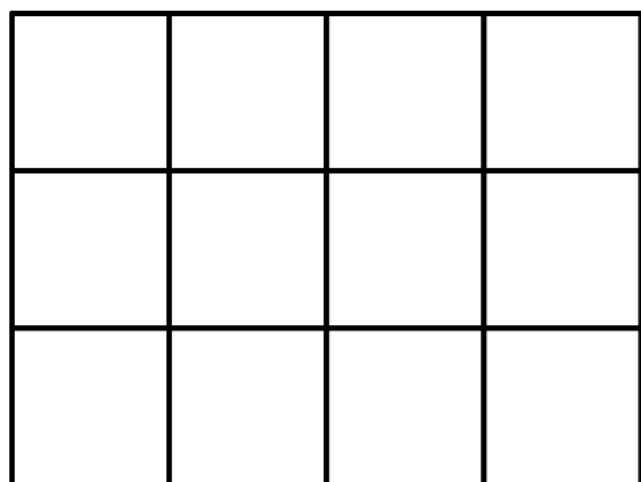
# Software Correction of Lens Distortion in Photography



Pincushion distortion



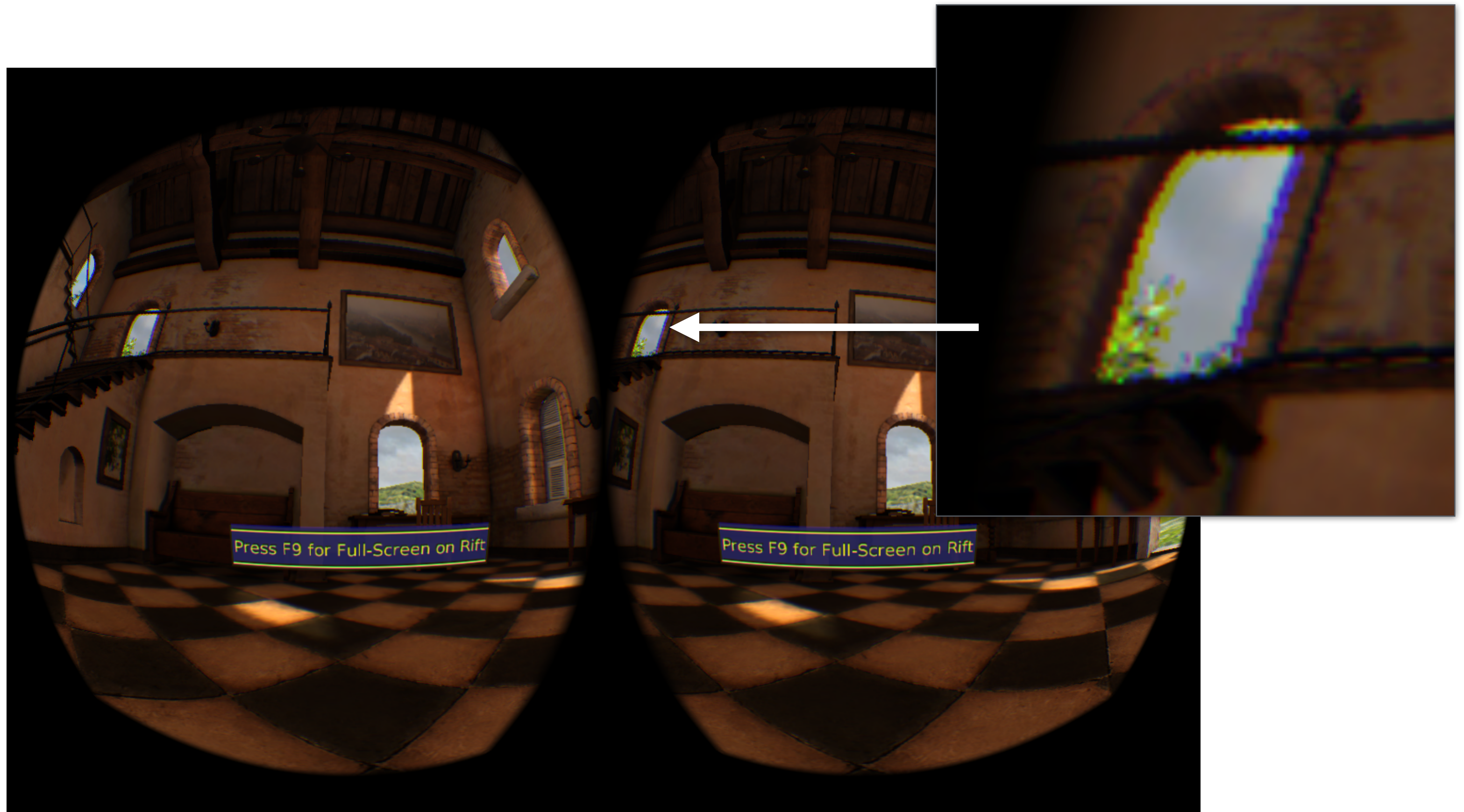
Barrel distortion



Rectilinear



# Software Compensation of Lens Distortion in VR Rendering



Step 1: Render scene using traditional graphics pipeline at full resolution for each eye

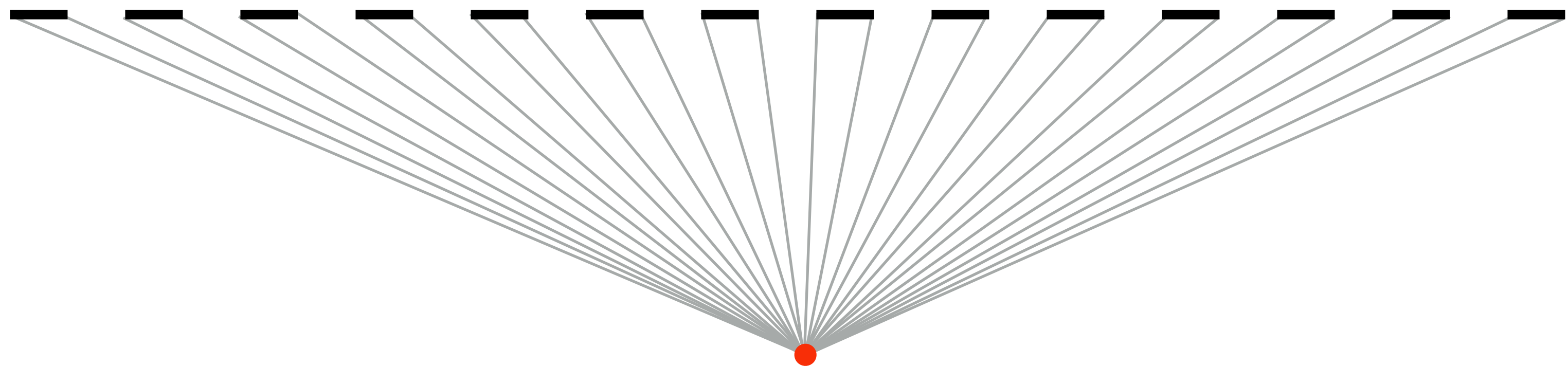
Step 2: Warp images in manner that scene appears correct after physical lens distortion

(Can use separate distortions to R, G, B to approximately correct chromatic aberration)

# Related Challenge: Rendering via Planar Projection

Recall: rasterization-based graphics is based on perspective projection to plane

- Distorts image under high FOV, as needed in VR rendering
- Recall: VR rendering spans wide FOV



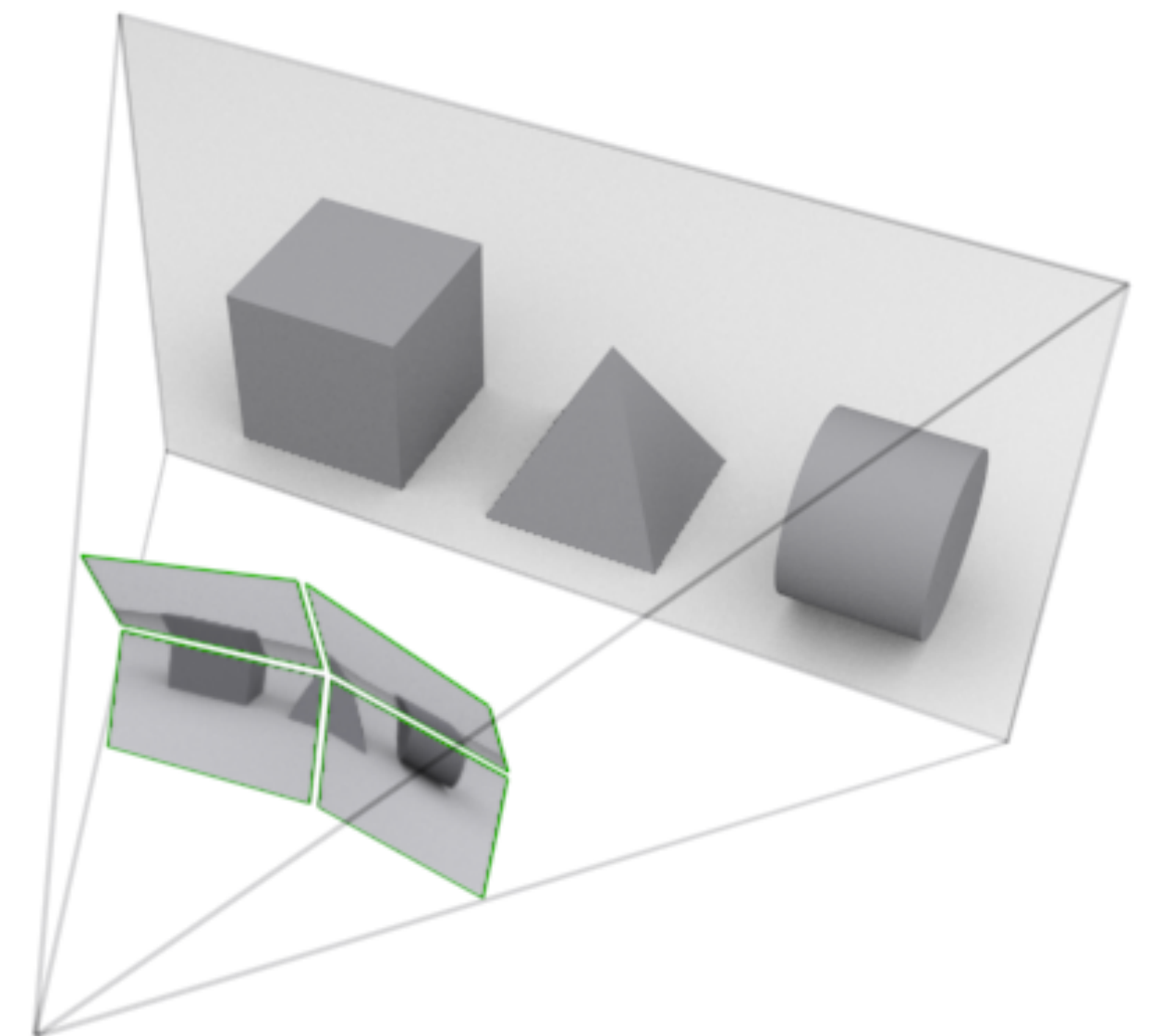
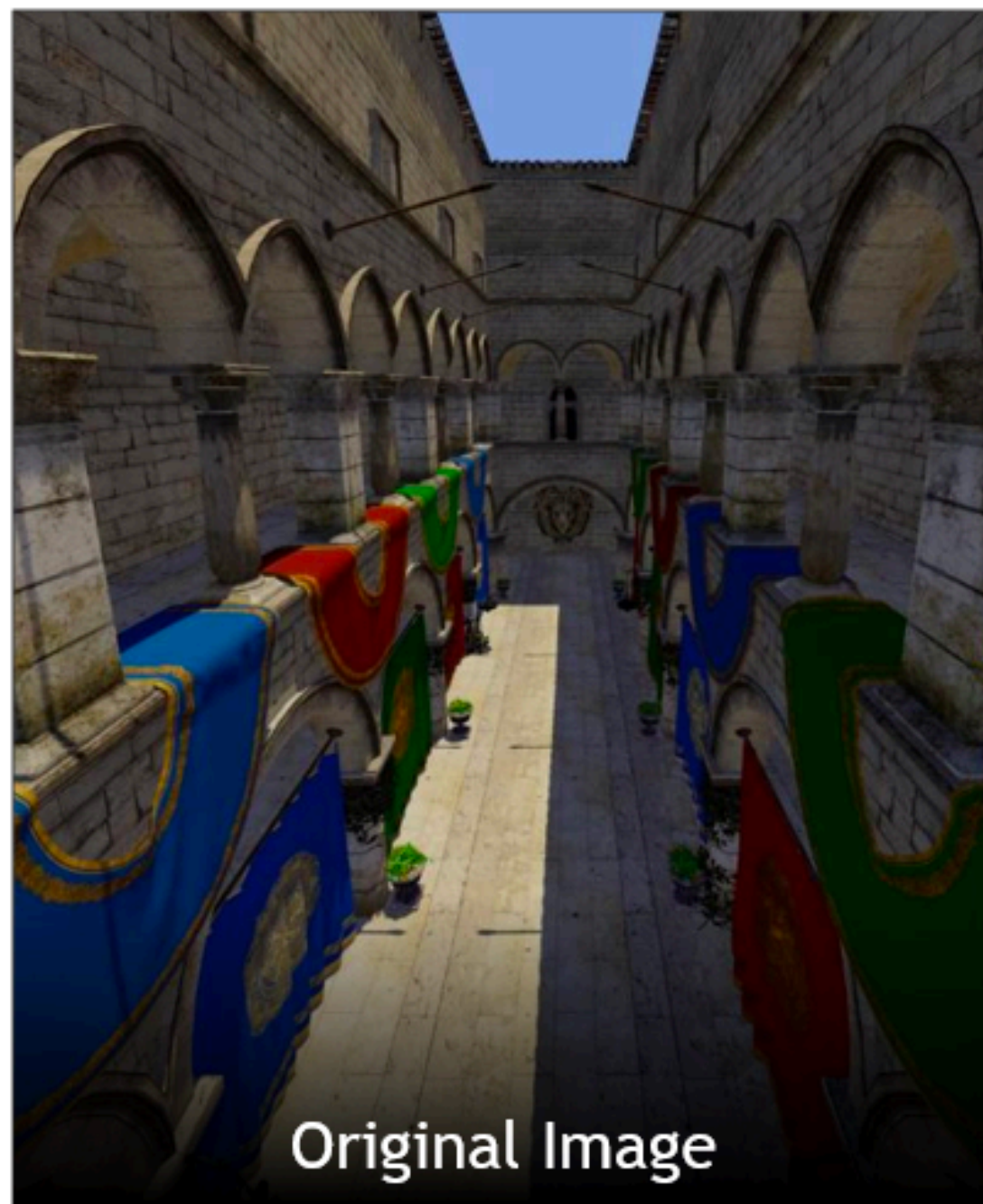
Pixels span larger angle in center of image  
(lowest angular resolution in center)

Potential solution space: curved displays, ray casting to achieve uniform angular resolution, rendering with piecewise linear projection plane (different plane per tile of screen)

# A Recent Implementation: Lens Matched Shading

Render scene with four viewports, each has different projection matrix

“Compresses” scene in the periphery (fewer samples), while not affecting scene near center of field of view

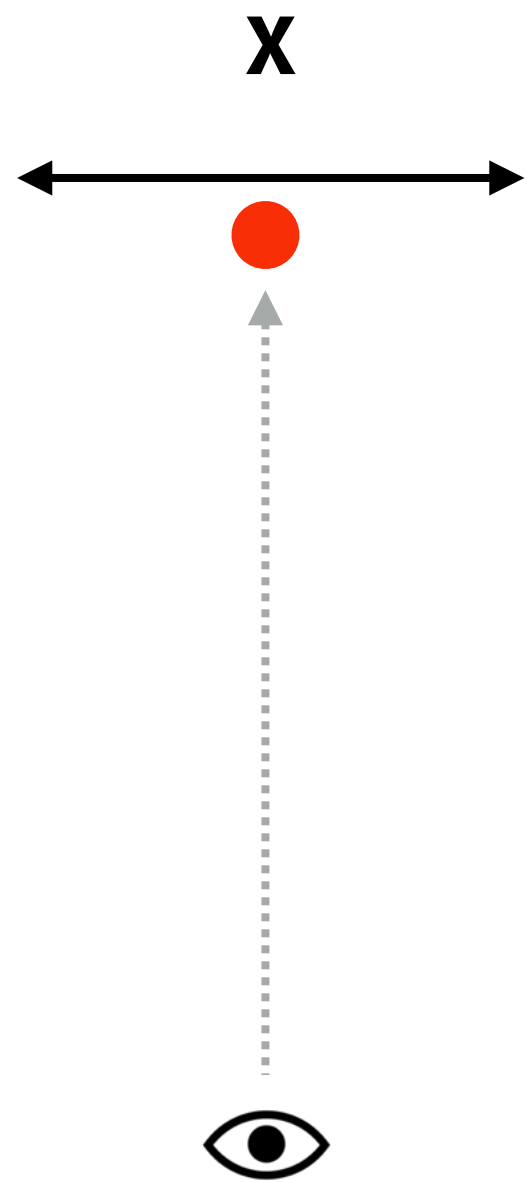


[Image credit: NVIDIA]

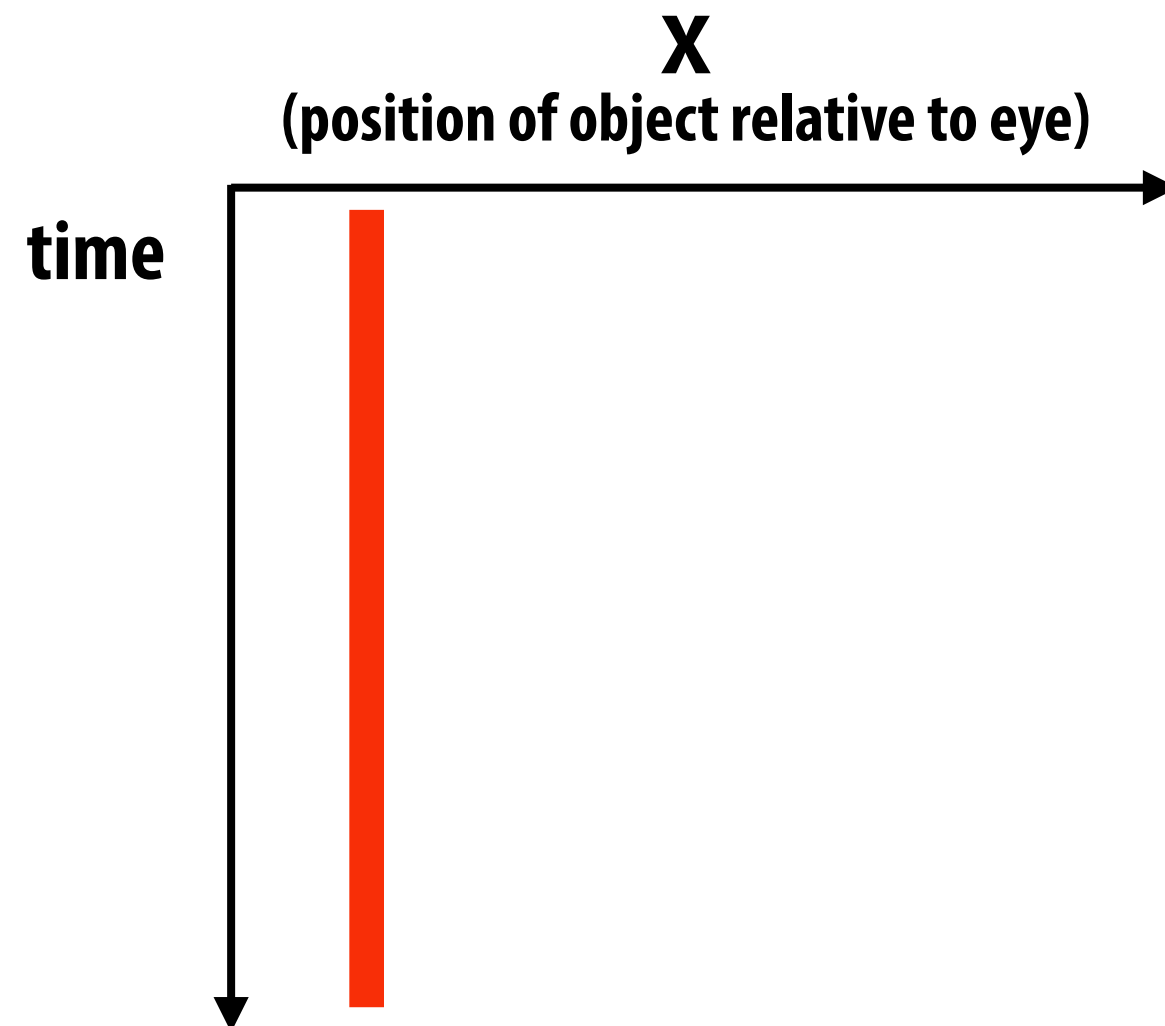
# **Rendering Challenge: Eye Motion And Finite Rendering Rate**



# Consider Finite VR Display Refresh Rate

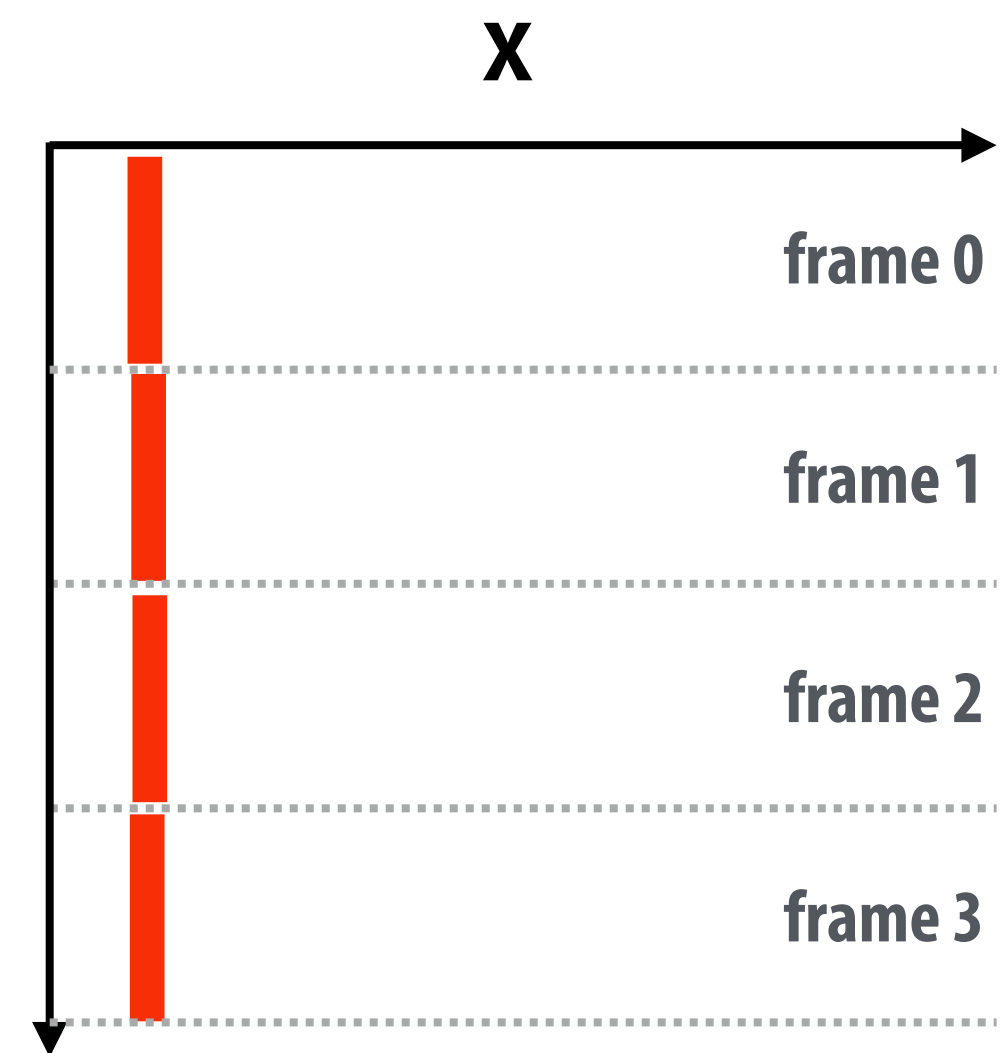


Reality (continuous)



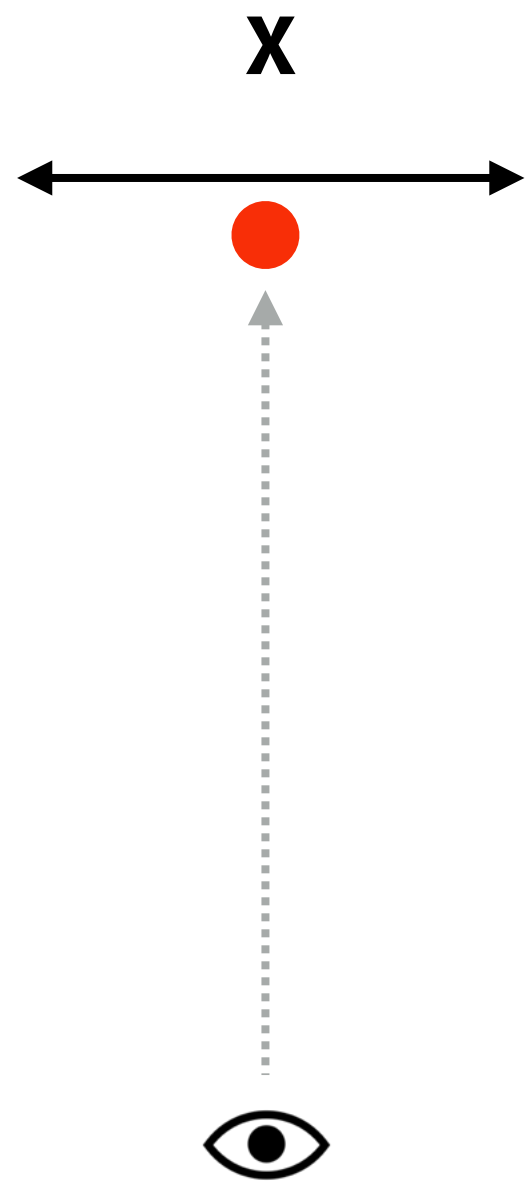
- Red object fixed;
- Eye gaze fixed

VR (discrete display refresh)

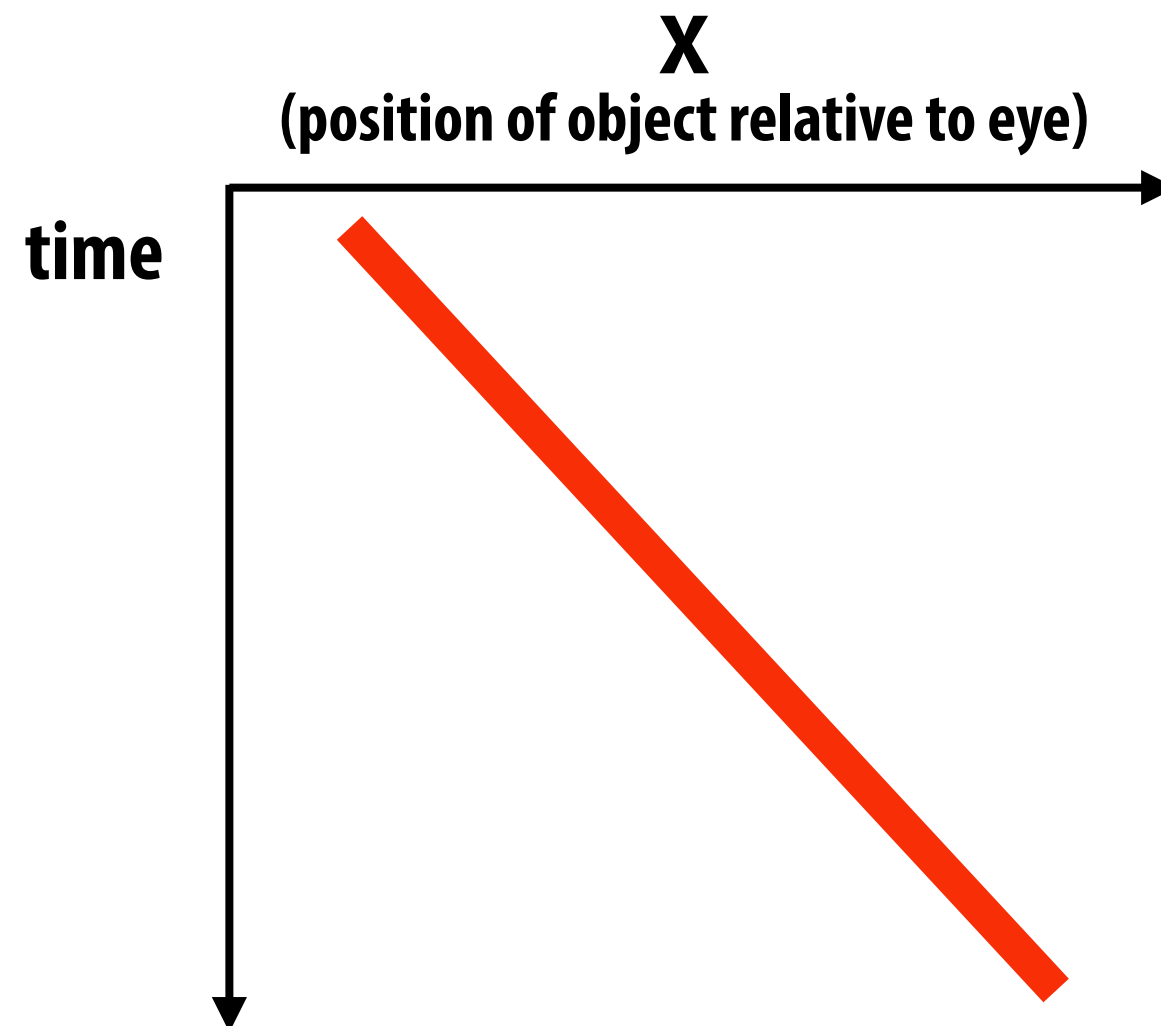


- Light from display (light updates every frame)

# Case 2: Object Moving Relative to Eye

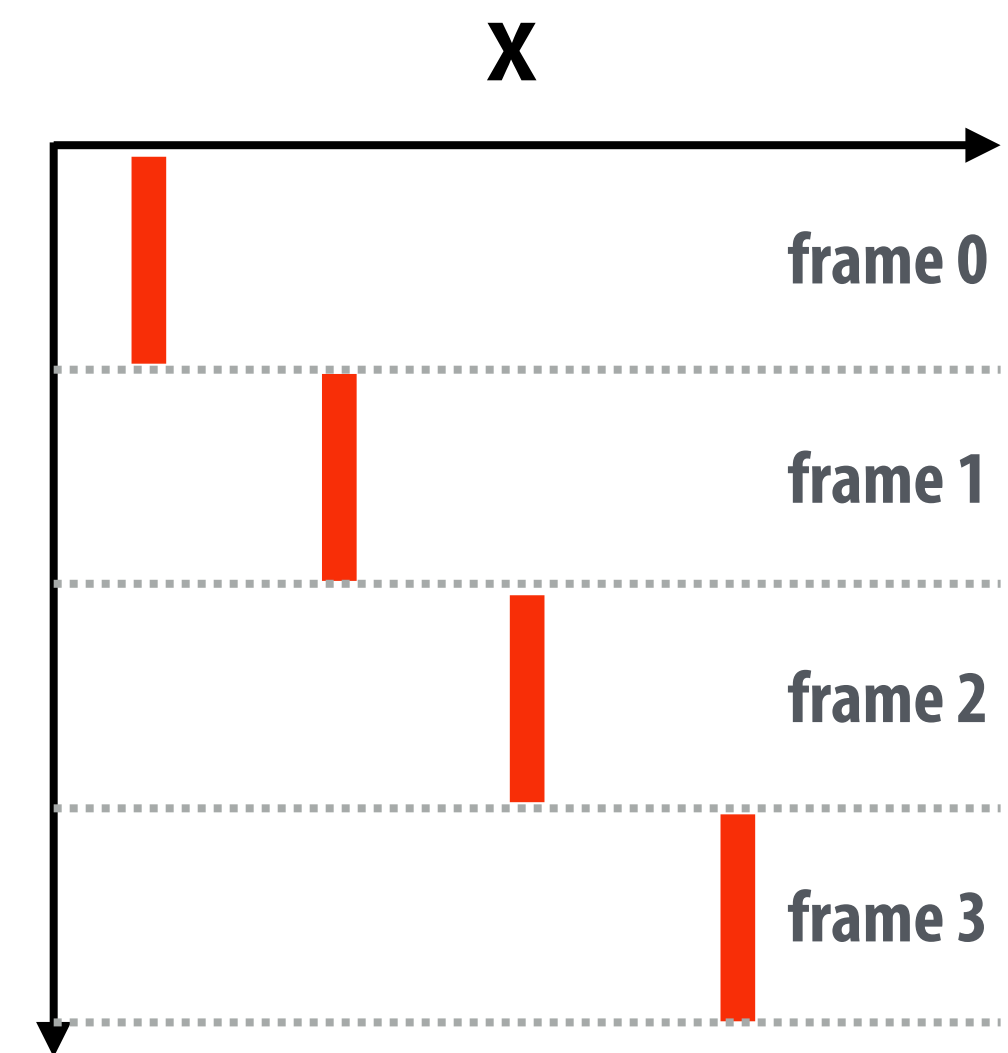


Reality (continuous)



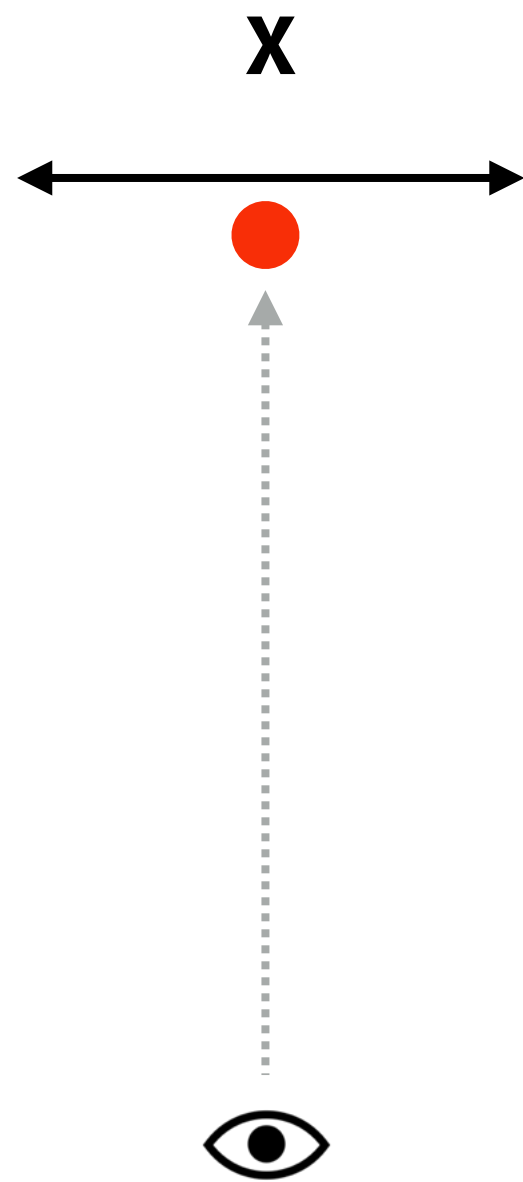
- Red object moving left to right;
- Eye gaze fixed

VR (discrete display refresh)

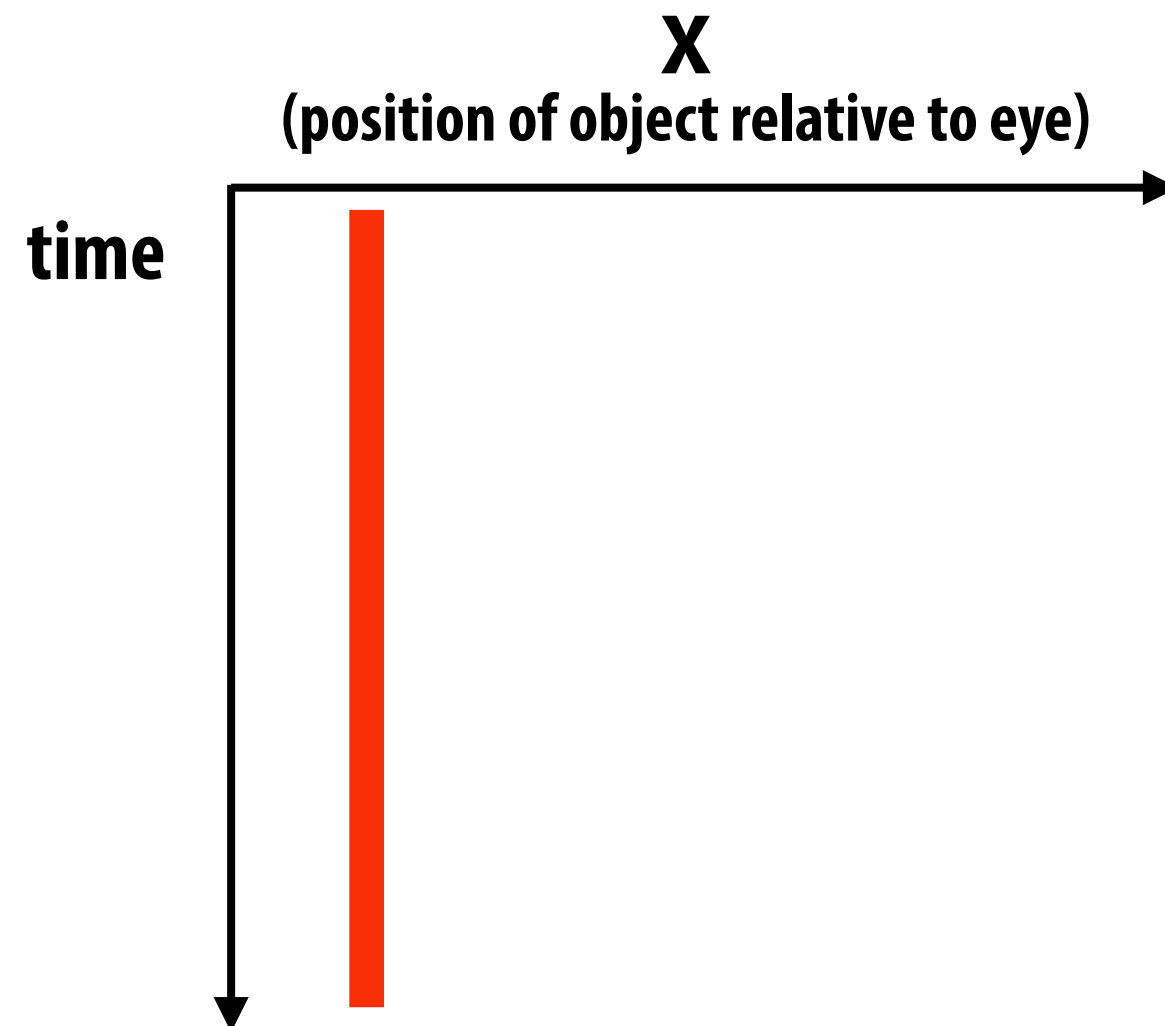


- Effect: time discretization
- OK: same perceptual effect as on regular 2D displays

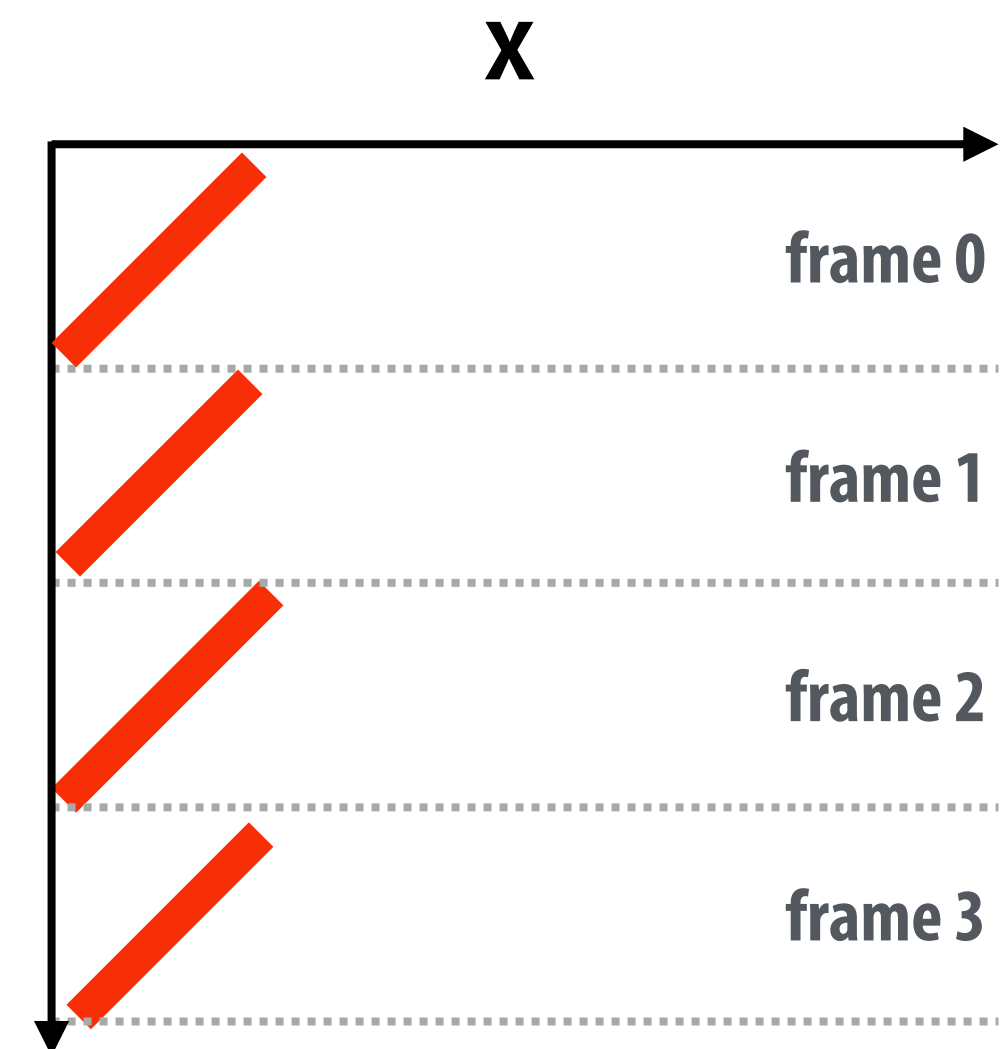
# Case 3: Eye Moving to Track Moving Object



Reality (continuous)

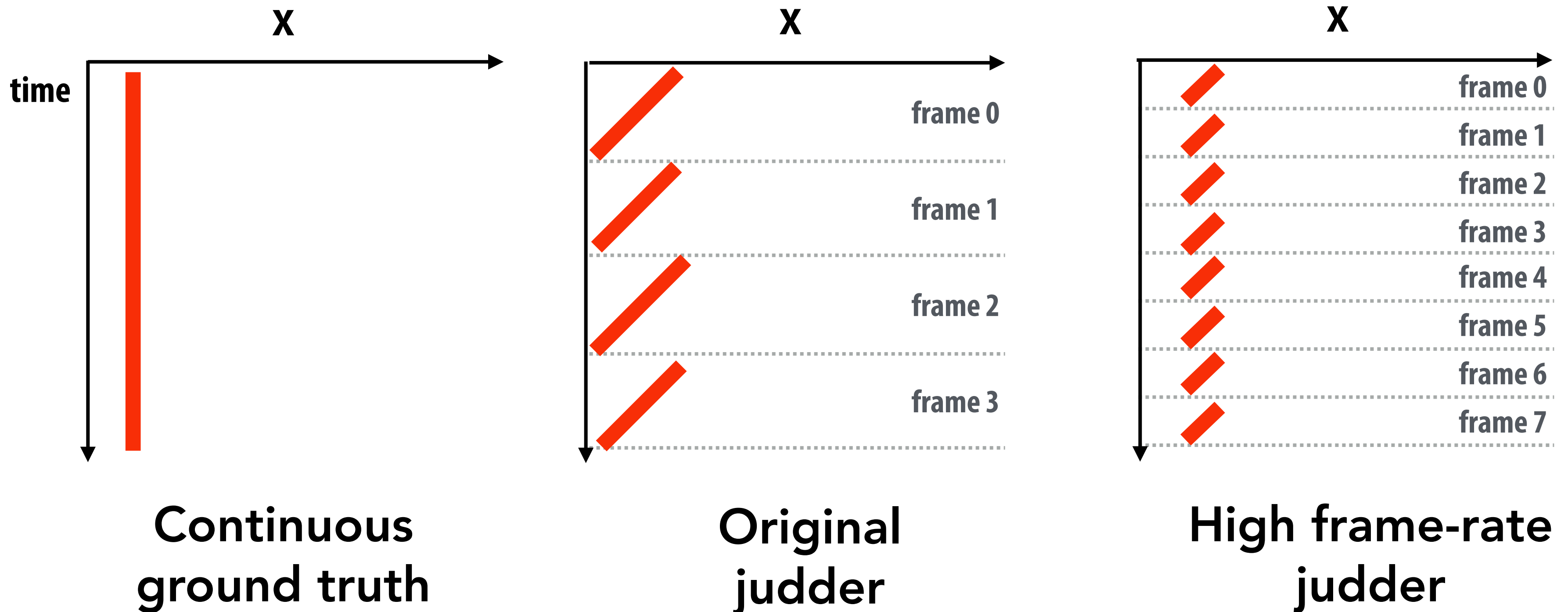


VR (discrete display refresh)



- Red object moving left to right;
- Eye gaze moving left to right to track object
- Eye is moving continuously relative to display
- During each frame, image of object lags eye motion
- Result: smearing/strobing effect ("judder")

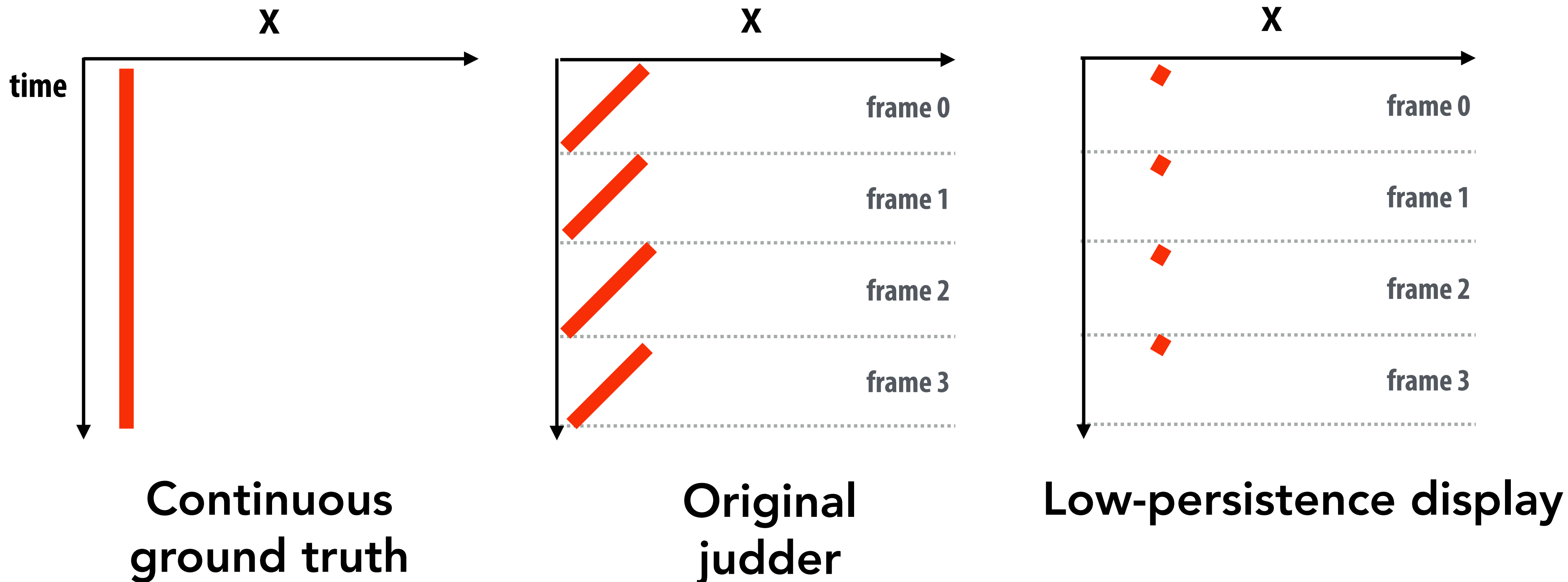
# Reducing Judder: Increase Frame Rate



Higher frame rate (right-most diagram)

- Closer approximation of ground truth

# Reducing Judder: Low Persistence Display



Low-persistence display: pixels emit light for small fraction of frame

- Oculus DK2 OLED low-persistence display:
  - 75 Hz frame rate =  $\sim 13$  ms per frame
  - Pixel persistence = 2-3 ms

# Problem: Displays Exhibit “Rolling Shutter” Artifacts

- Pixel are illuminated from top to bottom sequentially in time, so light emitted from the bottom row arrives “late”
- Without compensation, this lead to image artifacts (similar to rolling shutter artifacts in cameras). E.g. VR image appears horizontally sheared when head is moving left to right.
- Compensation techniques include:
  - Perform post-process shear on rendered image
  - Render each row of image at a different time (predicted time that photons will arrive at eye)

# **Rendering Challenge: High-Quality vs Low-Latency**

# **Problem: High-Quality Rendering Can Be Slow**

## **Constraints:**

- **Battery-powered device**
- **High-resolution outputs for both eyes**

## **Implication:**

- **Can take significant time to render a frame**
- **This increases latency, can cause motion sickness**
- **This can reduce frame refresh rate**



# Modern VR Engineering Solution: Reprojection

## Key Ideas:

- Decouple slow, high-quality rendering of frames from fast “reprojection” immediately before display
- The high-quality frame uses then-current head-tracking (which may be stale by end of render)
- Reprojection occurs extremely close in time to physical display, and warps the most recent high-quality frame to the very latest head-tracking data
- Accurate reprojection warp requires both rendered image, its depth map, and potentially motion derivatives (e.g. optical flow)

# Modern VR Engineering Solution: Reprojection

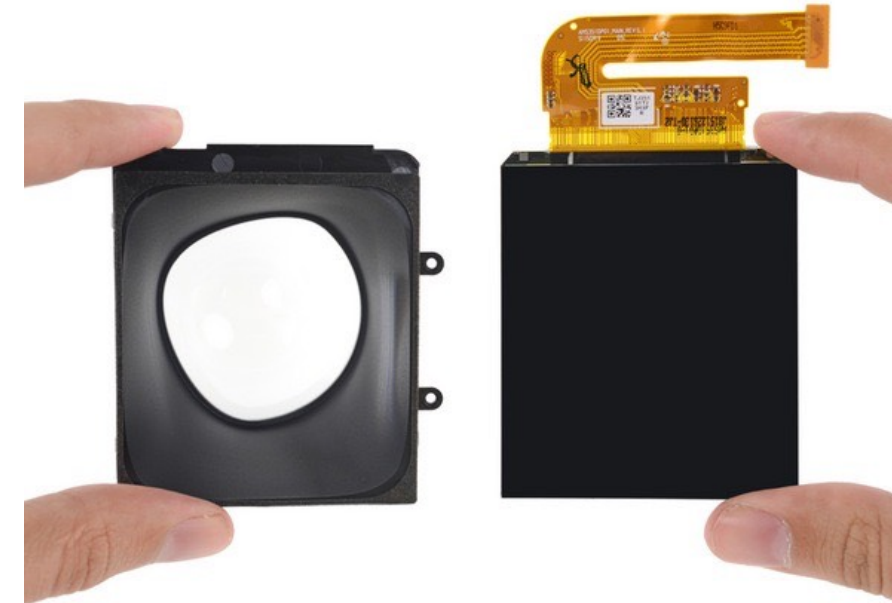


ASW 2.0

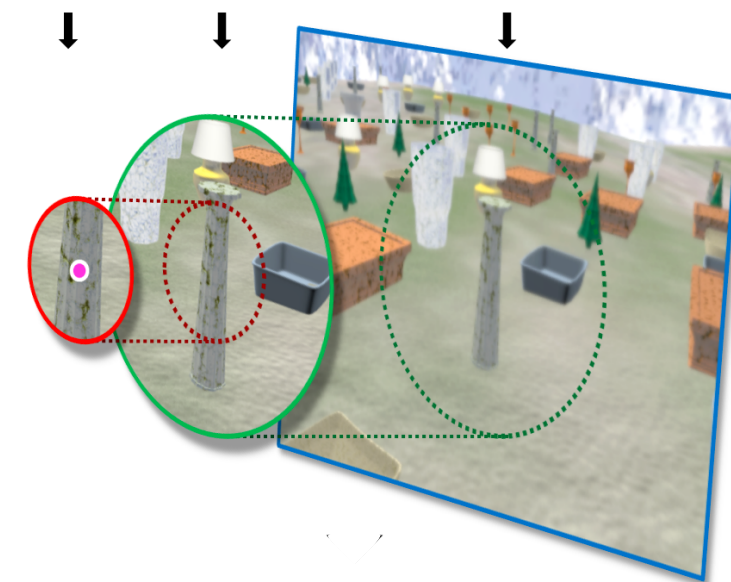
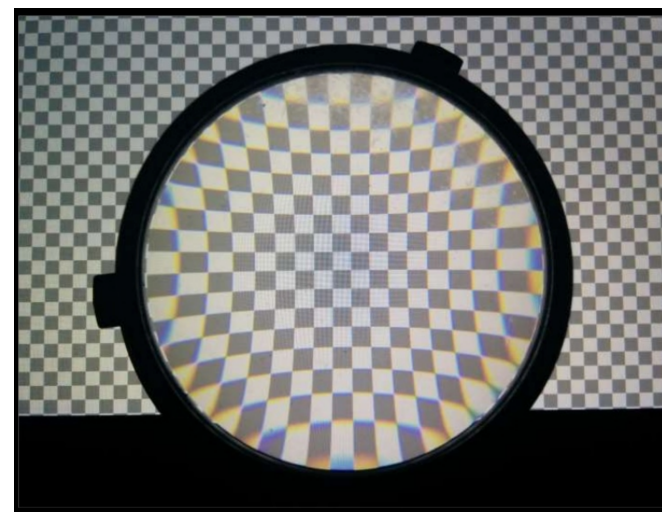
# Overview of VR Topics

Areas we will discuss over next few lectures

- VR Displays



- VR Rendering



- VR Imaging

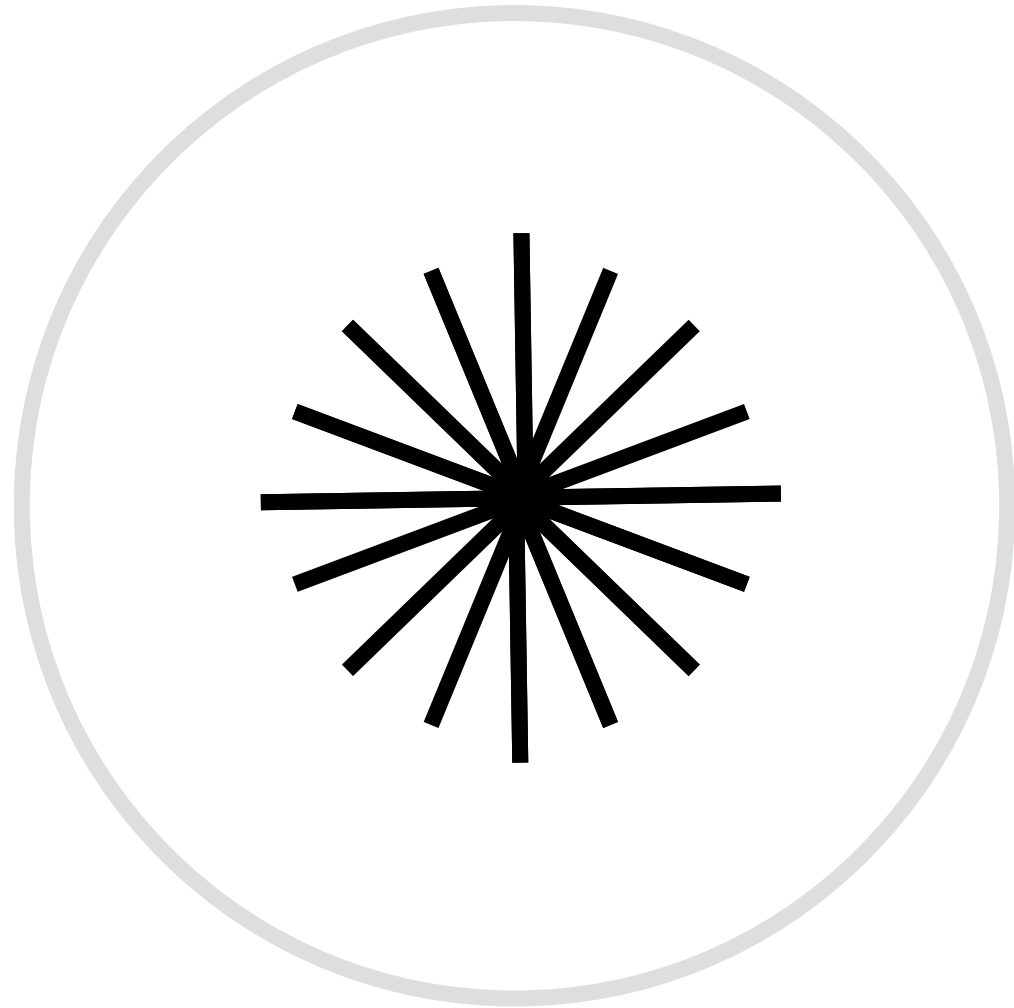


# **Spherical Imaging (Monocular 360)**

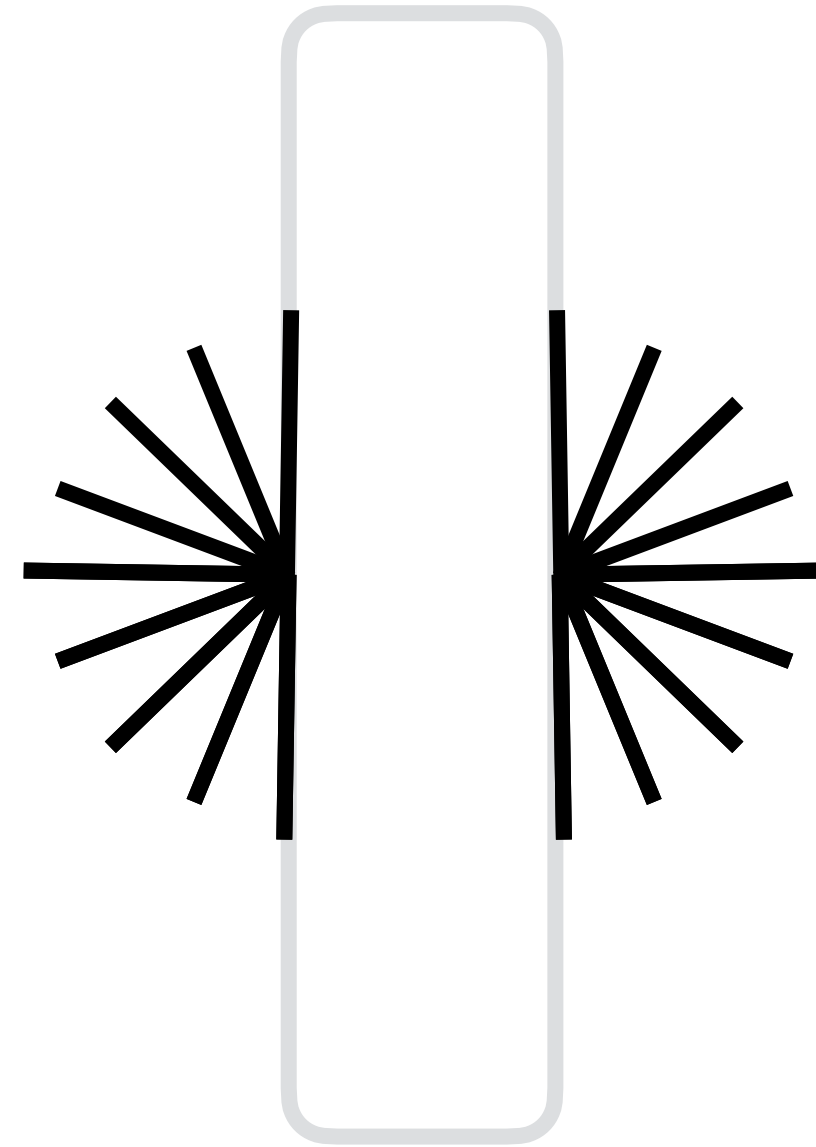
# Dual Fisheye



# Stitching Challenges



Want this  
ray sampling



Get this  
ray sampling

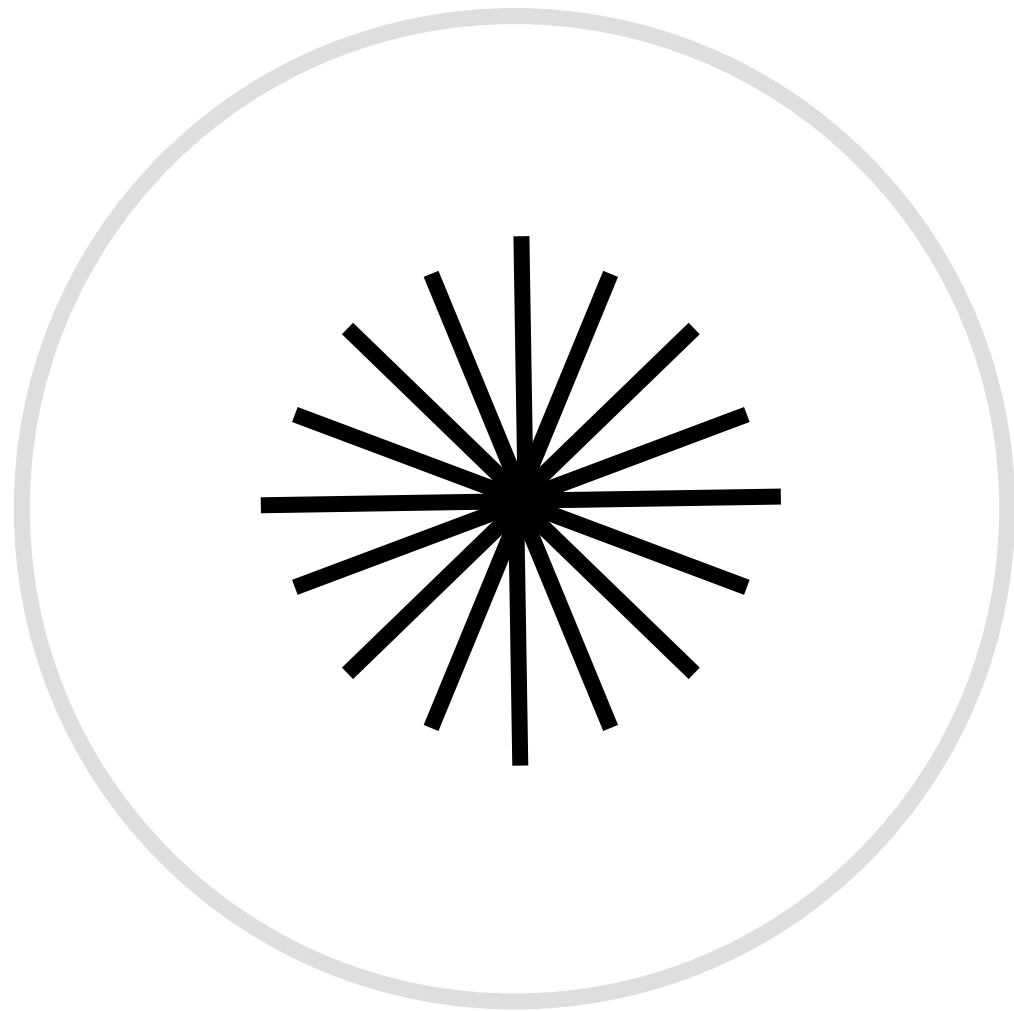
# Spherical Array of Cameras



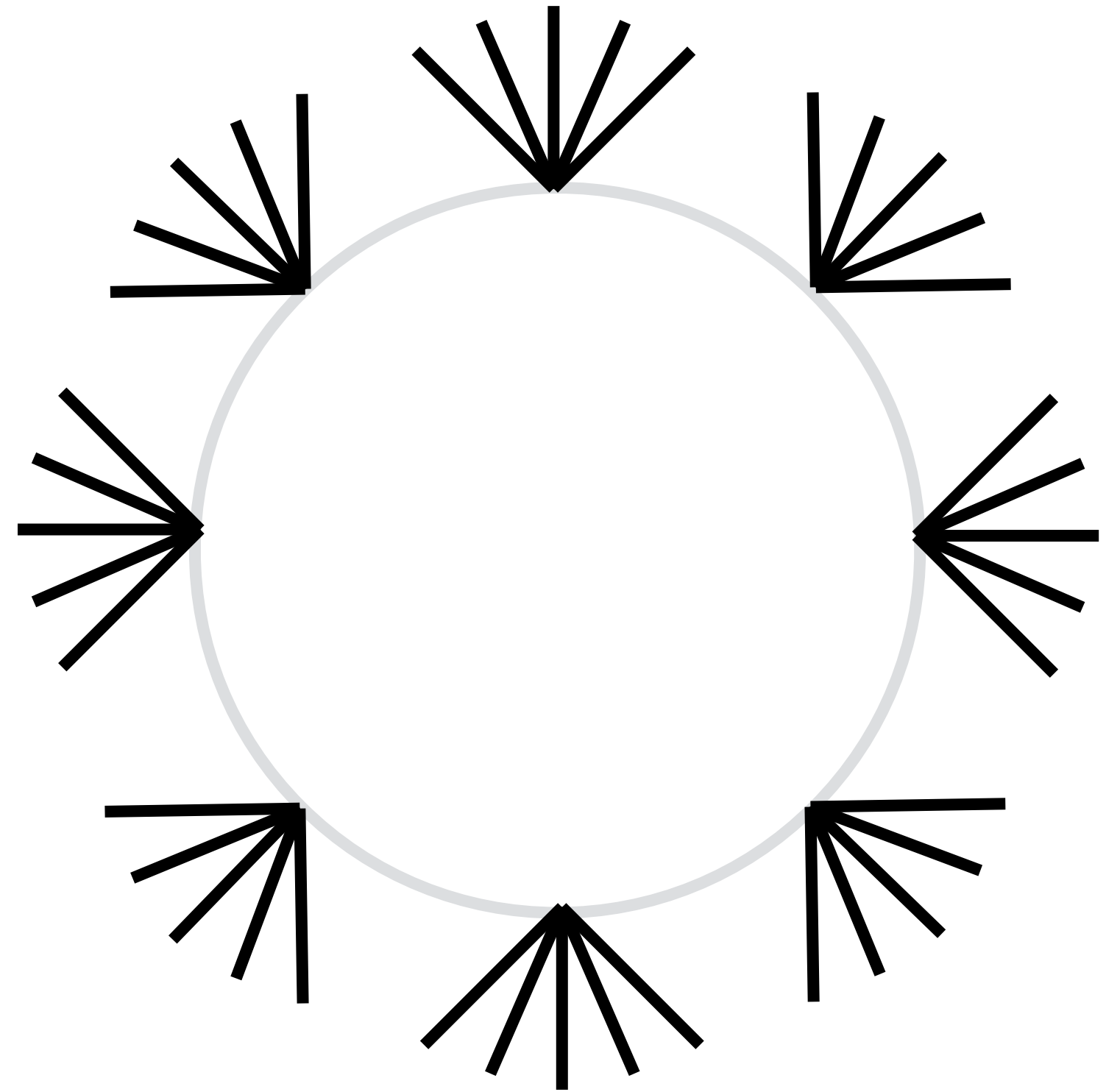
DIAMETER	11 cm
WEIGHT	approximately 480 g
CAMERAS	36 fixed-focus cameras
RESOLUTION	108 megapixels
PANONO APP	iOS 7+ and Android 4.2+
CHARGING	via USB cable
STORAGE CAPACITY	16 GB, approximately 600 Panono shots
CONNECTION	WiFi
SECURITY FEATURES	Theftprotect mode

**Panono 360 degree Camera**

# Stitching Challenges



Want this  
ray sampling



Get this  
ray sampling



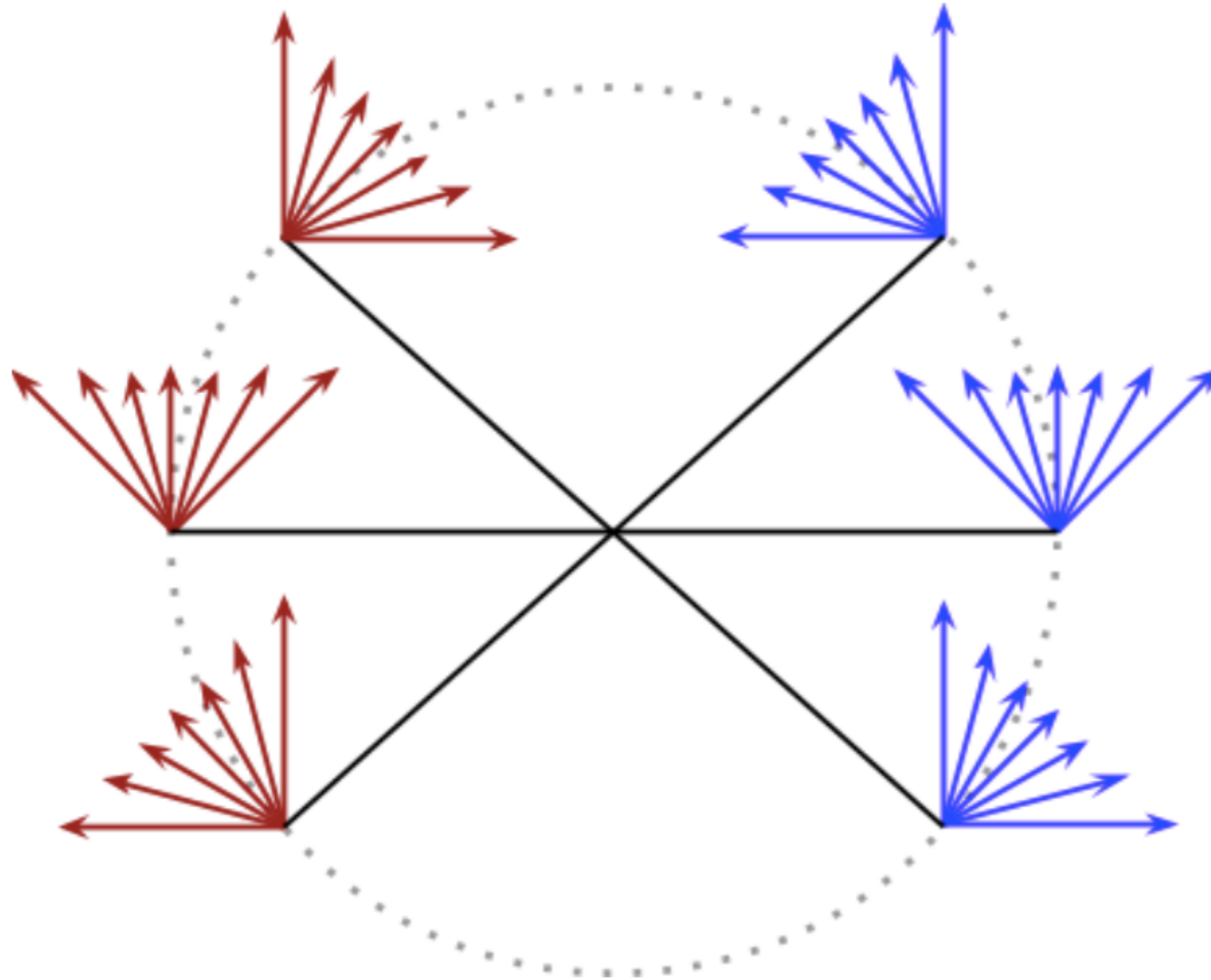
# **High Quality Stitching Solution Uses Computer Vision**

**Use computer vision techniques:**

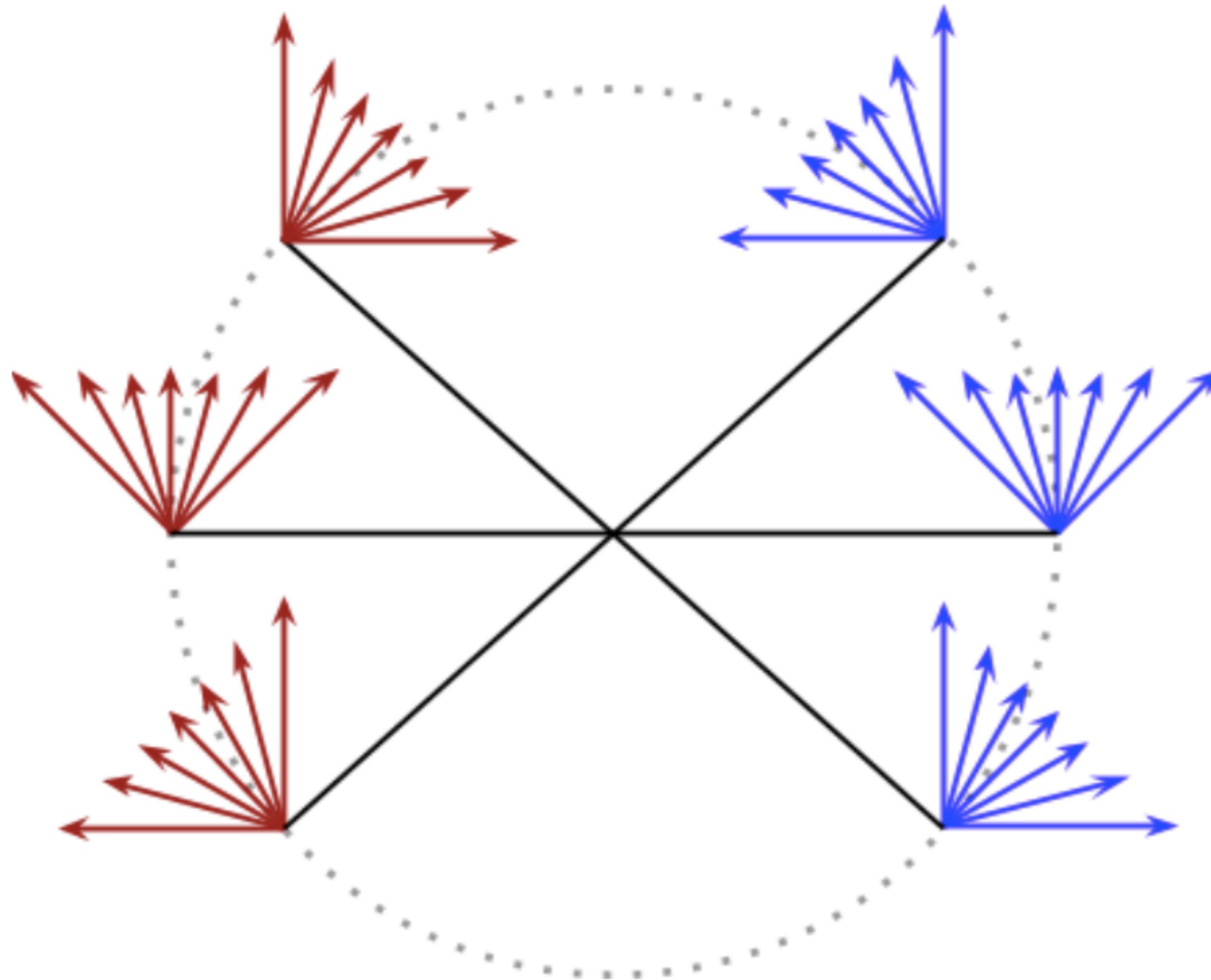
- **Detect image features (like SIFT features)**
- **Correlate features across frames (transform)**
- **Warp to align frames and blend**

# **Spherical Stereo Imaging**

# What Pairs of Viewpoint Positions Do We Want To Sample?

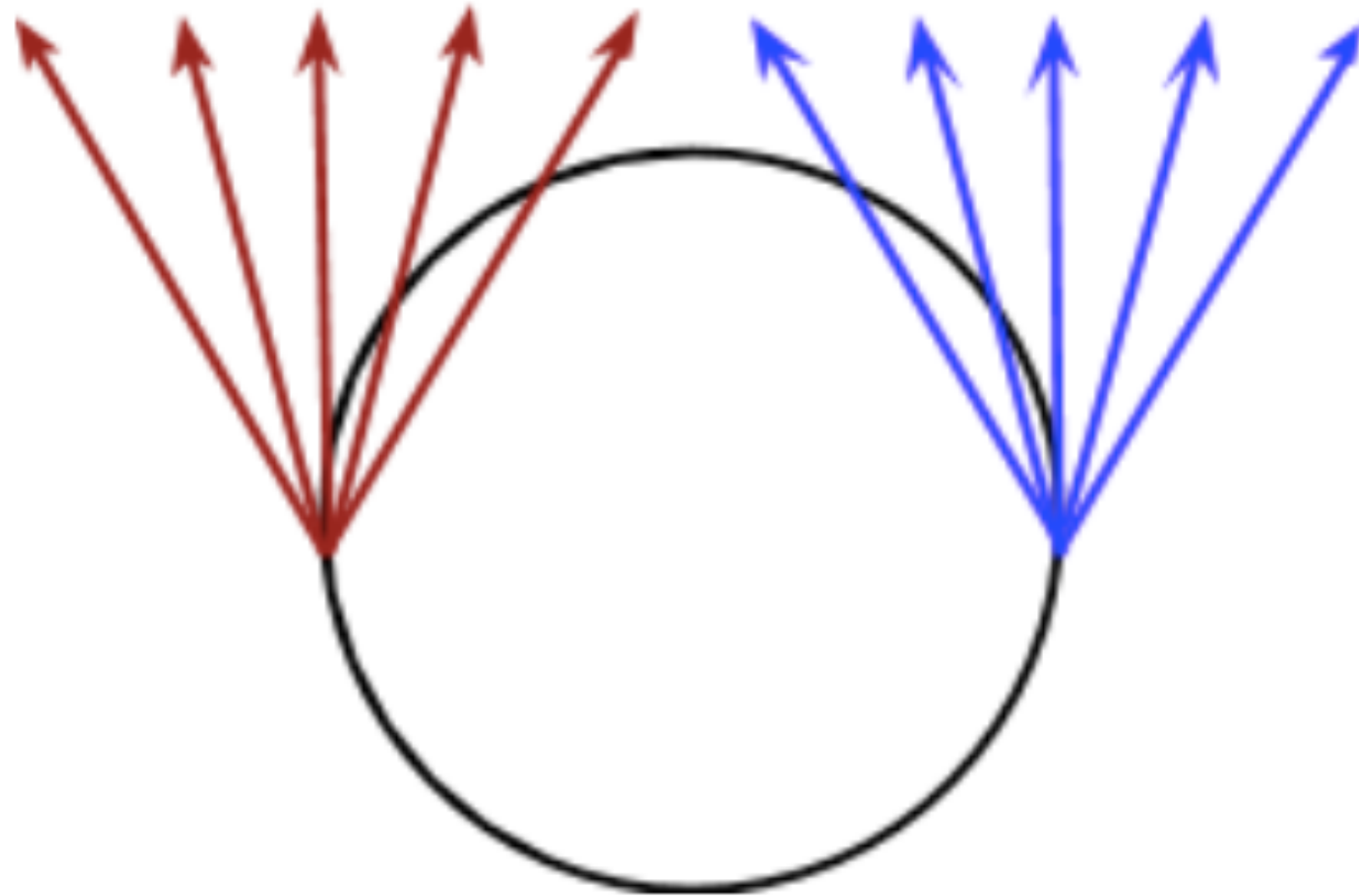


# Idea: Spin a Pair of Cameras About Midpoint

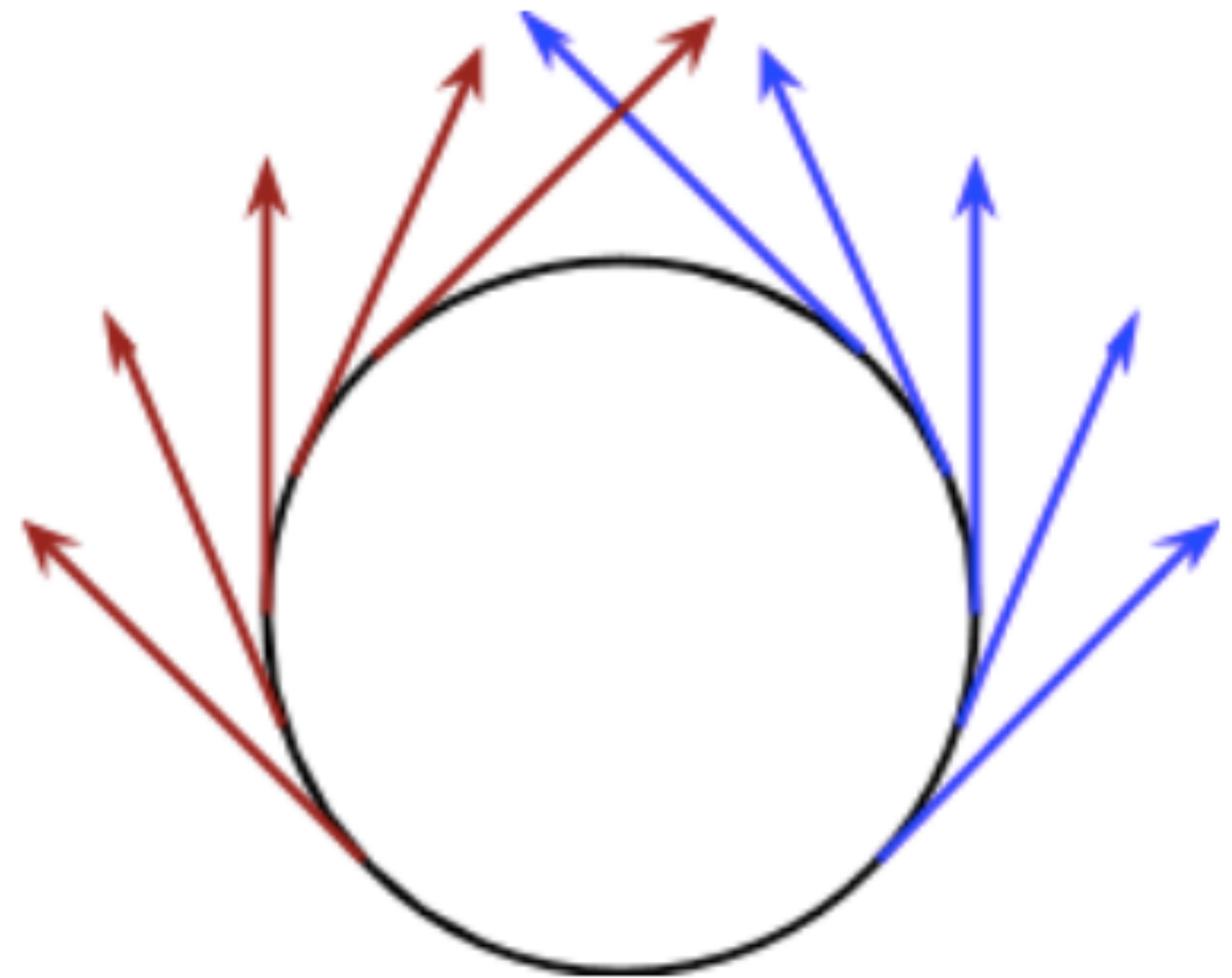


**Store a set of movie pairs (one per angle)  
But that's a lot of data**

# Omni-Directional Stereo Approximation

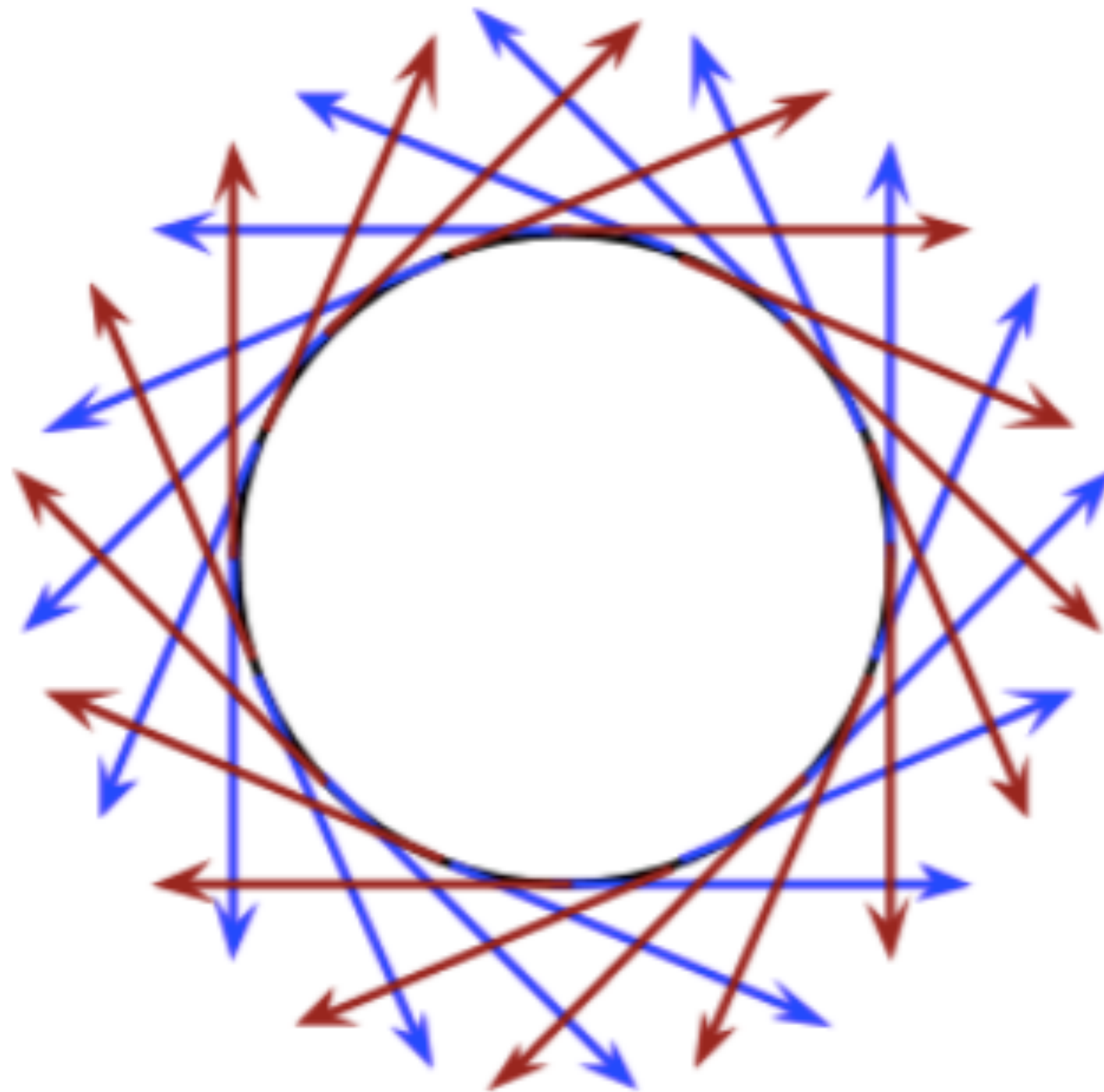


full-frame **left** and **right** eyes



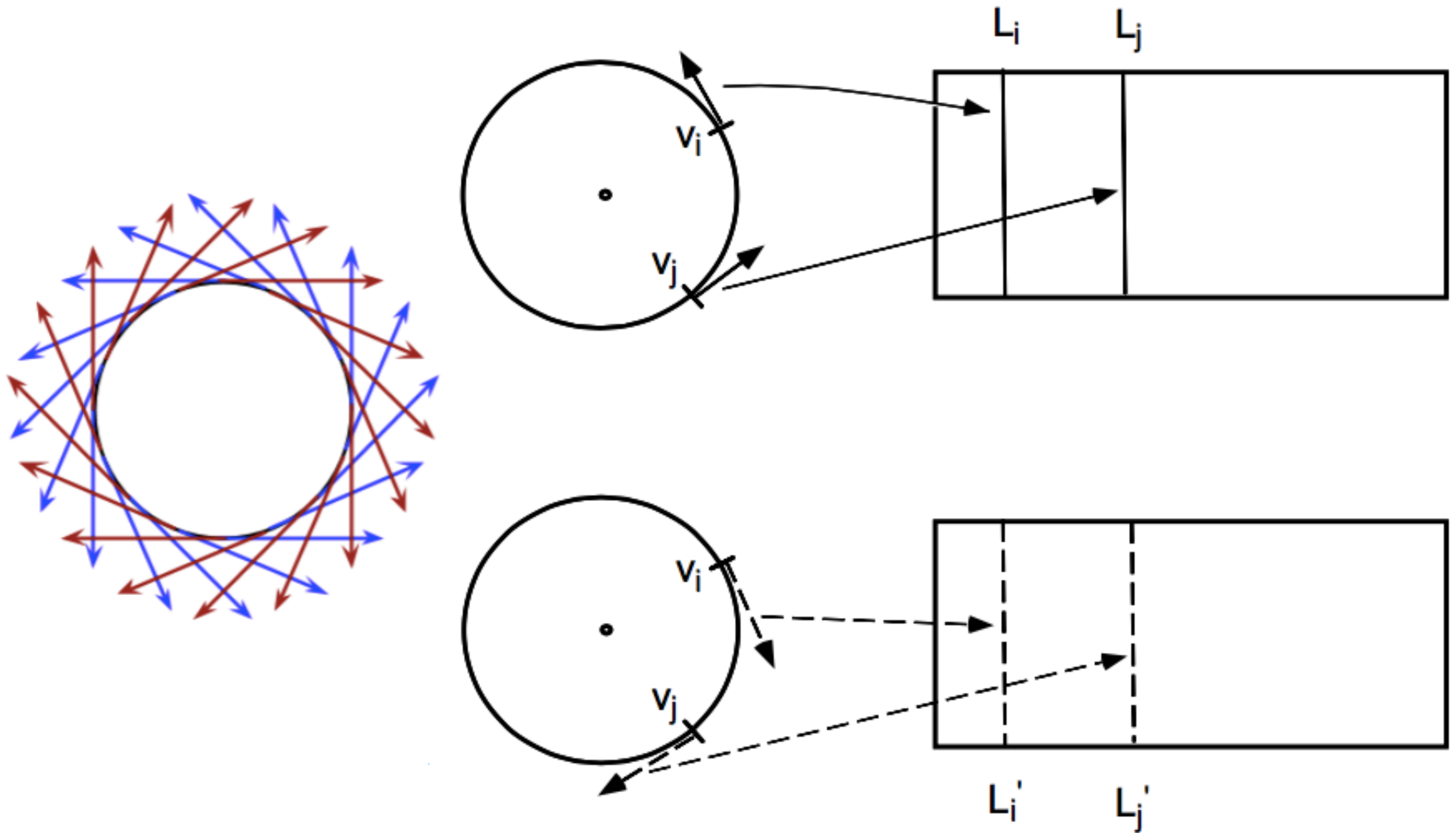
ODS-approximated **left** and **right** eyes

# Omni-Directional Stereo Approximation



Extended to be omnidirectional

# Spinning Camera



Concentric Mosaics

Shum and He, SIGGRAPH 1999

# Omni-Directional Stereo Representation

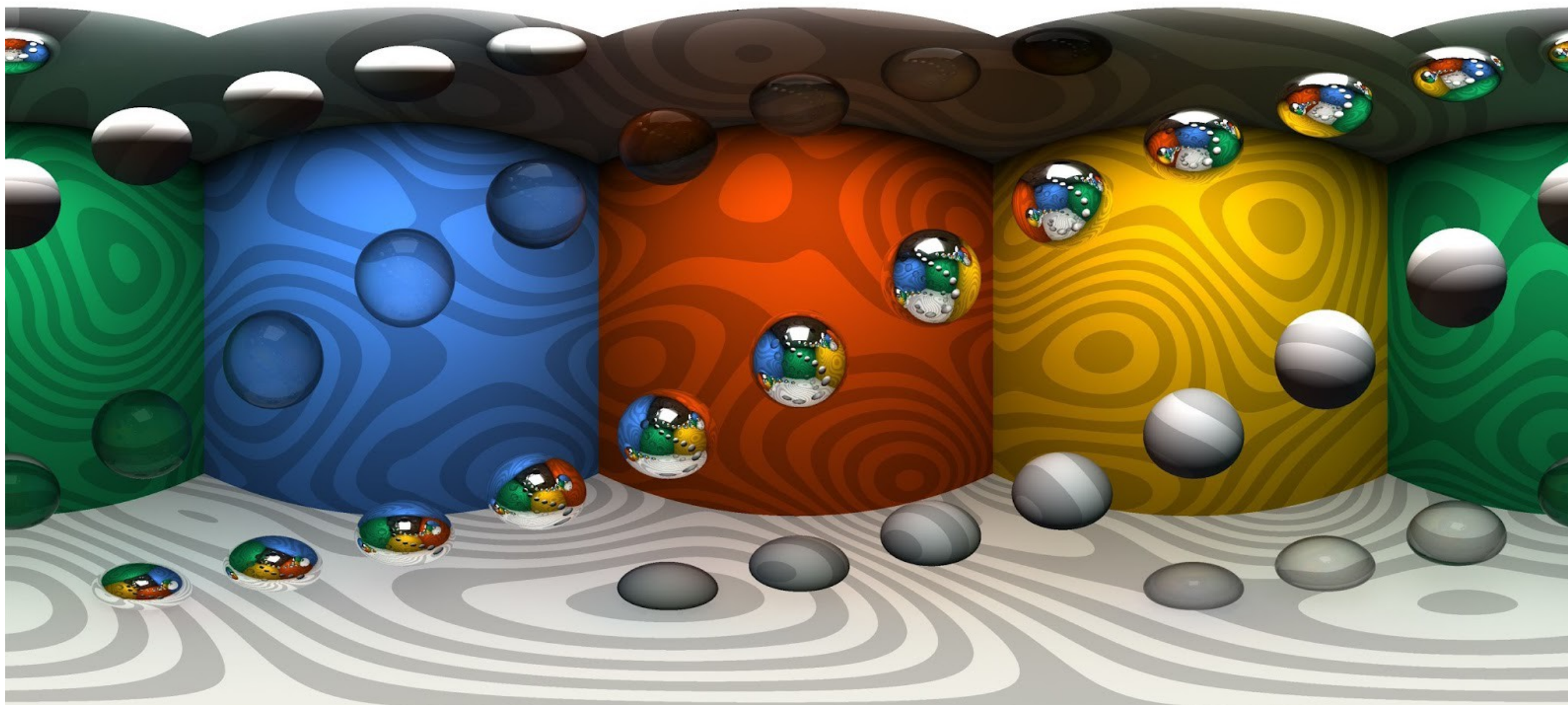
Encode left/right views as just two spherical images

- Render left and right views for each angular view independently, with regular viewing software
- Efficient and compact, but this is an approximation
  - Straight lines may appear slightly curved
  - Vertical disparity for close objects incorrect

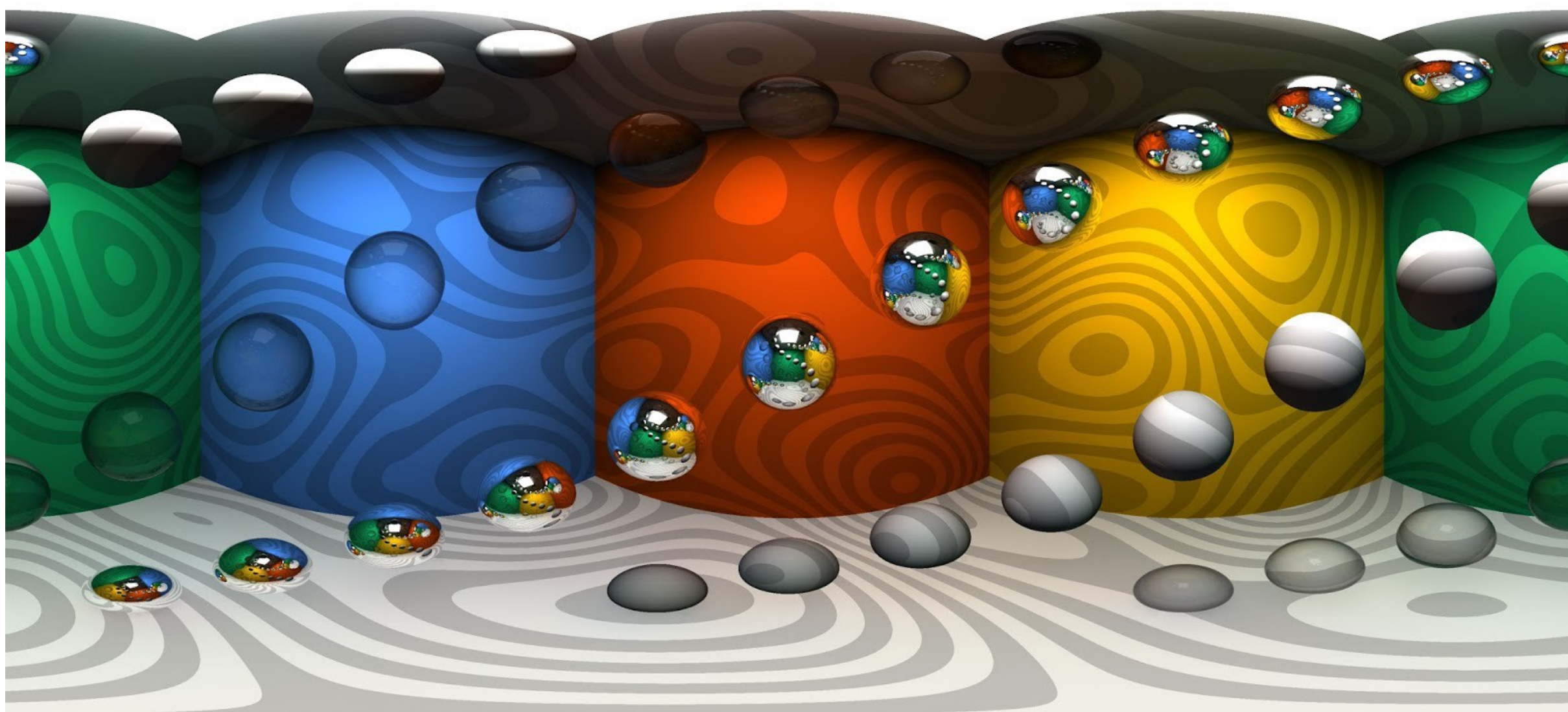


# Example (Rendered)

Left Eye



Right Eye

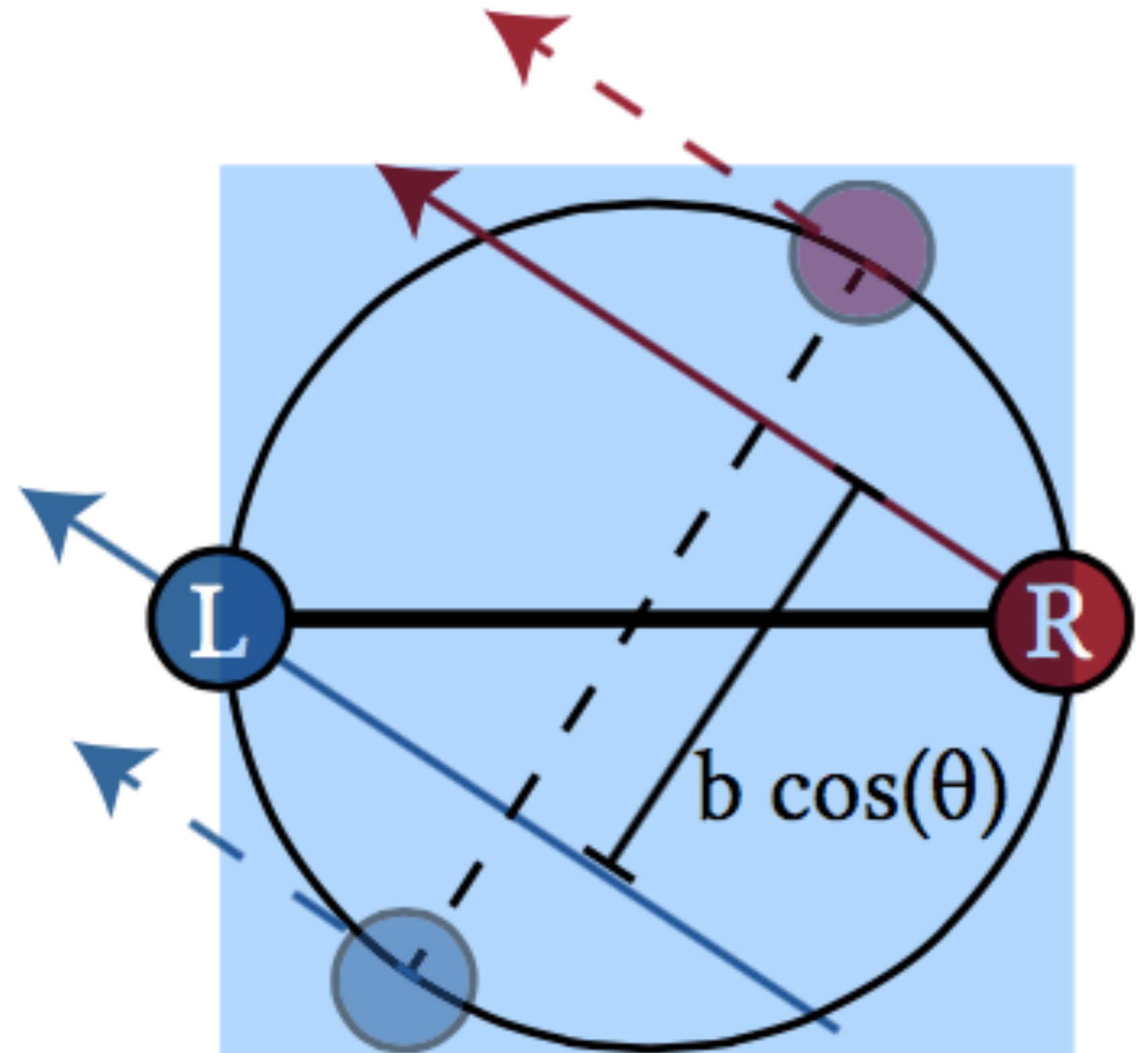
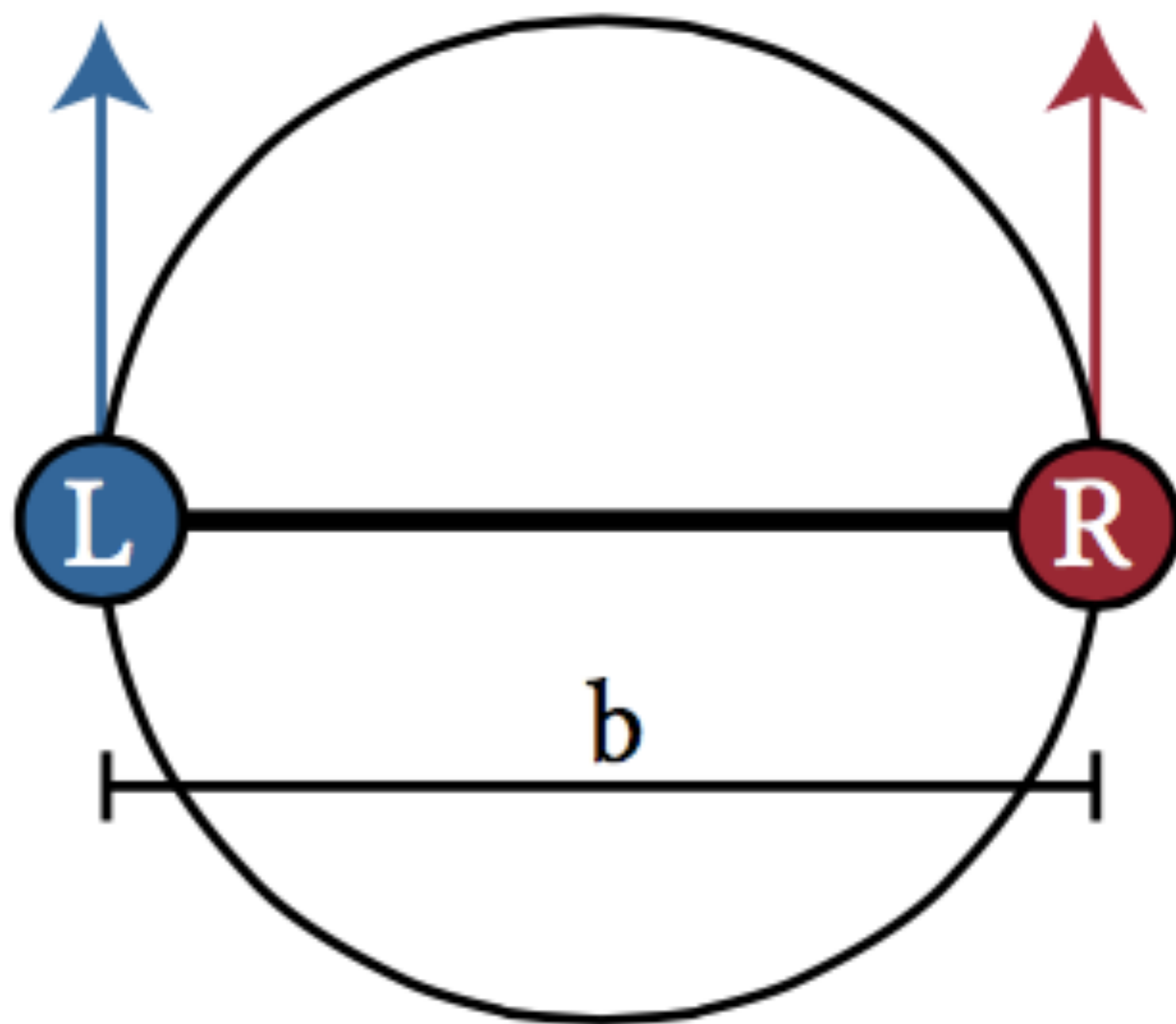


# Two Eyes — Two Spherical Cameras?



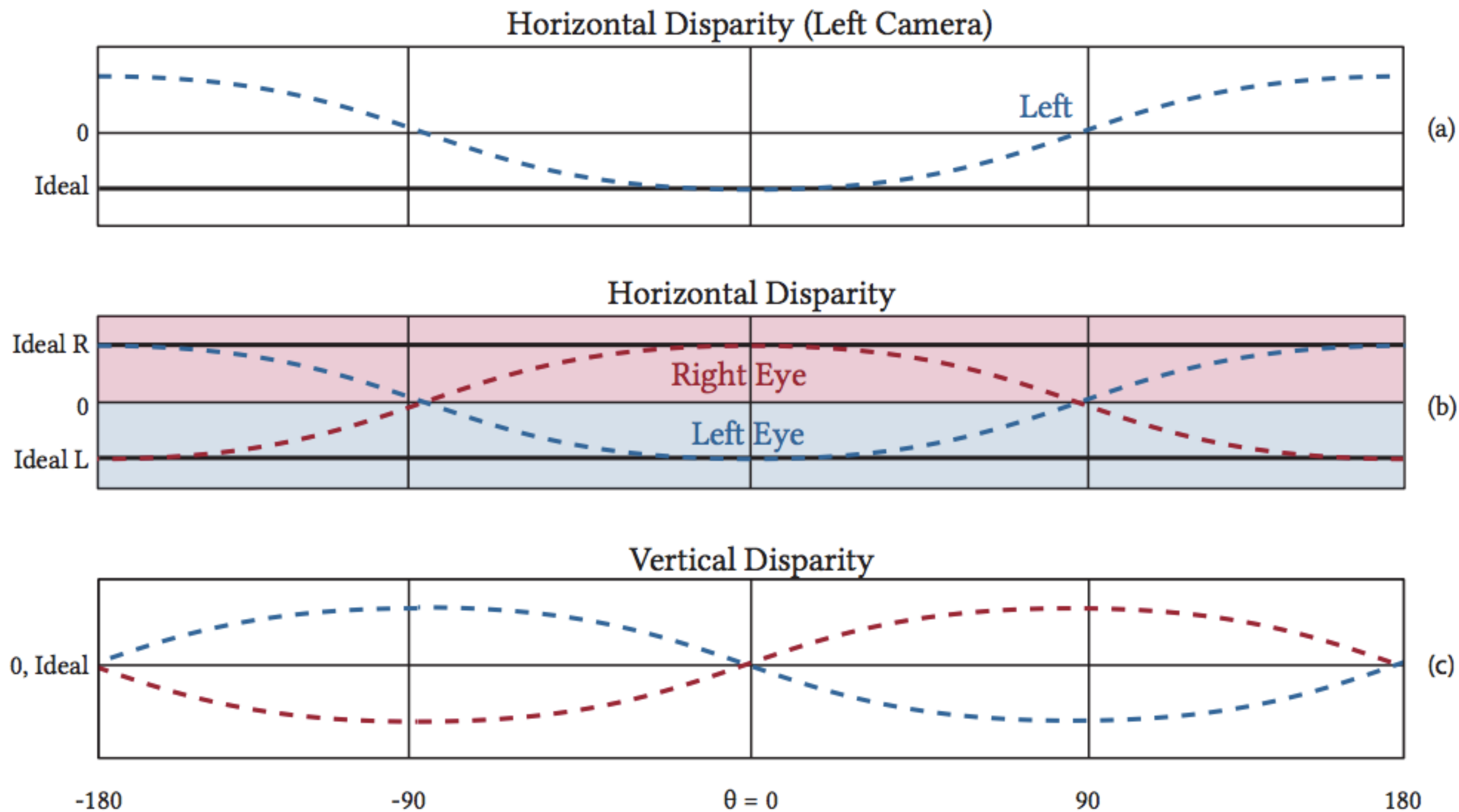
**Matzen et al. SIGGRAPH 2017**  
**Low-Cost 360 Stereo Photography**  
**and Video Capture**

# Problem: Stereo Baseline Fluctuates With View Angle



Apparent stereo baseline decreases by  $\cos(\theta)$  if rays are mapped directly

# Problem: Both Horizontal and Vertical Disparities Fluctuate



# Problems

- **Disparity: incorrect baseline as view angle changes**
- **Occlusion: each camera blocks the other's view!**

# Solution: Computational Photography

## 3D reconstruction

- Computer vision on stereo views

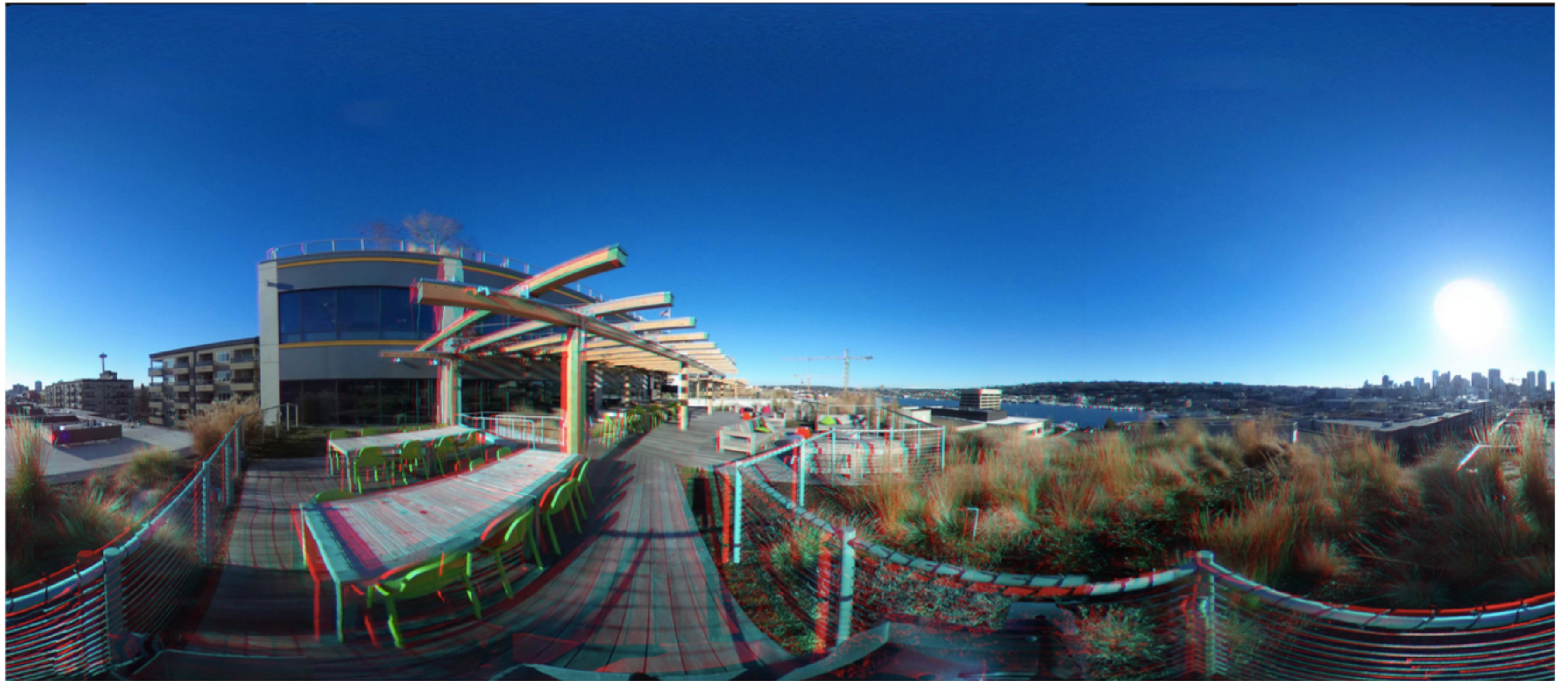
## Disparity correction

- Use 3D model to correct stereo disparities
  - e.g. amplify horizontal disparities by  $1/\cos(\theta)$
- Flip views when facing backwards

## Hole filling

- Cut out view of other camera, and fill hole with pixels from other camera, as best possible

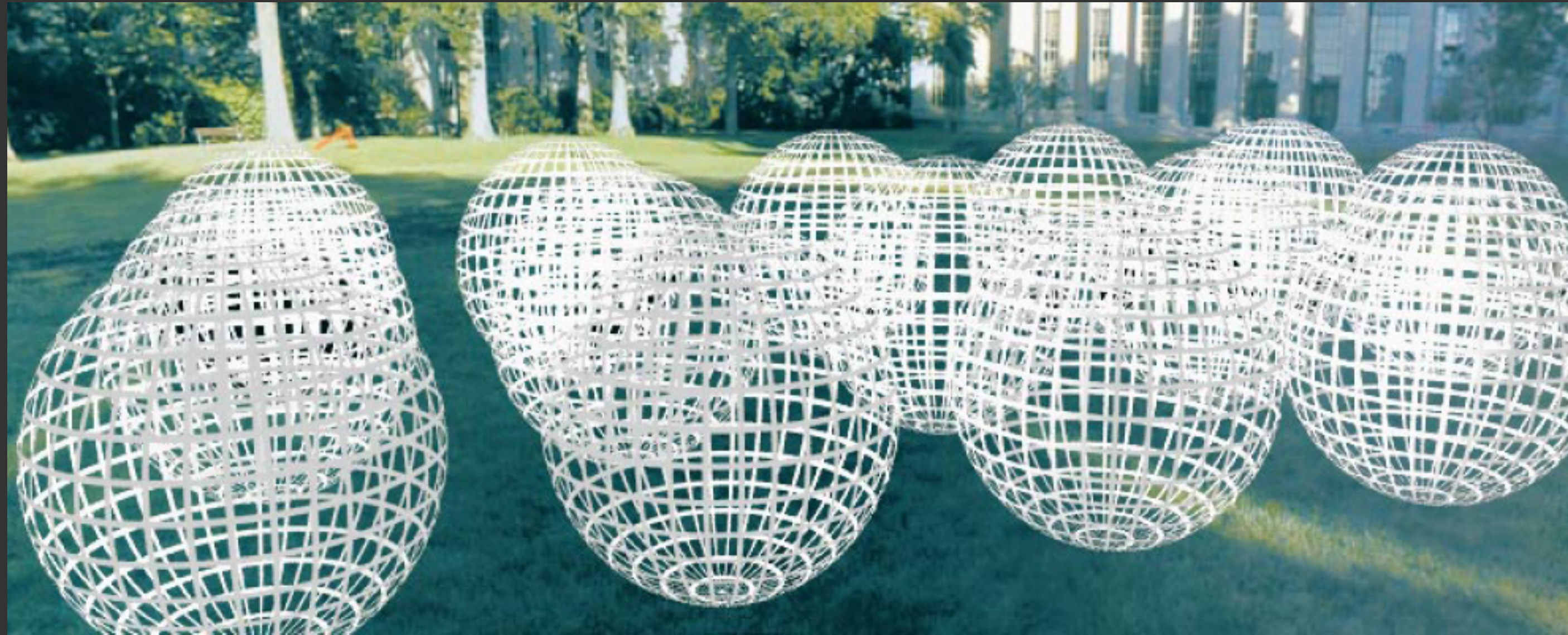
# Spherical Stereo Result



# **Moving-Viewpoint Imaging (Full Plenoptic Function?)**

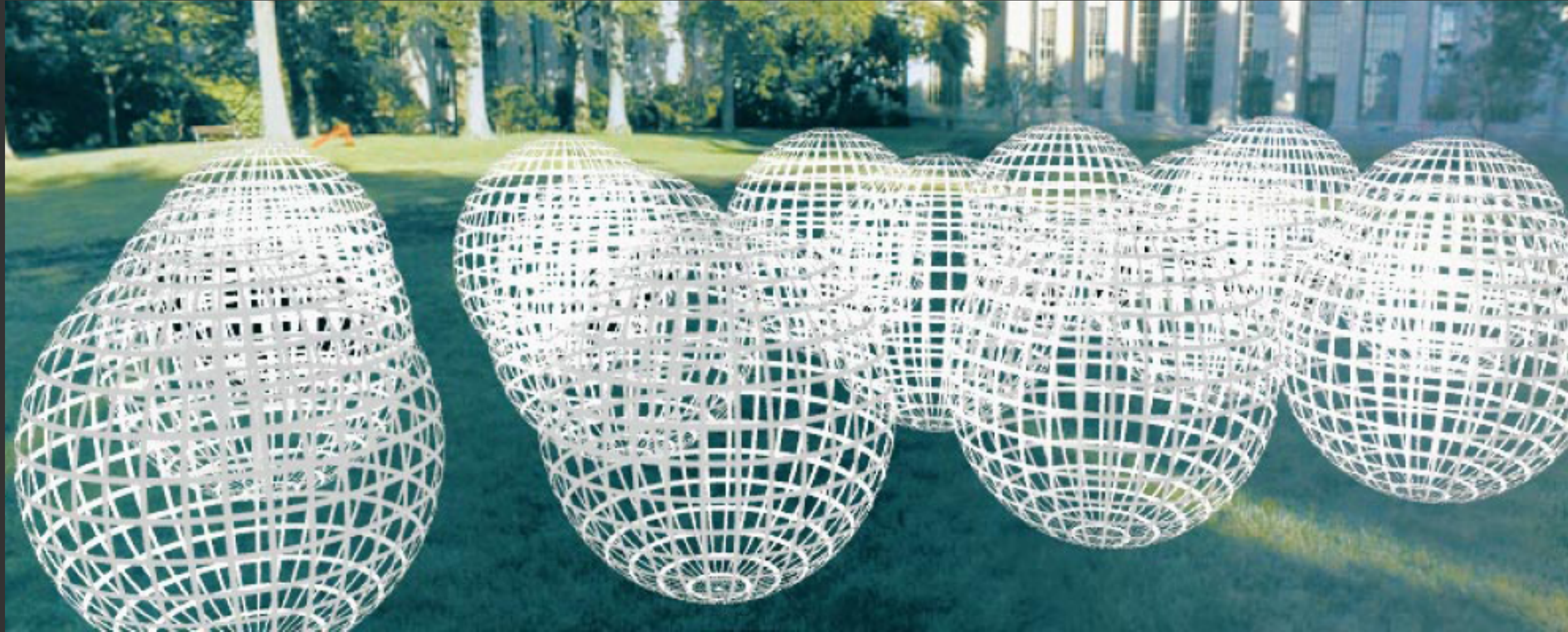


# The 5D Plenoptic Function



$$P(\theta, \phi, V_x, V_y, V_z)$$

# 4D Light Field



$$P(\theta, \phi, V_x, V_y) = P(u, v, s, t)$$

- In a region of free-space, 5D plenoptic function simplifies to 4D because light is constant along a ray

# Light Field Capture Robot

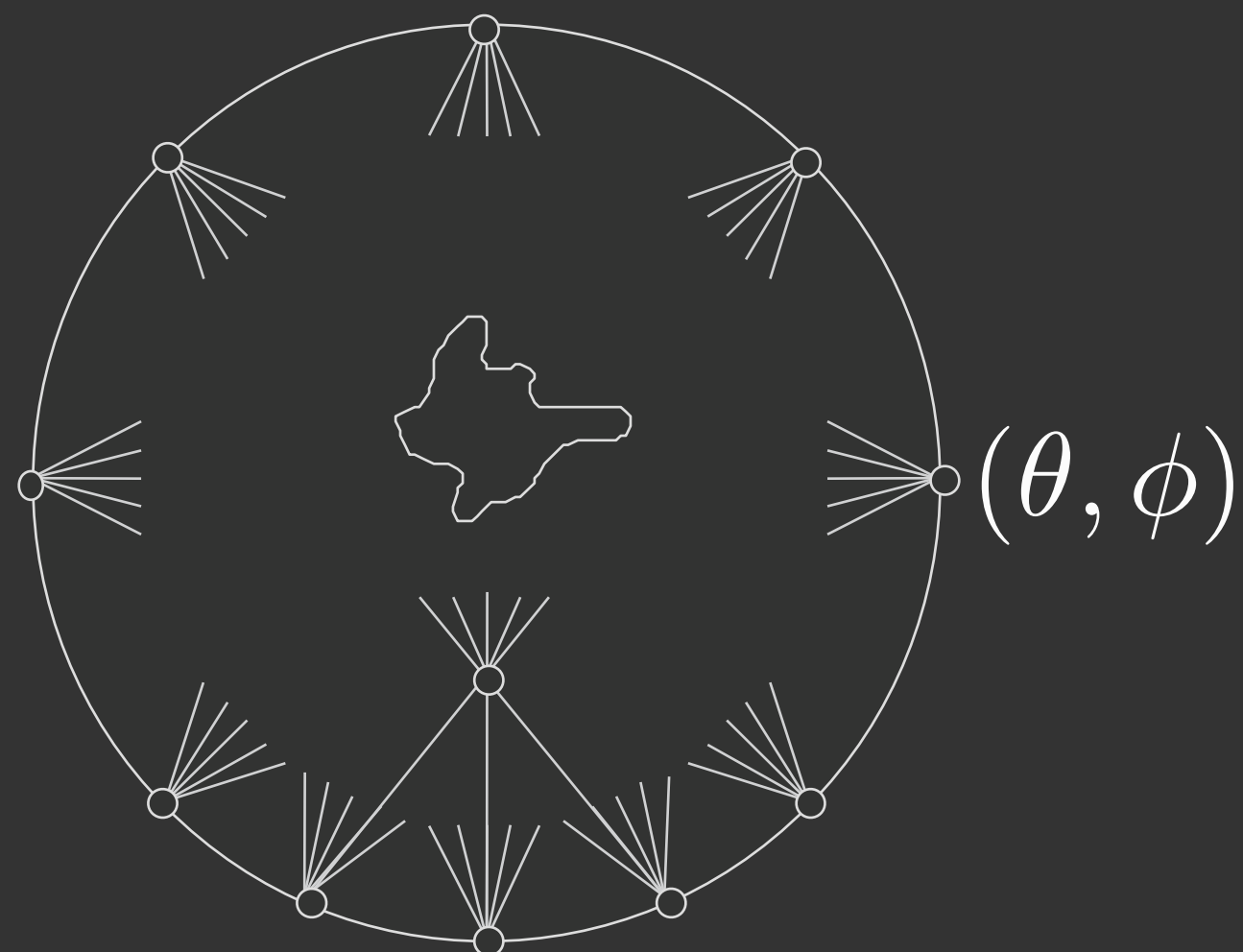
---

Original light field rendering paper

Take photographs of an object from all points on an enclosing sphere

Captures all light leaving an object – like a hologram

$$L(x, y, \theta, \phi)$$



# Multi-Camera Array $\Rightarrow$ 4D Light Field



[Wilburn et al. SIGGRAPH 2005]

Slide credit: Pat Hanrahan



[Wilburn et al. SIGGRAPH 2005]

# Handheld 4D Light Field Camera (Plenoptic Camera)

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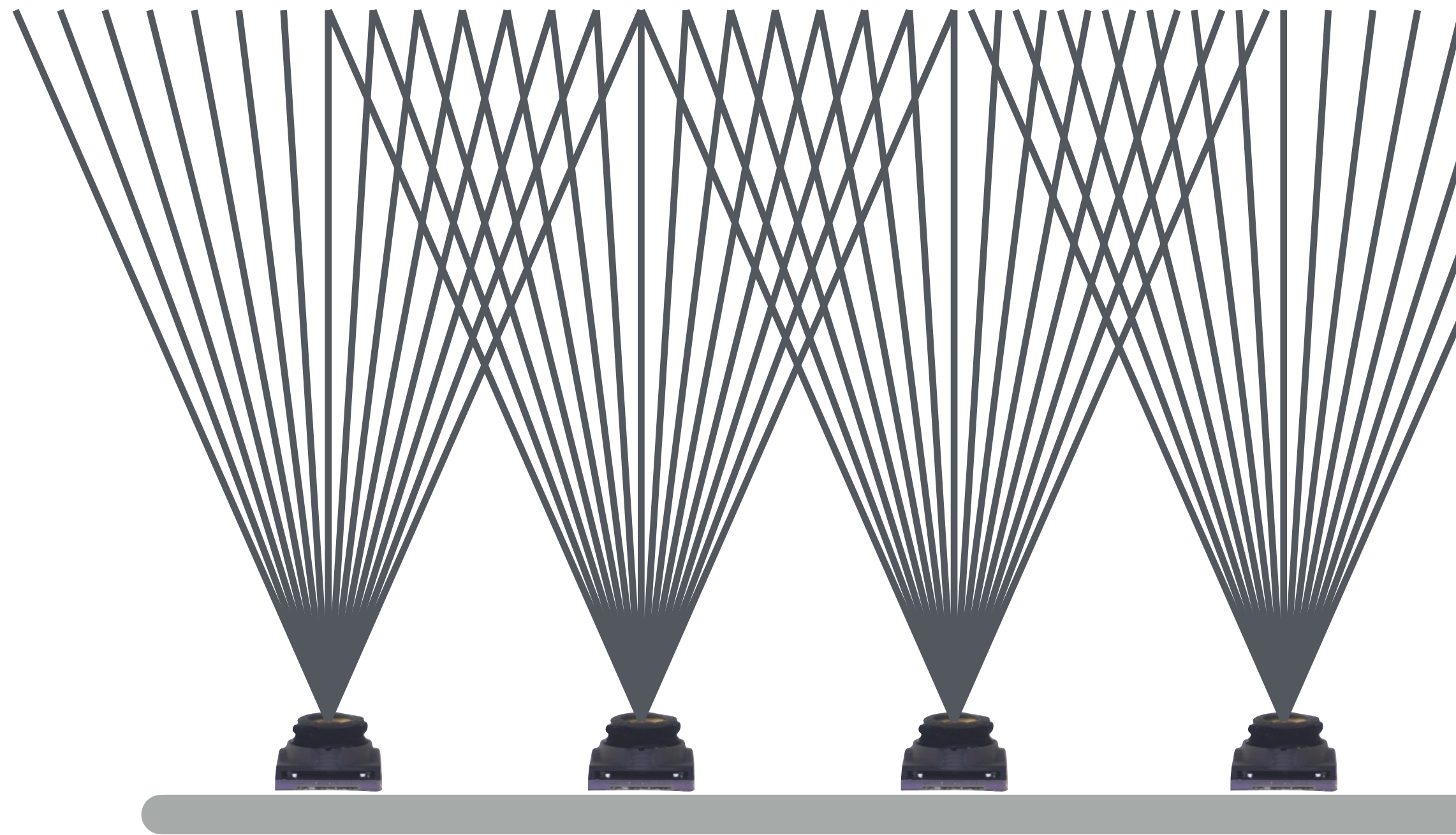
Lytro Gen-2 Light Field Camera



# Handheld Light Field Camera vs Camera Array



Amateur Photographer



**Camera array: e.g. 10x10 views distributed across large planar support**

**Plenoptic camera: e.g. 14x14 views distributed across small lens pupil**  
**Note: antialiased across views, unlike camera array**



# The Intimacy of VR Graphics

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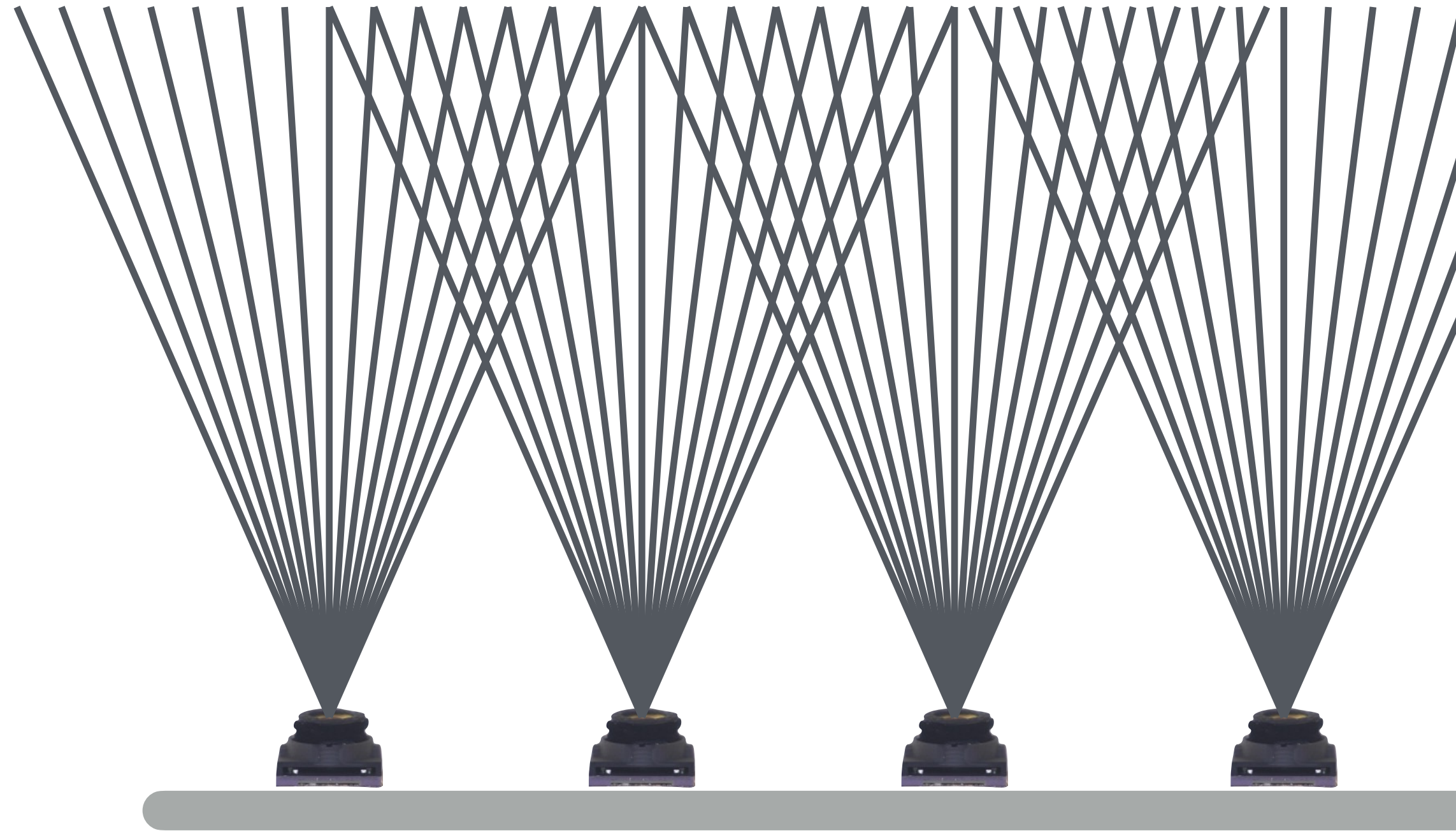


Google's Tilt Brush on HTC Vive



**A Challenge: Intimate Proximity in VR Imaging**

# How Dense Are Camera Views Today?

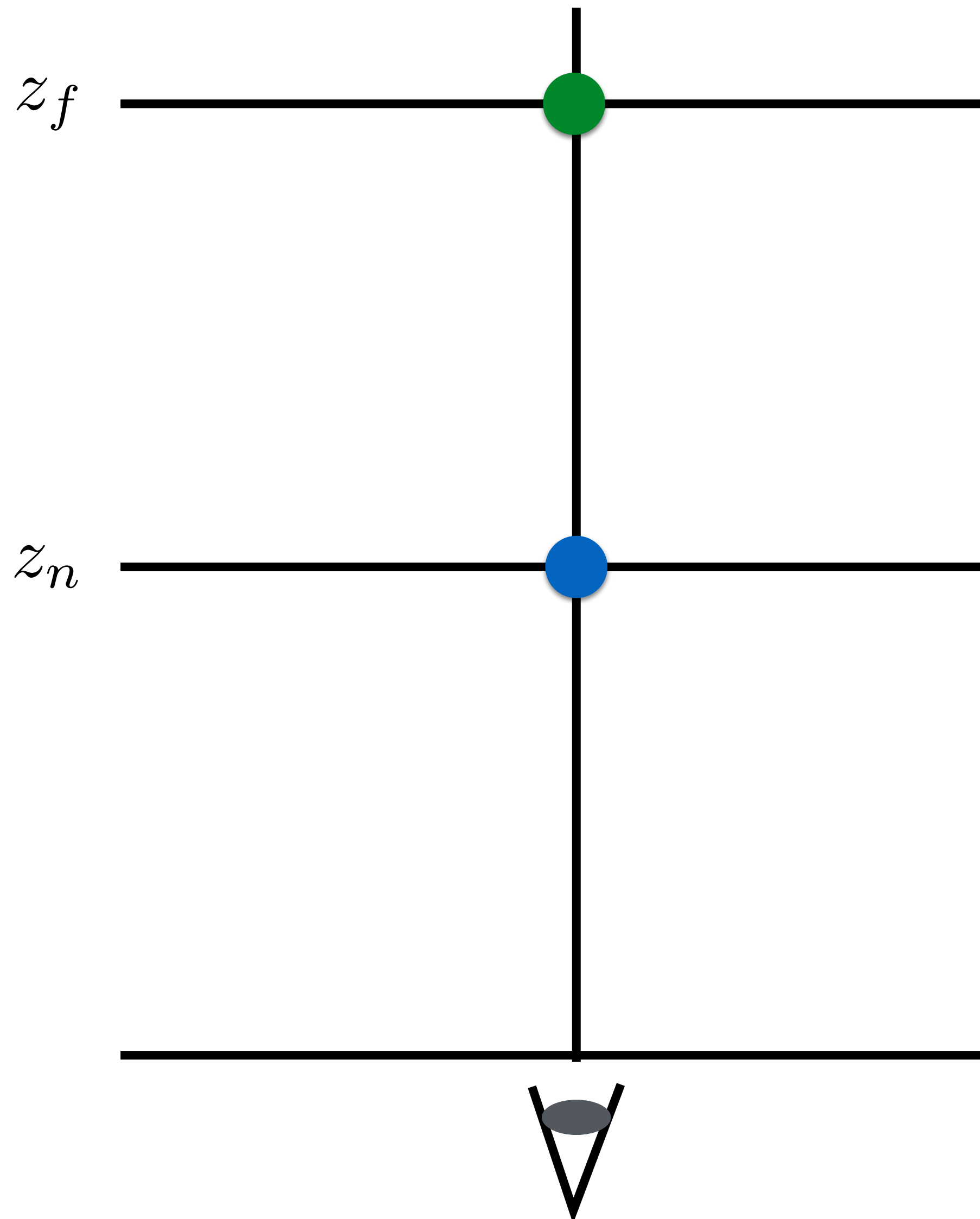


<b>Multi-camera arrays:</b>	<b>50 - 100 views</b>
<b>Plenoptic cameras:</b>	<b>100 - 200 views</b>



**How Dense Must Cameras Views Be?**

# How Dense Must Camera Views Be?



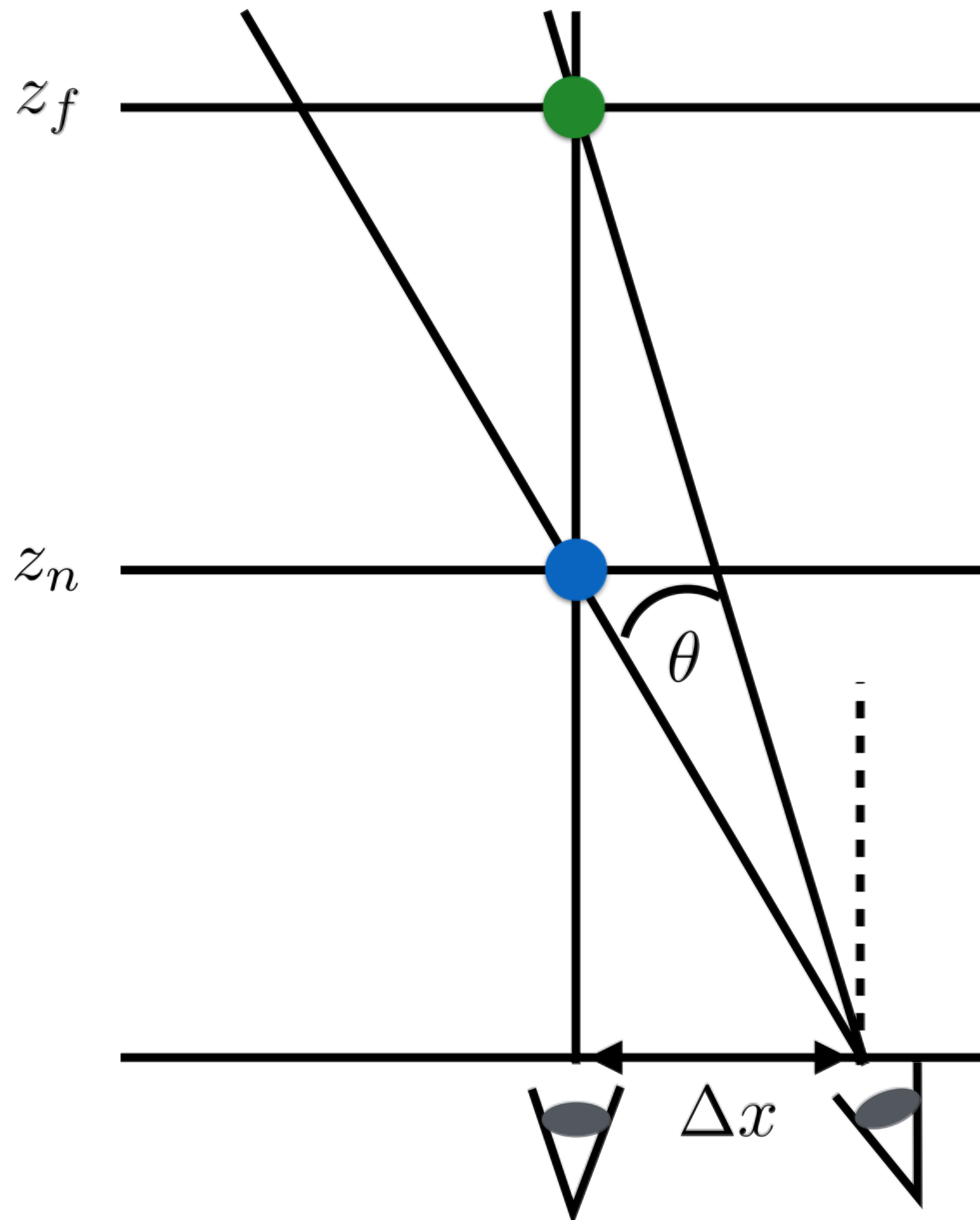
Child in lap, front to back of head



$$z_n = 0.3\text{m}$$

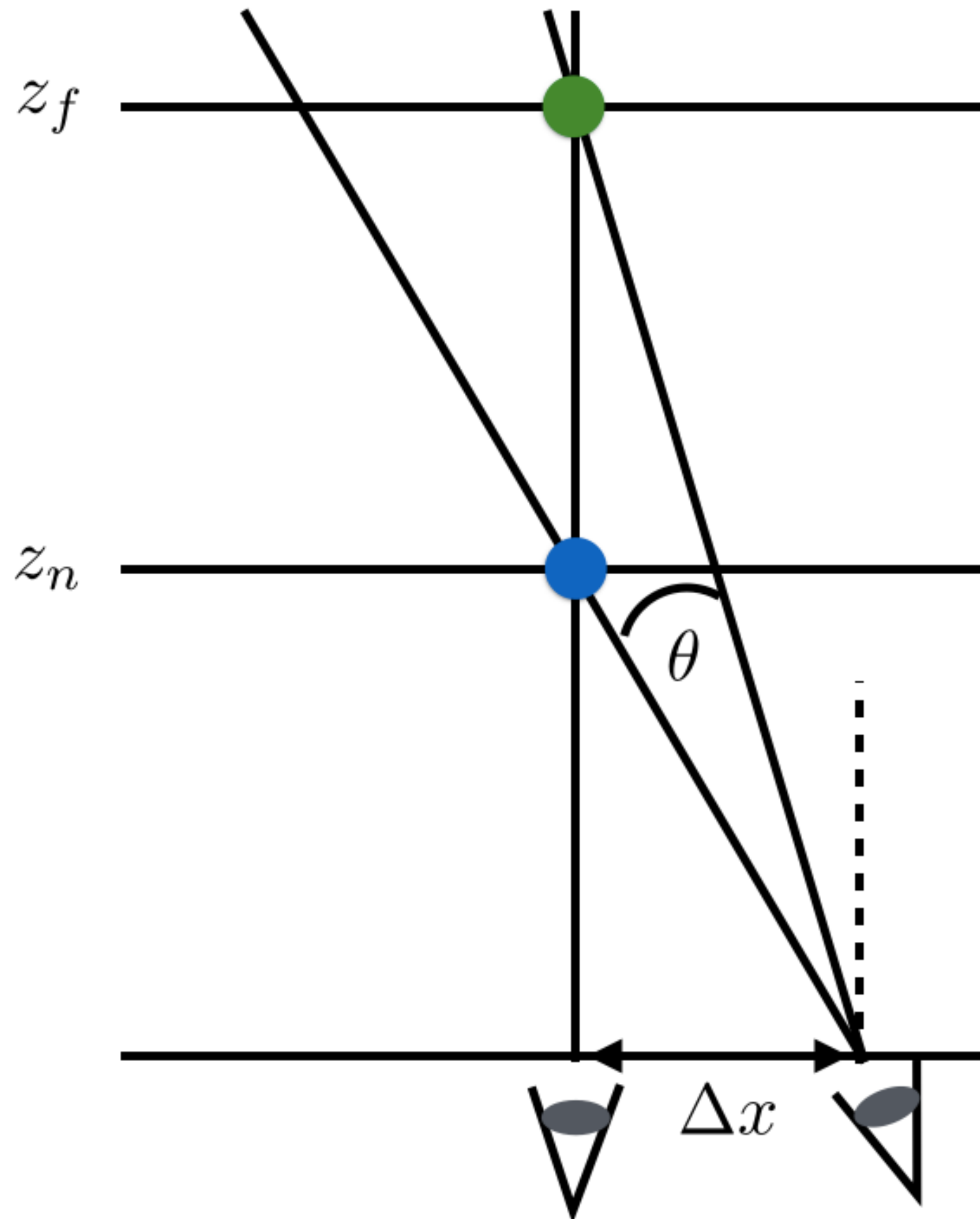
$$z_f = 0.6\text{m}$$

# How Dense Must Camera Views Be?



What is the minimum lateral eye movement  $\Delta x$  so that we can visually distinguish the close and far features?

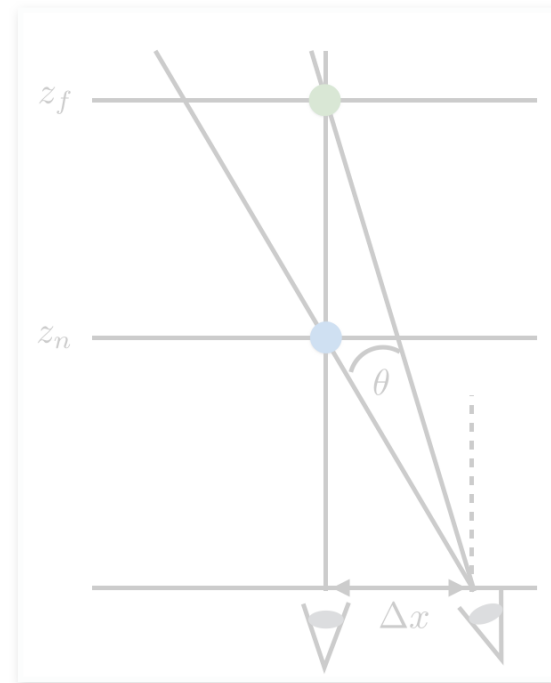
# How Dense Must Camera Views Be?



20/20 vision:  $\theta \approx (1/60)^\circ$

Current HMDs:  $\theta \approx (1/10)^\circ$

# How Dense Must Camera Views Be?



Solving for minimum lateral motion:

$$\Delta x = \frac{(z_f - z_n) - \sqrt{(z_f - z_n)^2 - 4 \tan^2 \theta z_n z_f}}{2 \tan \theta}$$

Child in lap, front to back of head



$z_n = 0.3\text{m}$

$z_f = 0.6\text{m}$

20/20 vision:  $\theta \approx (1/60)^\circ \implies \Delta x \approx (1/1719)\text{ft}$

Current HMDs:  $\theta \approx (1/10)^\circ \implies \Delta x \approx (1/286)\text{ft}$

**20/20 vision:**

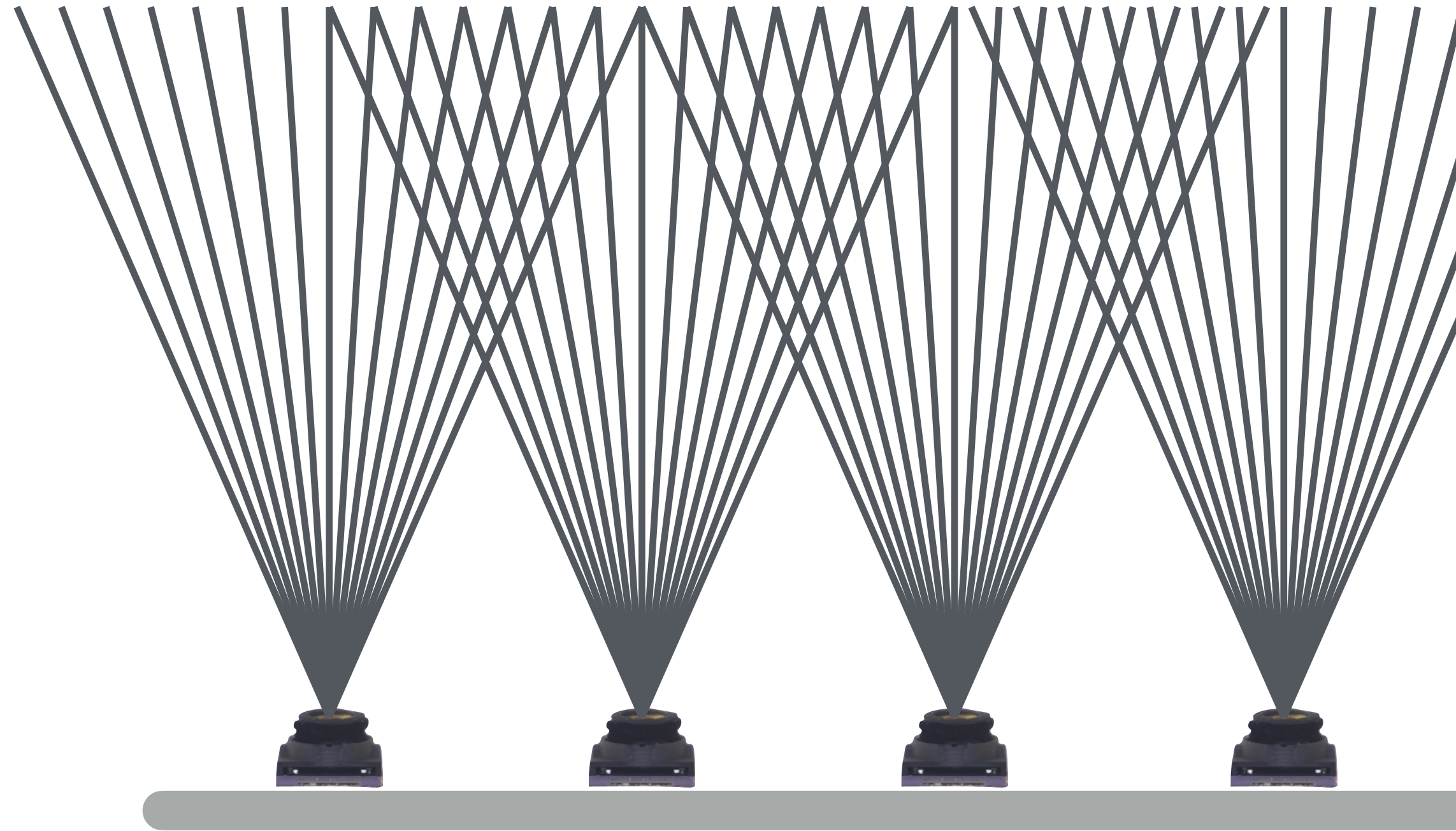
**millions of views per square foot**

**Current HMDs:**

**a hundred thousand views per square foot**

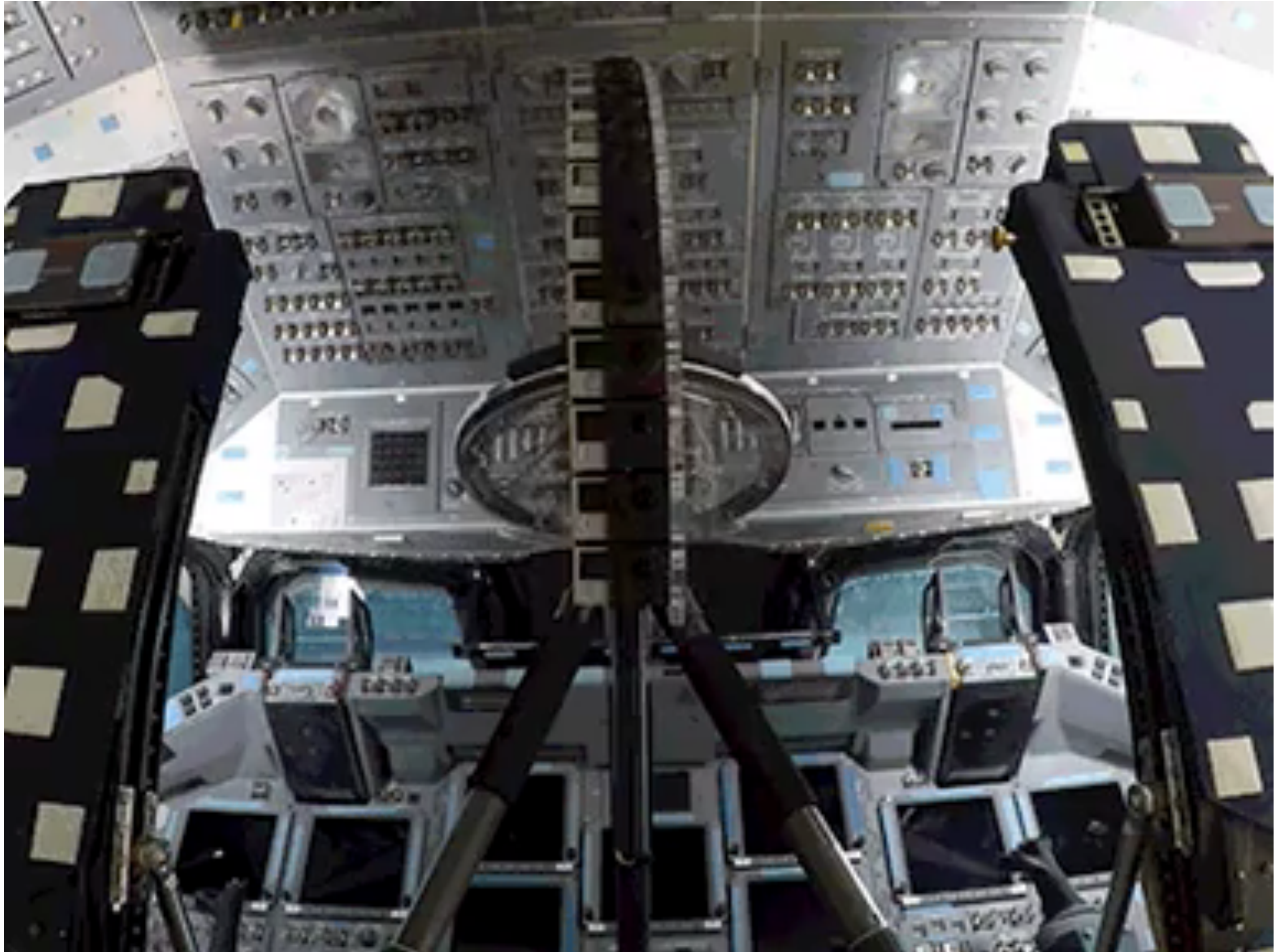


# How Dense Are Camera Views Today?



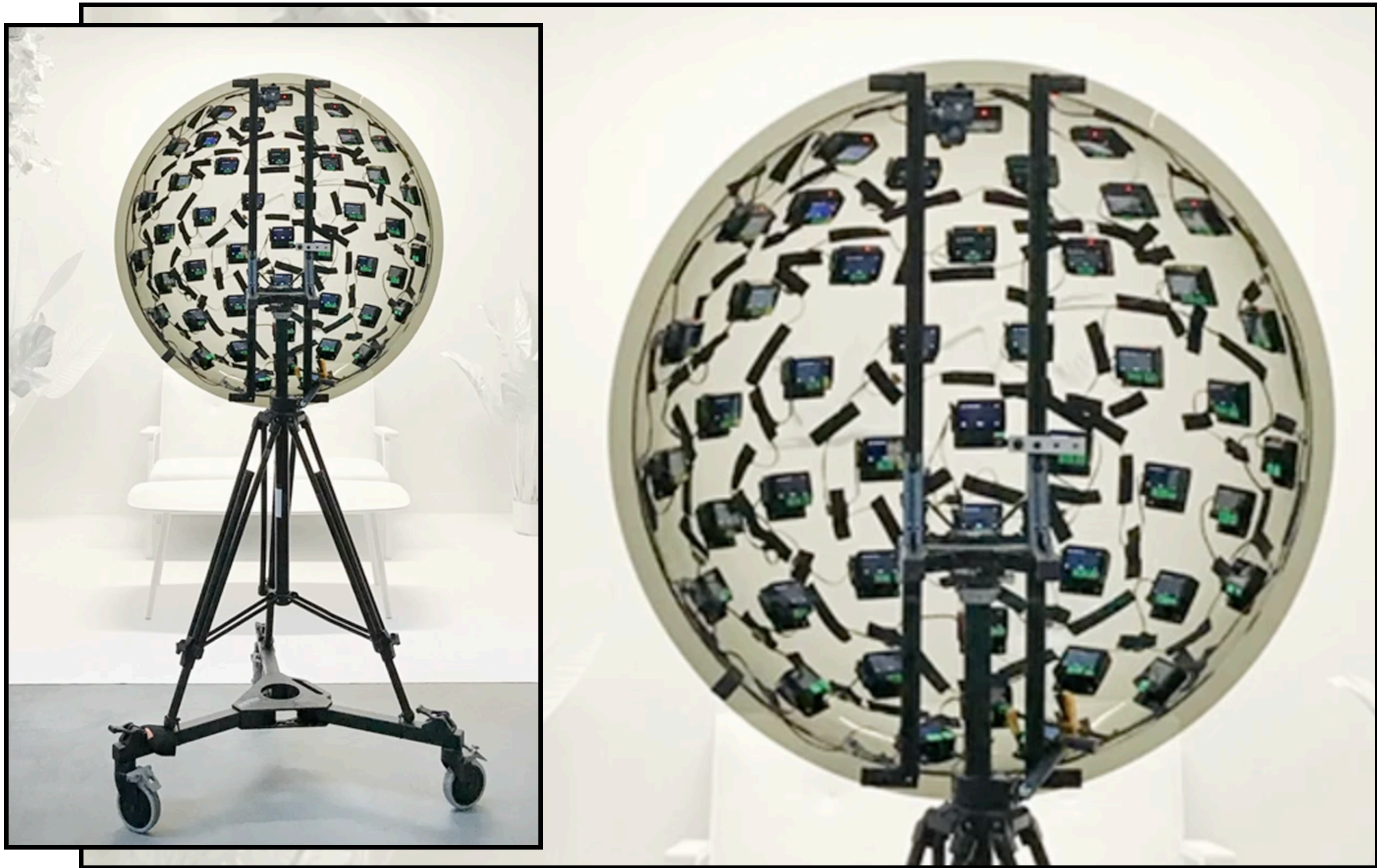
<b>Multi-camera arrays:</b>	<b>50 - 100 views</b>
<b>Plenoptic cameras:</b>	<b>100 - 200 views</b>

# Google VR Camera Rig



Paul Debevec, Google

# Imaging for Virtual Reality



Google 6 DOF Light Field Camera. Broxton et al. 2019.

# Imaging for Virtual Reality



Google 6 DOF Light Field Camera. Broxton et al. 2019.

# Active Area of Research

One important theme is applying machine learning to intelligently up-sample from tens of camera views to the very high sampling rates required for Nyquist-sampled VR rendering.

See research from my grad students Pratul Srinivasan, Ben Mildenhall and Matt Tancik in recent years on this topic, especially NERF project. This is ML-based inference of 3D volume function of the scene from a handful of photos.

**Matt Tancik will give a guest lecture next time on NERFs!**

# Things to Remember

VR presents many new graphics challenges!

## Displays

- Head-pose tracking with high accuracy and low latency

## Rendering

- Low-latency, high resolution & frame-rate, wide field of view, ...

## Imaging

- 360 spherical, stereo, light field

# **Acknowledgments**

**Thanks to Kayvon Fatahalian, Alyosha Efros, Brian Wandell and Pratul Srinivasan for lecture resources and slides!**