

# Structured Light Methods for Depth Recovery

Introduction to Computational Photography:

EECS 395/495

Northwestern University

# Structured Light Methods

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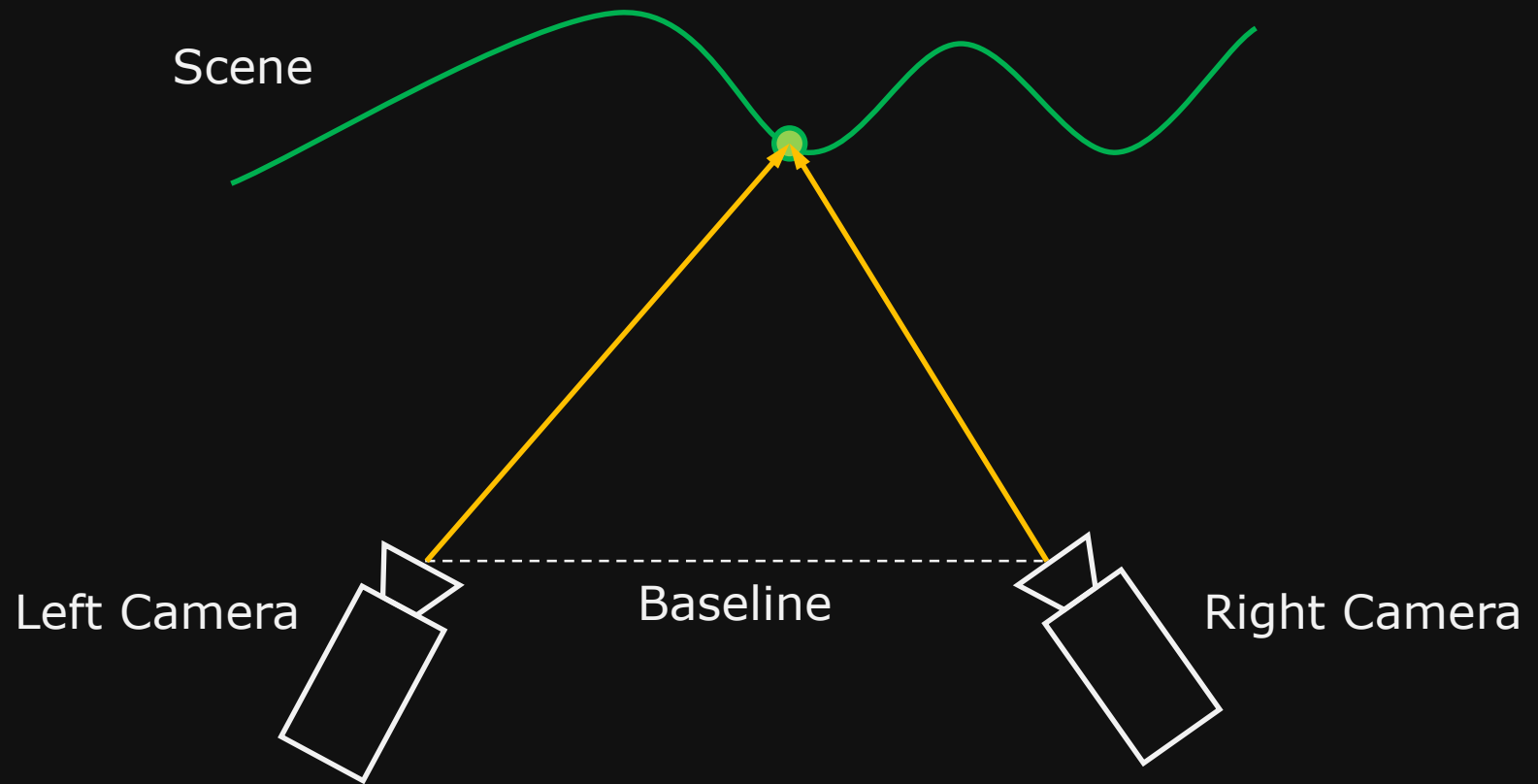
Finding depth using projected light patterns.

## Topics:

- (1) Active Stereo
- (2) Structured Light Range Finding
- (3) Binary and k-ary Structured Light Methods
- (4) Intensity Ratio Method
- (5) Phase Shift Method

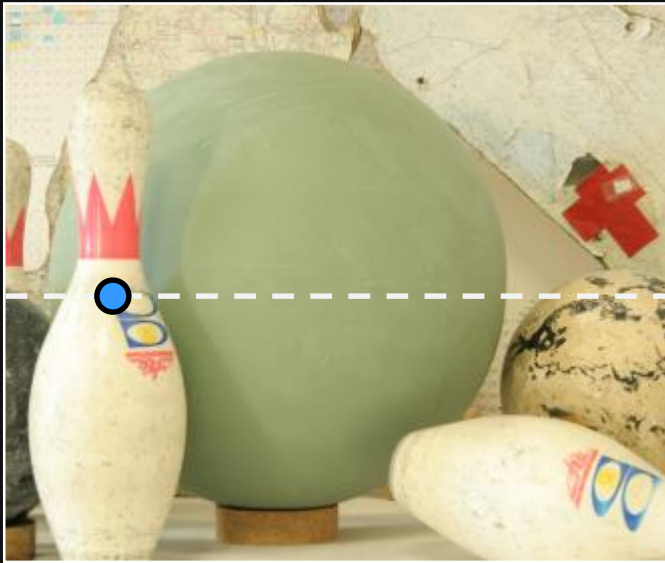
# Binocular Stereo

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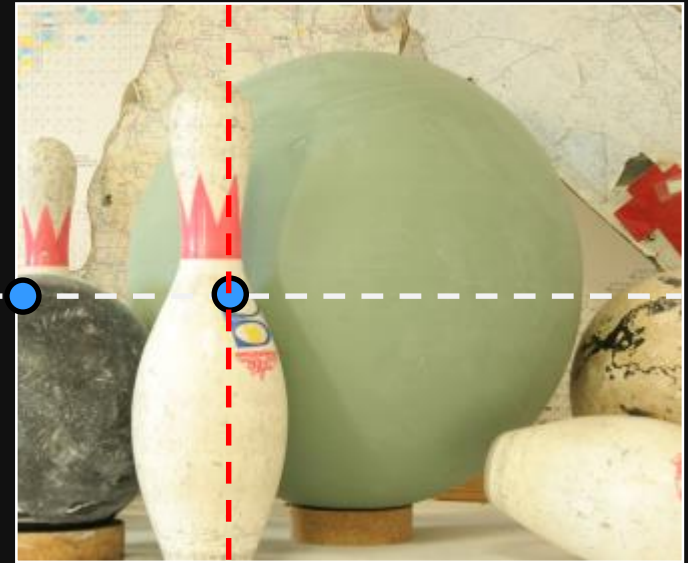


# Stereo Pair Correspondence

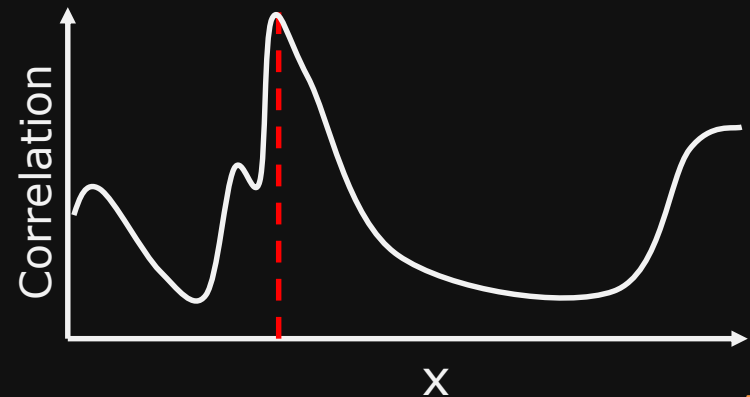
Left Image



Right Image

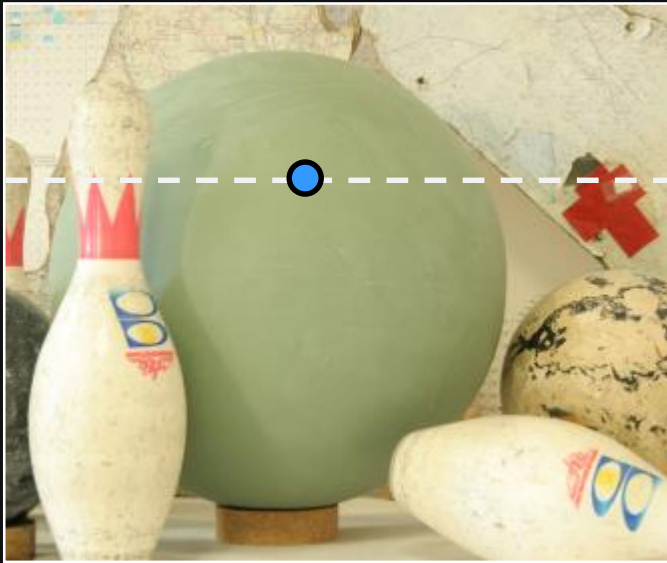


- Epipolar Constraint
- Window Based Matching (SAD/SSD/NCC)



# Stereo Pair Correspondence

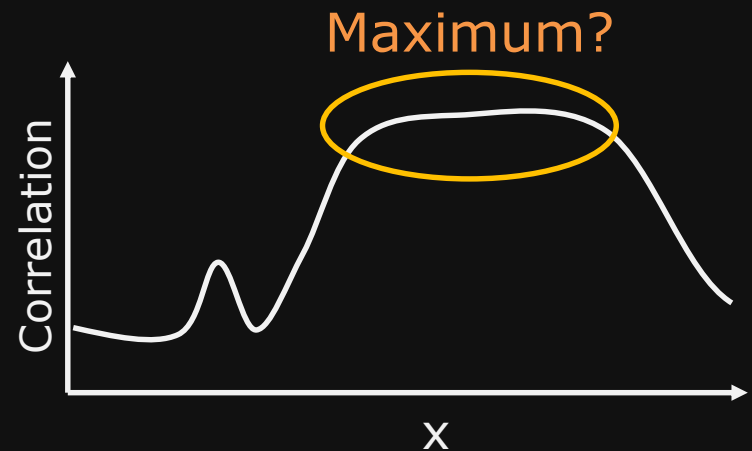
Left Image



Right Image

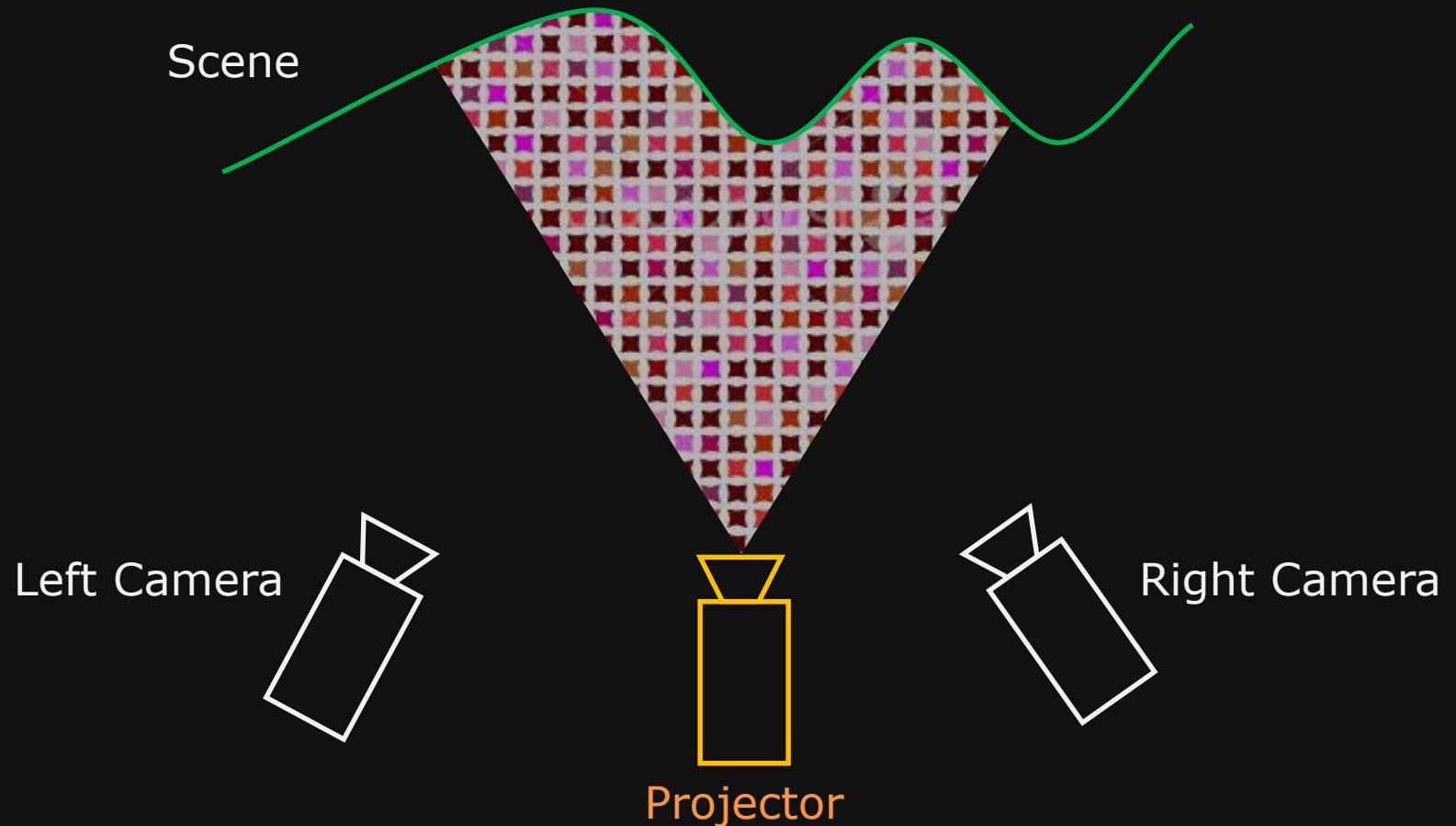


Ambiguous!



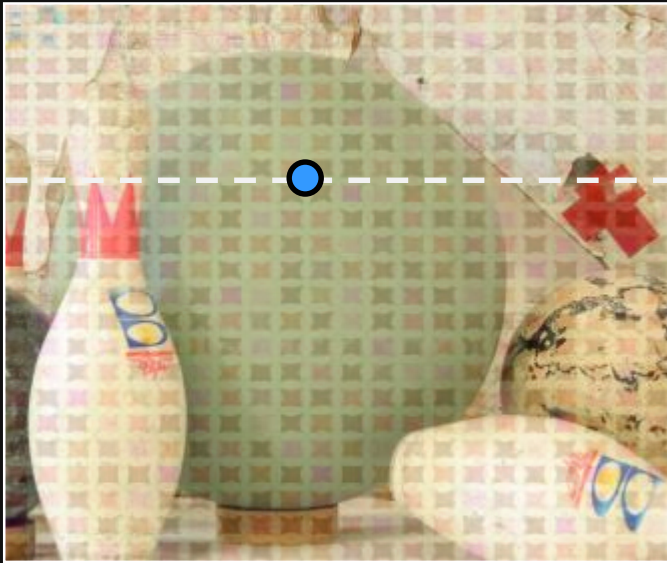
# Binocular Stereo... and a Projector

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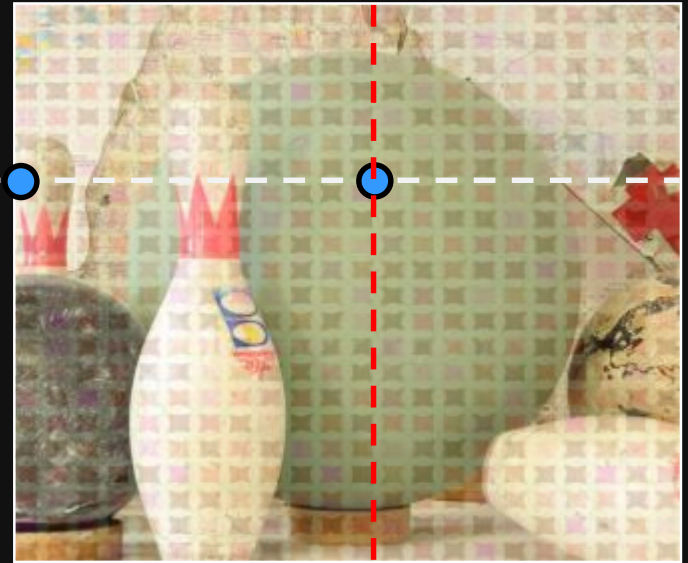


# Active Stereo

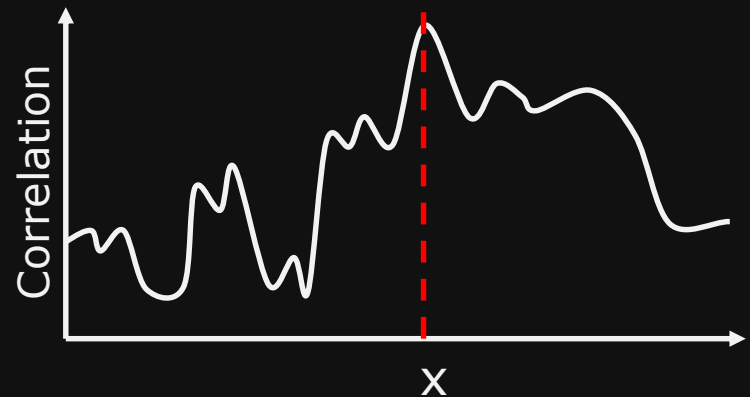
Left Image



Right Image



Projected texture  
makes matching easier!



# Active Stereo Results

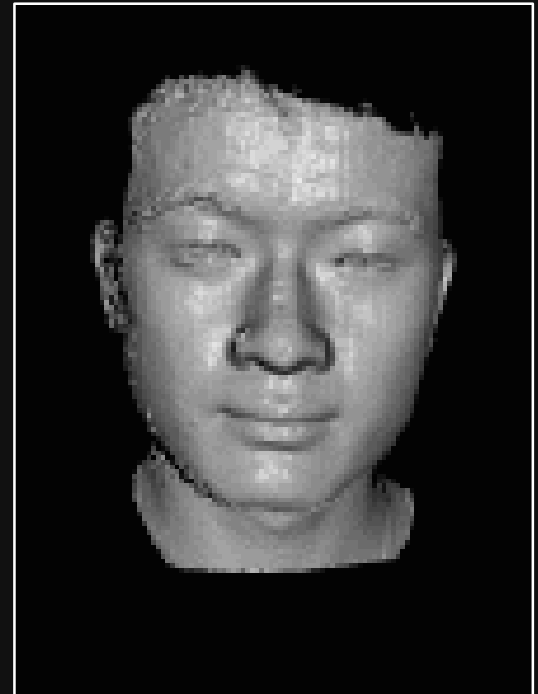
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Left Image



Right Image



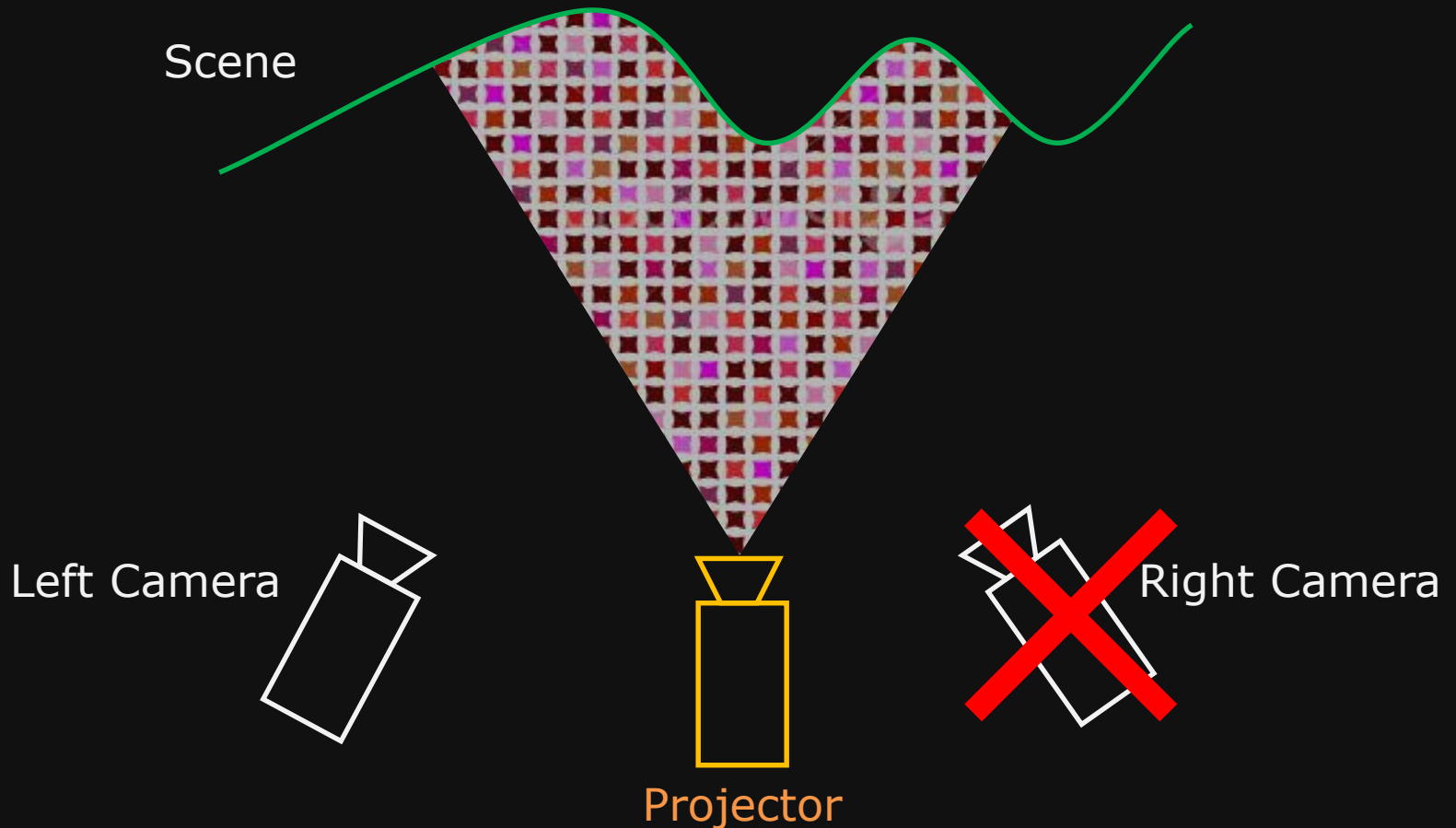
3D Structure



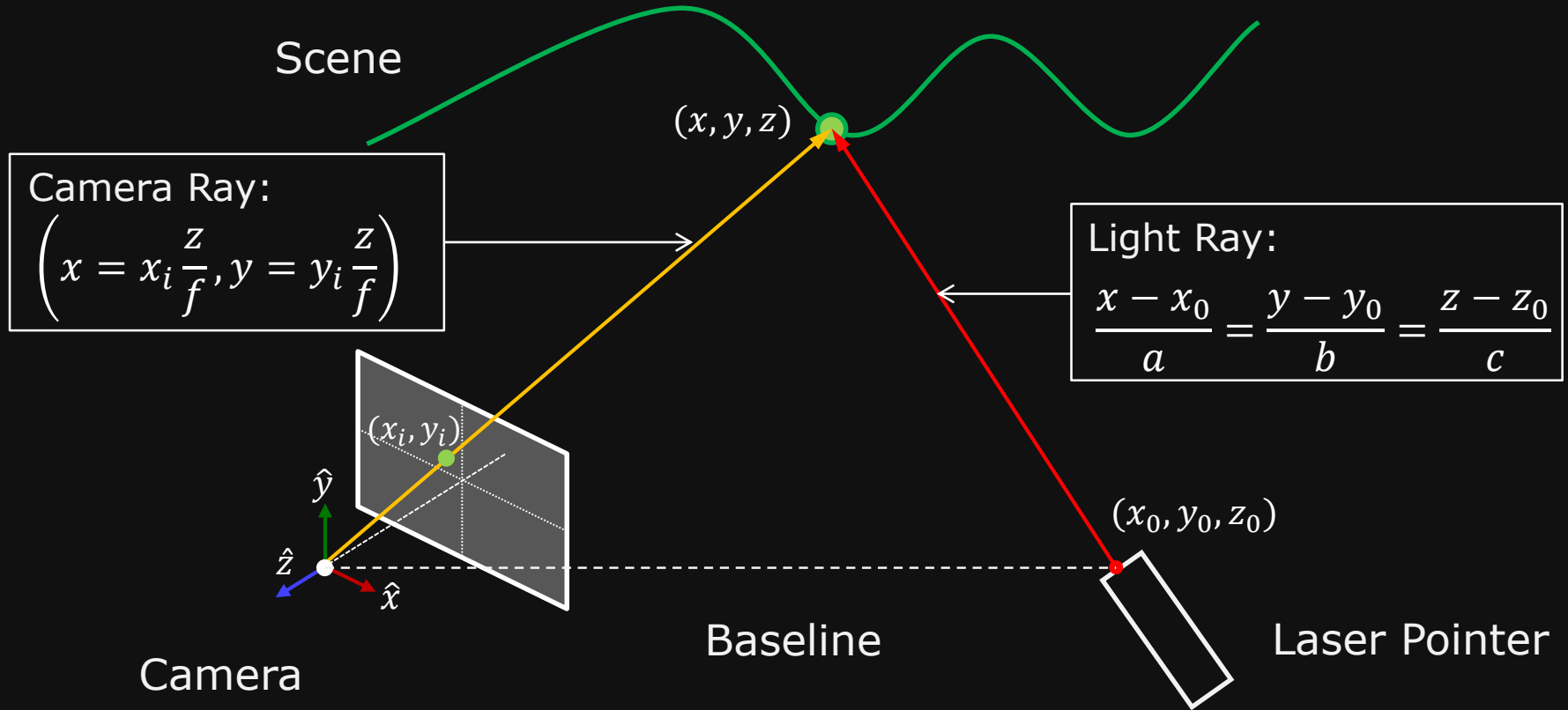
# Structured Light Range Finding

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Remove one of the cameras ...



# Point Based Range Finding



Scene Point  $(x, y, z) = \text{Camera Ray} \cap \text{Light Ray}$

$$z = \frac{f(cx_0 - az_0)}{(cx_i - af)}$$

# Detecting the Illuminated Point

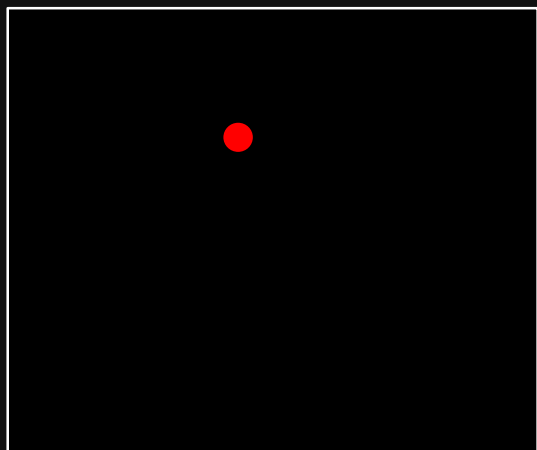
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Background Image ( $I_B$ )



Captured Image with Pointer ( $I_P$ )



Difference Image ( $I_P - I_B$ )



Use Infrared Camera with  
Infrared Pointer

# How Many Images?

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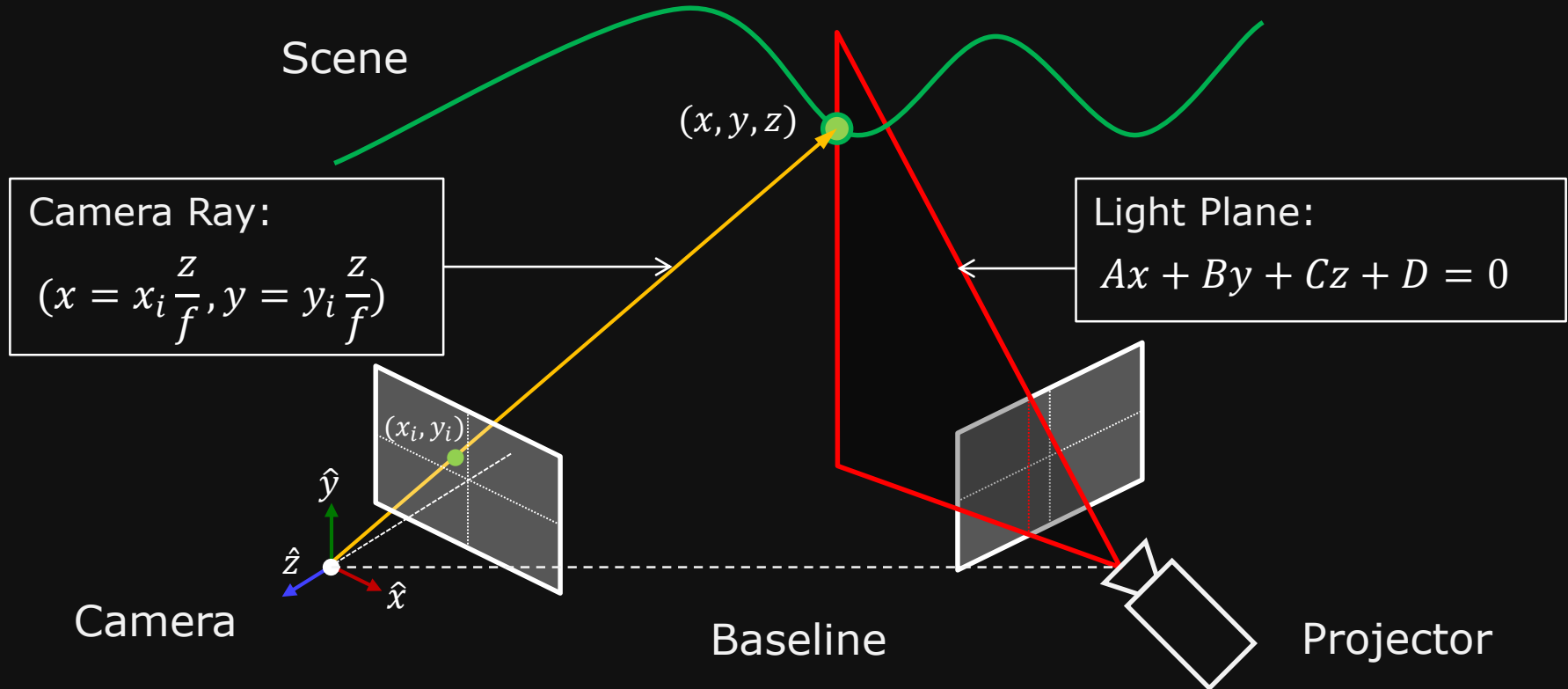


One image per **pixel**!

For 640x480 image: >300,000 images!

At 30fps: ~3 hours!

# Line Stripe Range Finding

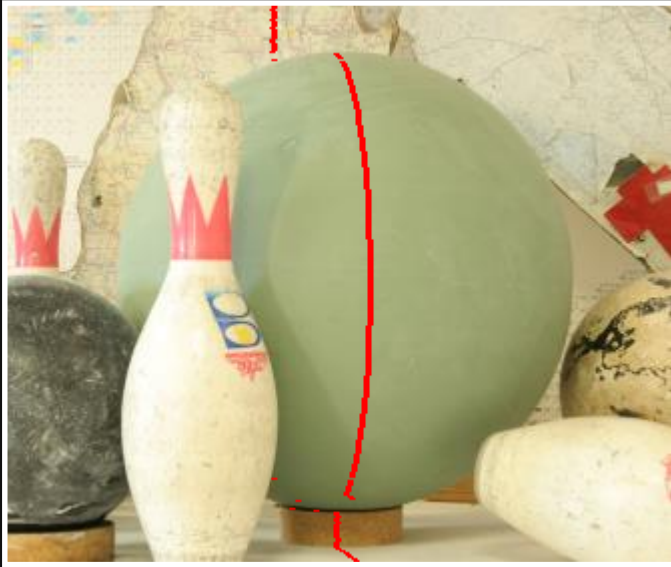


Scene Point  $(x, y, z) = \text{Camera Ray} \cap \text{Light Plane}$

$$z = \frac{-Df}{Ax_i + By_i + Cf}$$

# How Many Images?

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What camera sees



What projector "sees"

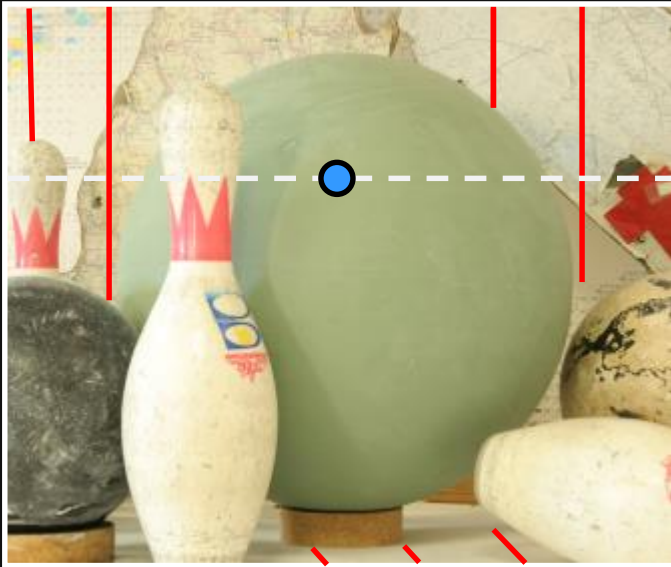
One image per **column**

For 640x480 image: still 640 images!

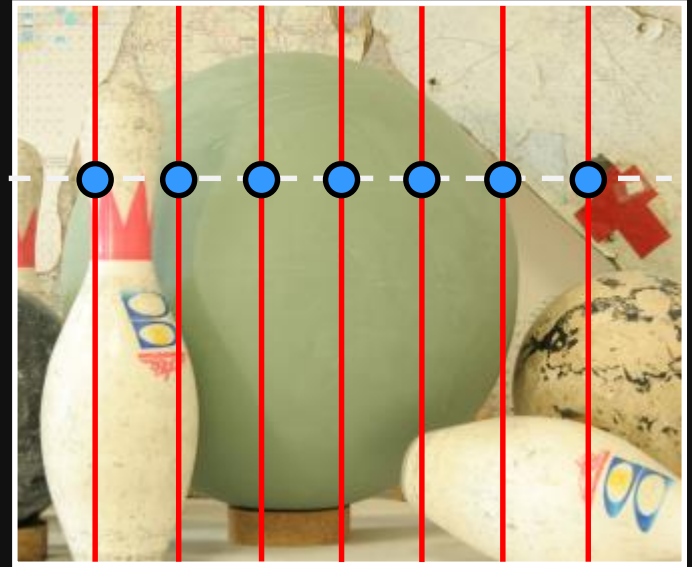
At 30fps: ~21s

# Can we do Multiple Stripes at Once?

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What camera sees



What projector "sees"

Ambiguous!

# Binary Coded Structured Light

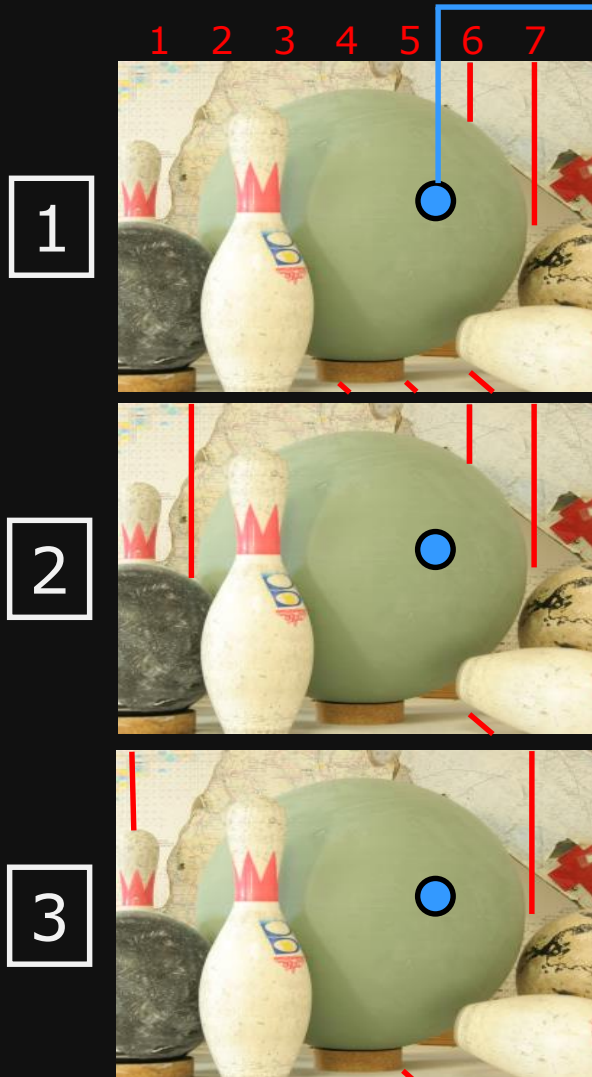


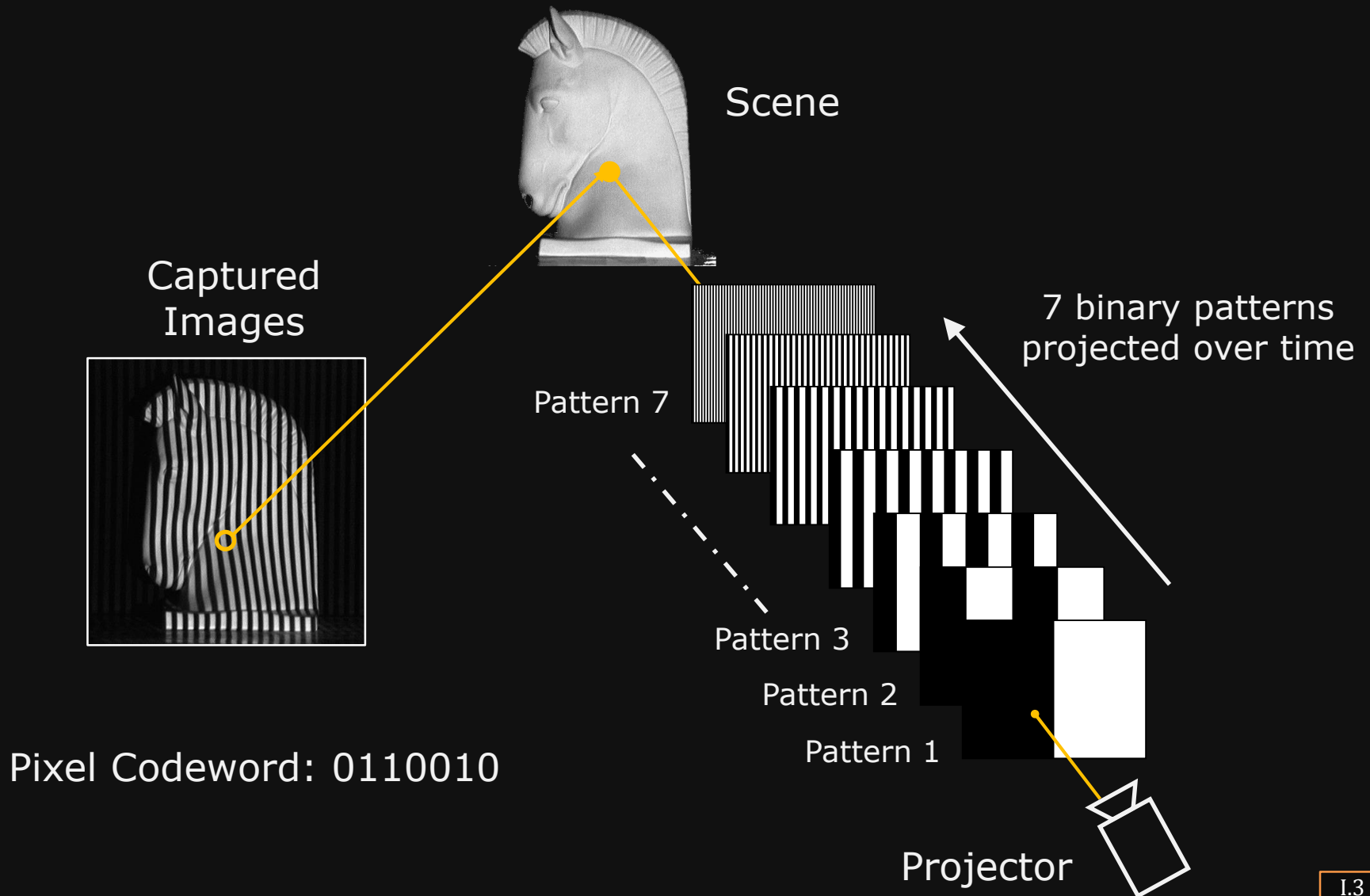
Image		Projection Pattern						
1	Bit 1	0	0	0	1	1	1	1
2	Bit 2	0	1	1	0	0	1	1
3	Bit 3	1	0	1	0	1	0	1
(In Binary)		(001)	(010)	(011)	(100)	(101)	(110)	(111)
Stripe Numbers		1	2	3	4	5	6	7

7 stripes in 3 images!

In general, we can do  
 $2^n - 1$  stripes in  $n$  Images

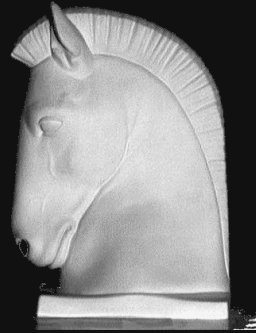


# Binary Coded Structured Light: Example



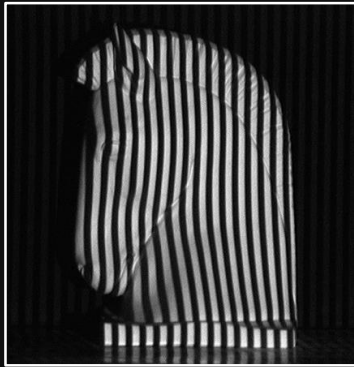
# Binary Coded Structured Light: Example

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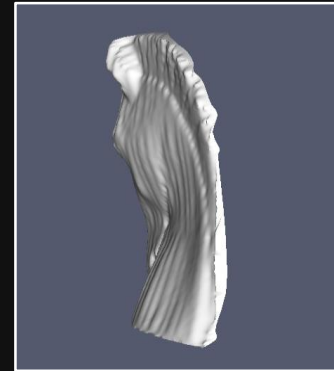


Scene

Captured  
Images



3D  
Reconstruction



# Errors due to Light Bleeding

Image	Projection Pattern						
<div>1</div>	0	0	0	1	1	1	1
<div>2</div>	0	1	1	0	0	1	1
<div>3</div>	1	0	1	0	1	0	1
(in binary)	(001)	(010)	(011)	(100)	(101)	(110)	(111)
Stripe Number	1	2	3	4	5	6	7

We could have as many as 10 errors!

# Gray Coding to Reduce Errors

Image	Projection Pattern
<div>1</div>	<div> <div>0</div> <div>0</div> <div>0</div> <div>1</div> <div>1</div> <div>1</div> <div>1</div> </div>
<div>2</div>	<div> <div>0</div> <div>1</div> <div>1</div> <div>1</div> <div>1</div> <div>0</div> <div>0</div> </div>
<div>3</div>	<div> <div>1</div> <div>1</div> <div>0</div> <div>0</div> <div>1</div> <div>1</div> <div>0</div> </div>
(in binary)	(001) (010) (011) (100) (101) (110) (111)
Stripe Number	<div> <div>1</div> <div>2</div> <div>3</div> <div>4</div> <div>5</div> <div>6</div> <div>7</div> </div>
Gray Code	<div> <div>(001)</div> <div>(011)</div> <div>(010)</div> <div>(110)</div> <div>(111)</div> <div>(101)</div> <div>(100)</div> </div> <p>Binary numeral system where successive values differ by only one bit.</p>

Reduced to a maximum of 6 errors!

# Extending Binary to k-ary Methods

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Coding	Base	Values
Binary	2	0, 1 (Off, On)
Tertiary	3	0, 1, 2 (R, G, B), (Off, ½On, On)
k-ary	k	0, 1, 2,... k-1

# Color Coding with R, G, B (Tertiary)



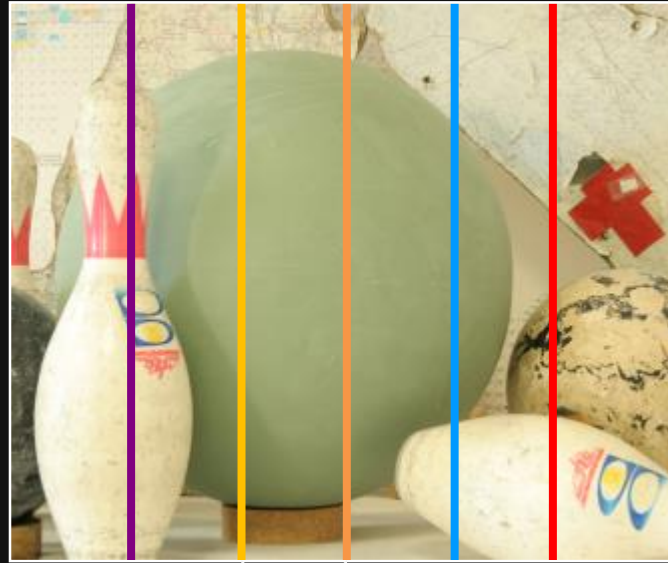
Image	Projection Pattern						
1	R	R	G	G	G	B	B
2	G	B	R	G	B	R	G
(In Base 3)	(01)	(02)	(10)	(11)	(12)	(20)	(21)
Stripe Numbers	1	2	3	4	5	6	7

7 stripes in 2 images!

In general, with  $k$  colors/intensities,  
 $k^n - 1$  stripes in  $n$  Images

# The More Colors, The Less Distinguishable

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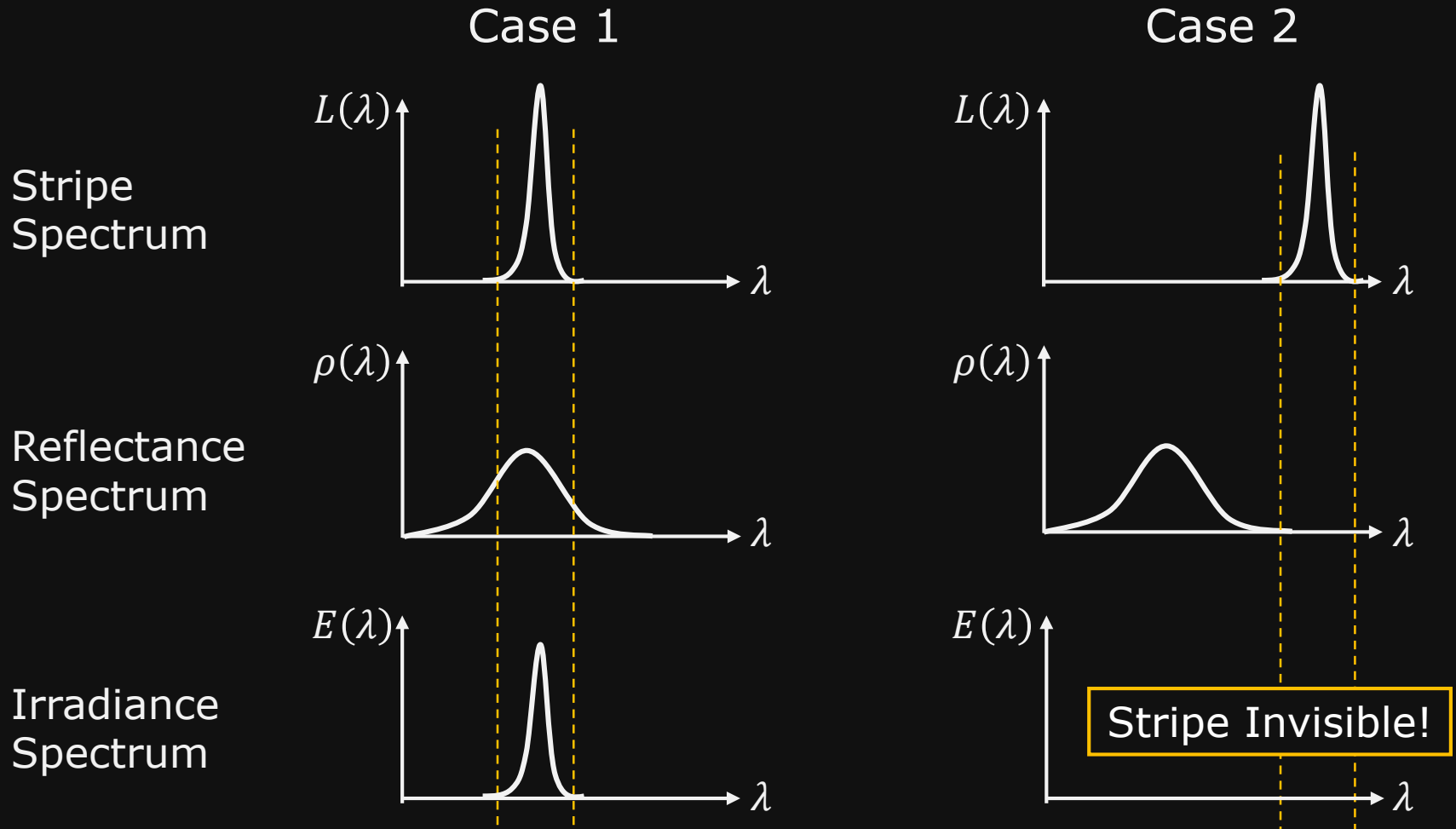


Similar colors

More precise equipment needed to measure accurately.

# Effect of Surface Reflectance

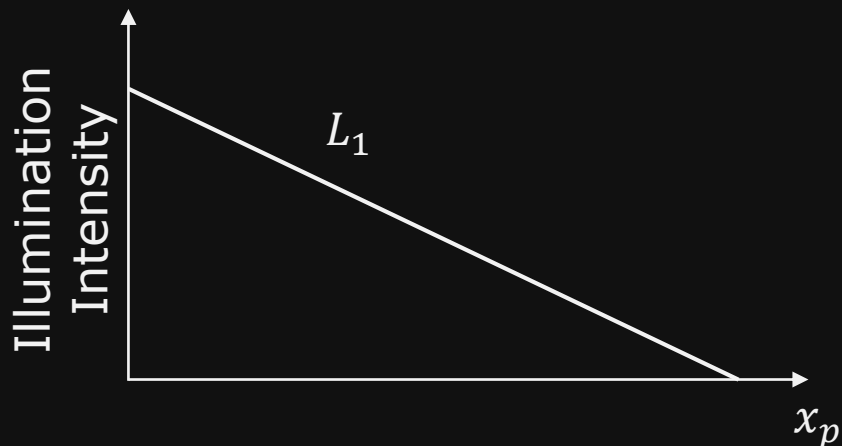
Image Irradiance:  $E(\lambda) = L(\lambda)\rho(\lambda)$





# Intensity Ratio Method

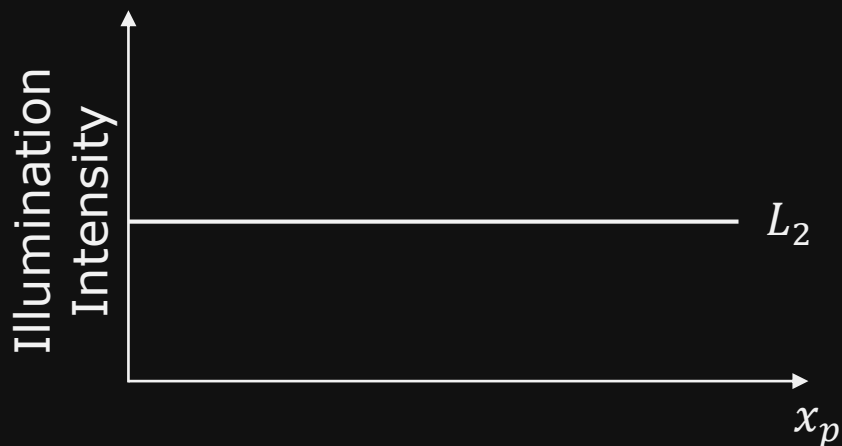
Projection Pattern



Captured Image



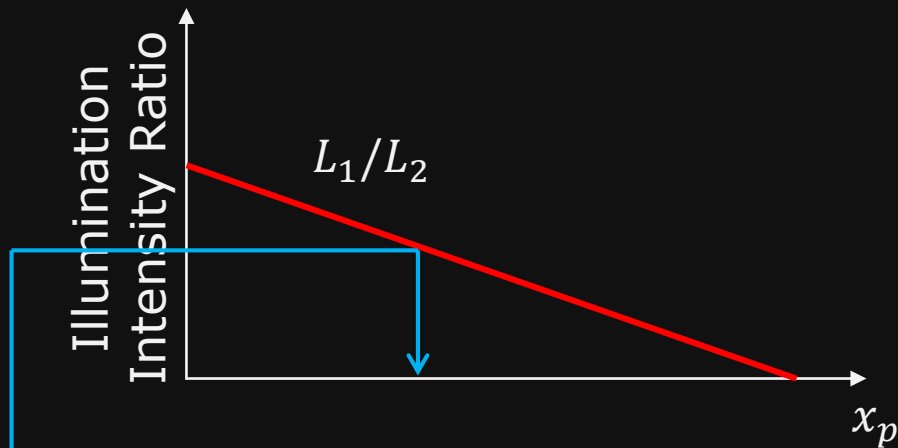
$$E_1 = \rho \cdot L_1$$



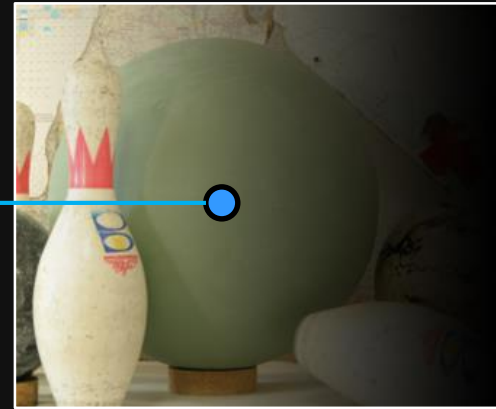
$$E_2 = \rho \cdot L_2$$

# Camera-Projector Correspondence

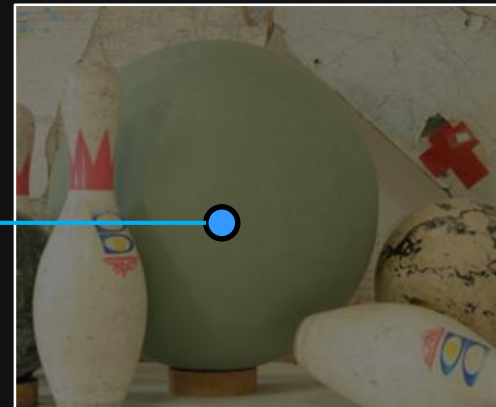
Projection Pattern Ratio



Captured Image



$$E_1 = \rho \cdot L_1$$



$$E_2 = \rho \cdot L_2$$

$$\frac{E_1}{E_2} = \frac{\rho L_1}{\rho L_2}$$

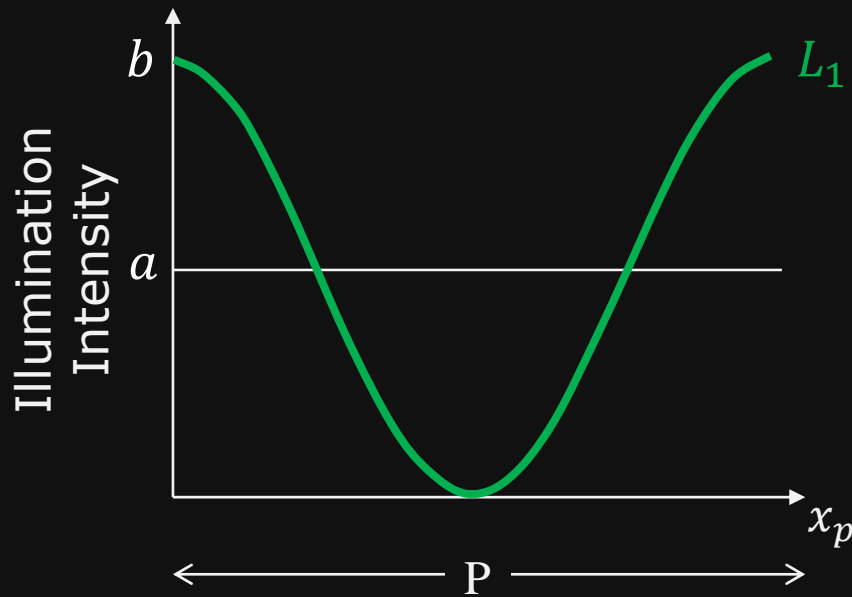
# Issues with Intensity Ratio Method

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- Method sensitive to noise. Need to precisely measure each intensity level.
- What if you have more than 255 projector columns?  
Will need a high dynamic range projector.

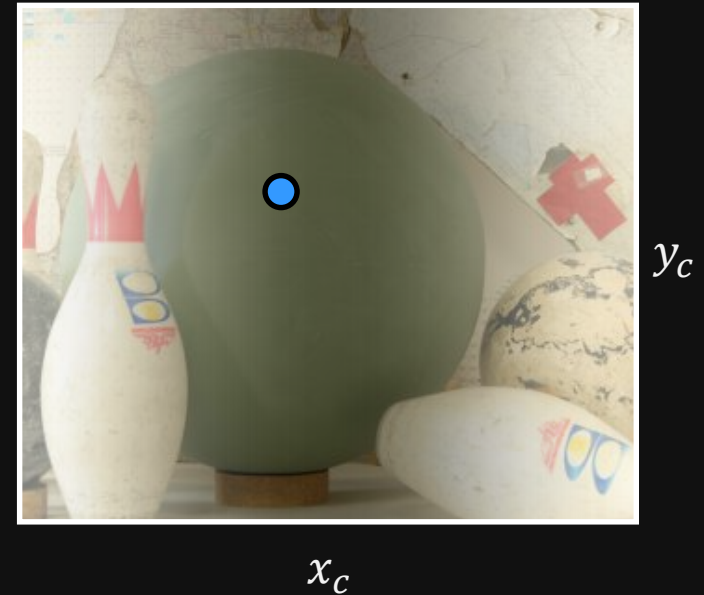
# Phase Shift Method: Sinusoidal Patterns

Projected Pattern



$$L_1(x_p) = a + b \cos\left(\frac{2\pi x_p}{P}\right)$$

Captured Image



$$I_1(x_c, y_c) = \rho a + \rho b \cos\left(\frac{2\pi x_p}{P}\right)$$

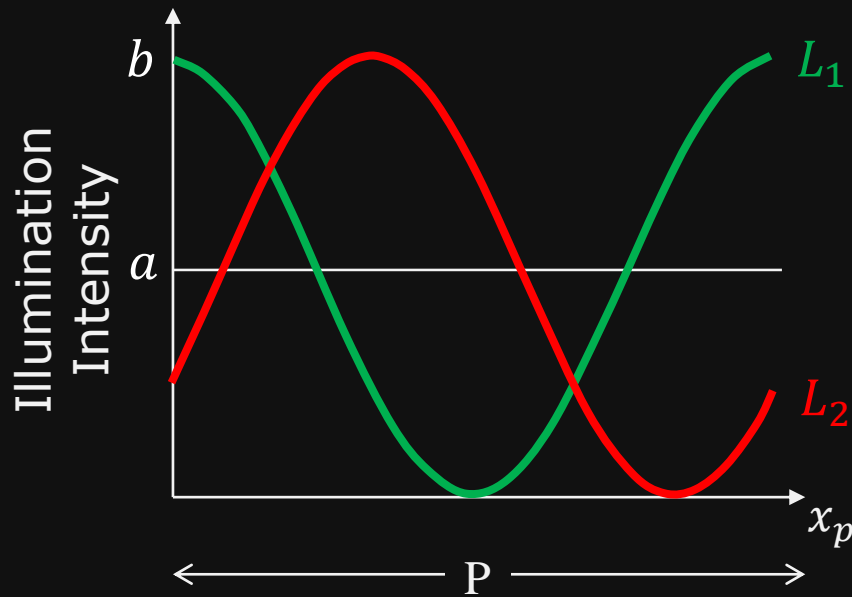
$(\rho, x_p)$ : Unknown

$\rho$ : Scene Reflectance

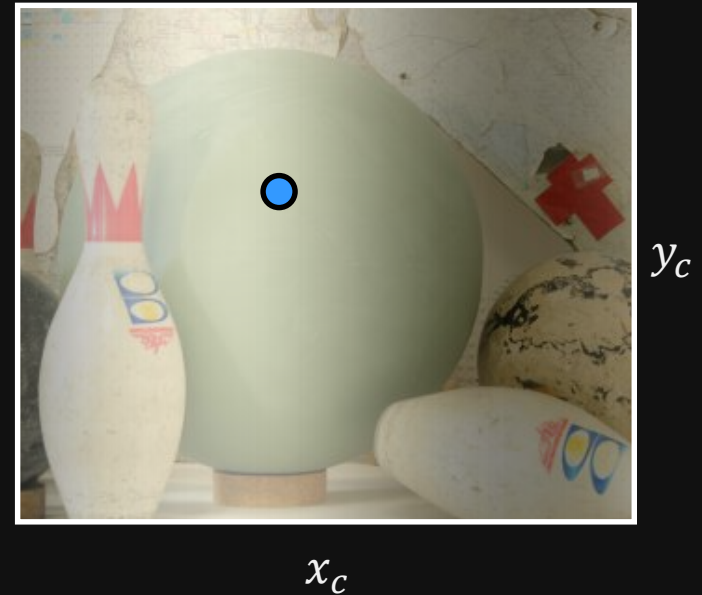
[Wust 1991]

# Phase Shift Method: Sinusoidal Patterns

Projected Pattern



Captured Image

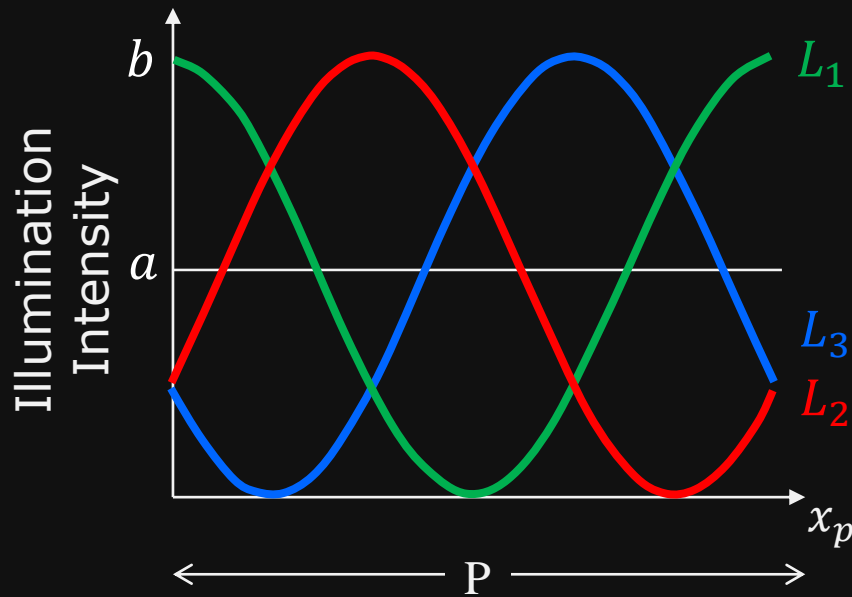


$$L_2(x_p) = a + b \cos\left(\frac{2\pi x_p}{P} - \frac{2\pi}{3}\right)$$

$$I_2(x_c, y_c) = \rho a + \rho b \cos\left(\frac{2\pi x_p}{P} - \frac{2\pi}{3}\right)$$

# Phase Shift Method: Sinusoidal Patterns

Projected Pattern



Captured Image

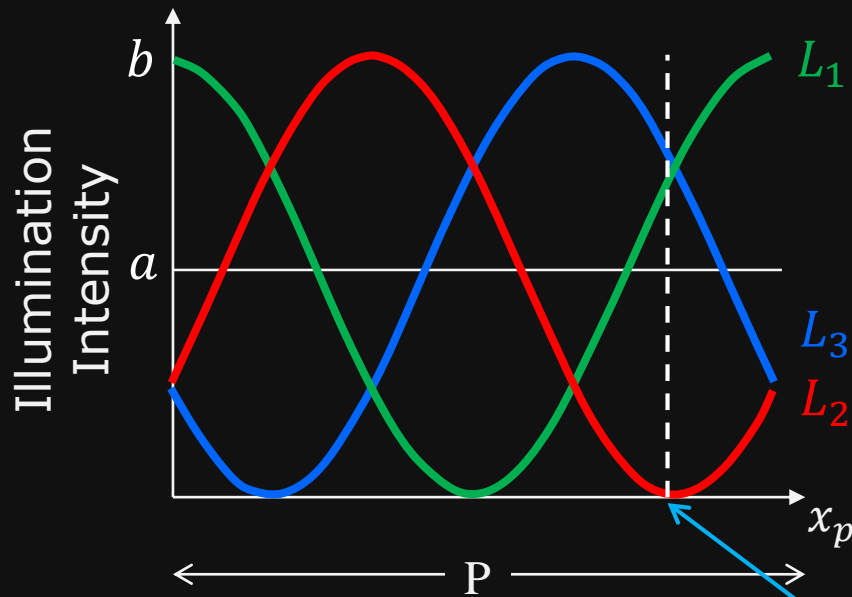


$$L_3(x_p) = a + b \cos\left(\frac{2\pi x_p}{P} + \frac{2\pi}{3}\right)$$

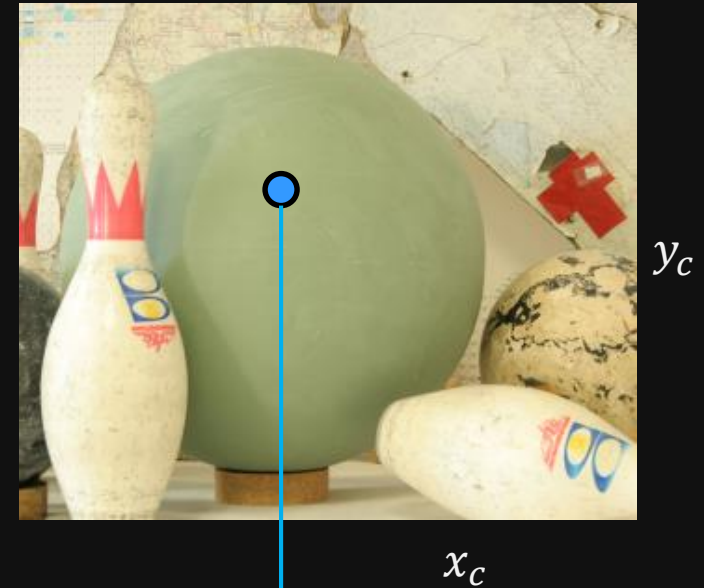
$$I_3(x_c, y_c) = \rho a + \rho b \cos\left(\frac{2\pi x_p}{P} + \frac{2\pi}{3}\right)$$

# Phase Shift Method: Correspondence

Projected Pattern



Captured Image



$$\left. \begin{aligned} I_1(x_c, y_c) &= \rho a + \rho b \cos\left(\frac{2\pi x_p}{P}\right) \\ I_2(x_c, y_c) &= \rho a + \rho b \cos\left(\frac{2\pi x_p}{P} - \frac{2\pi}{3}\right) \\ I_3(x_c, y_c) &= \rho a + \rho b \cos\left(\frac{2\pi x_p}{P} + \frac{2\pi}{3}\right) \end{aligned} \right\}$$

$$x_p = \frac{P}{2\pi} \tan^{-1} \left( \sqrt{3} \frac{I_2 - I_3}{2I_1 - I_2 - I_3} \right)$$

# Structured Light: Summary

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Method	Number of Images
Point based Structured Light	$MN$
Line based Structured Light	$N$
Binary Coded Structured Light	$\lceil \log_2(N + 1) \rceil$
k-ary (Color) Coded Structured Light	$\lceil \log_k(N + 1) \rceil$
Intensity Ratio Lighting	2
Phase-Shift Lighting	3

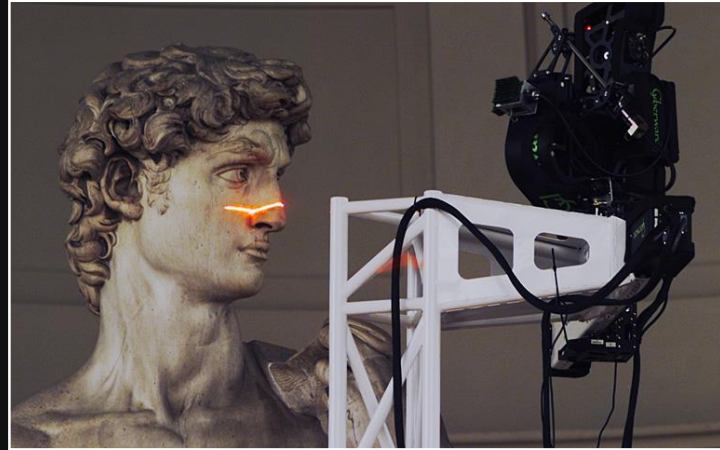
$[M, N]$  : Camera Image Size

$k$  : Number of colors/intensities

$\lceil x \rceil$  : Smallest integer  $\geq x$



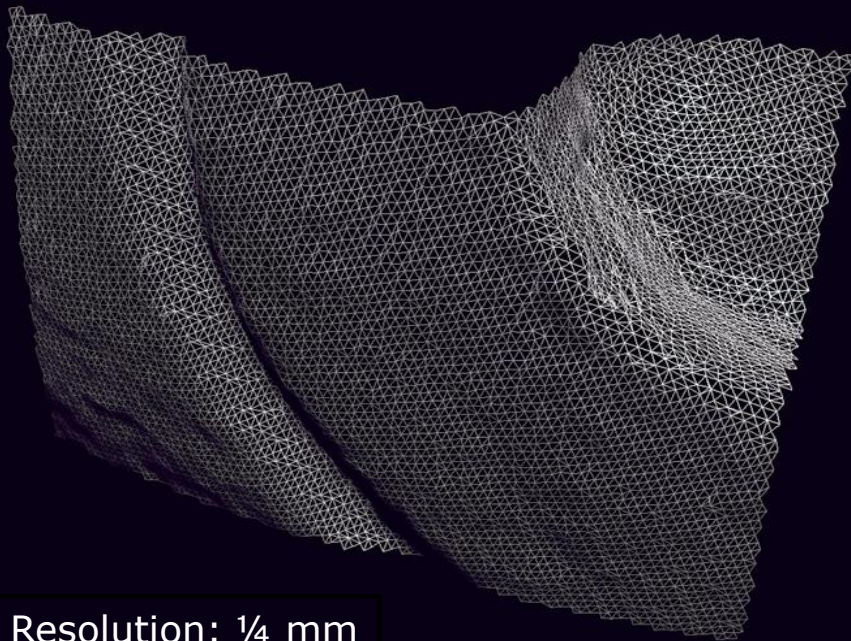
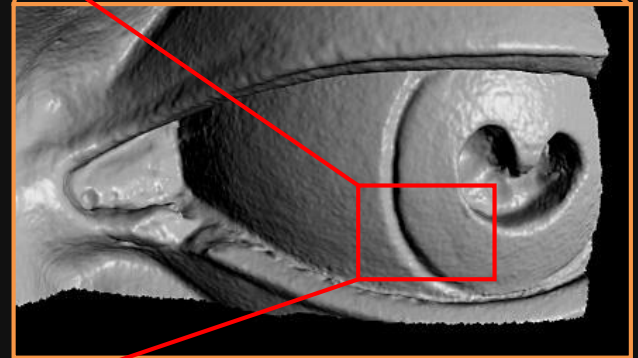
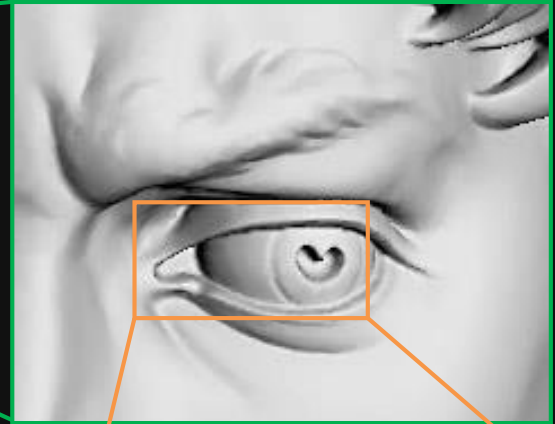
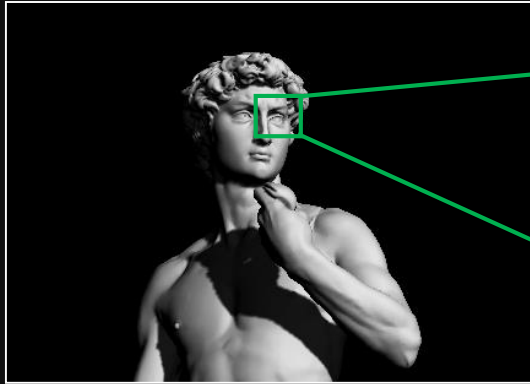
# Example: Digital Michelangelo Project



## Michelangelo's David:

- 480 individually aimed scans
- 2 billion polygons
- 7,000 color images
- 32 gigabytes of data
- 30 nights of scanning
- 22 people

# Example: Digital Michelangelo Project



Resolution:  $\frac{1}{4}$  mm

# Benefits of Structured Light Methods

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- Local, pixel-wise algorithm. No support region needed.
- Very precise depth estimates. Down to micrometers!
- Reasonably fast. Real-time systems exist.

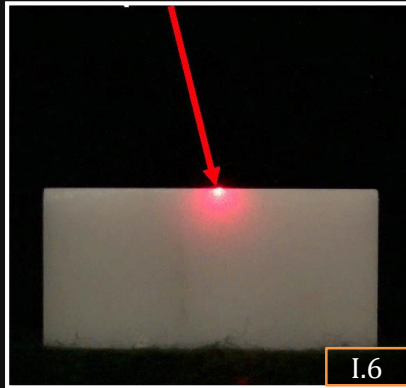
# Issues with Structured Light Methods

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- Restricted to controlled environments.
- Camera-Projector calibration needs to be precise.
- Timing synchronization needs to be precise to avoid stripes “blurring” into each other.
- Dynamic range and signal-to-noise ratio must be high to distinguish different intensities.

# Limits of Structured Light Methods

## Optically uncooperative materials



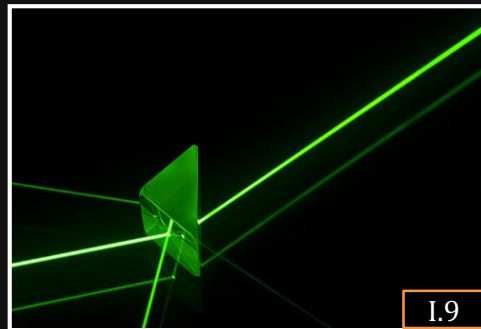
Scattering surface  
(marble)



Scattering environment  
(underwater)



Specular surface  
(mirror-like)



Transparent surface  
(glass)



Fuzzy  
(hair)

# References

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[Carrihill 1985] B. Carrihill and R. Hummel. *Experiments with the intensity ratio depth sensor*. Computer Vision, Graphics and Image Processing, vol.32, 1985, pp.337-358.

[Caspi 1998] D. Caspi, N. Kiryati, and J. Shamir. *Range imaging with adaptive color structured light*. IEEE Trans. on PAMI, 20(5), 1998, pp.470-480.

[Inokuchi 1984] S. Inokuchi, K. Sato and F. Matsuda. *Range imaging system for 3-D object recognition*. ICPR, 1984, pp.806-808.

[Levoy 2000] M. Levoy et al., *The Digital Michelangelo Project: 3D Scanning of Large Statues*. Siggraph, 2000.

[Posdamer 1981] J. L. Posdamer and M. D. Altschuler. *Surface measurement by space-encoded projected beam systems*. Computer Graphics and Image Processing, 18(1), pp.1-17. 1981.

[Salvi 2004] J. Salvi, J. Pages, and J. Batlle. *Pattern codification strategies in structured light systems*. Pattern Recognition, vol.37, no.4, 2004, pp.827-849.

[Wust 1991] C. Wust and D. W. Capson. *Surface profile measurement using color fringe projection*. Machine Vision and Applications, vol.4, 1991, pp.193-203.



# Image Credits

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- I.1 <http://vision.middlebury.edu/stereo/data/scenes2006/>
- I.2 <http://grail.cs.washington.edu/projects/ststereo/>
- I.3 <http://jordipages.webs.com/codedlight/examples/examples.html>
- I.4 <http://jordipages.webs.com/codedlight/examples/examples.html>
- I.5 <http://graphics.stanford.edu/projects/mich/>
- I.6 <http://graphics.stanford.edu/papers/marble-assessment/laser-striking-marble.jpg>
- I.7 [http://www.cs.columbia.edu/CAVE/projects/struc\\_light/](http://www.cs.columbia.edu/CAVE/projects/struc_light/)
- I.8 <http://www.artisanti.com/ekmps/shops/artisanti/images/electro-plate-buddha-head-10876-p.jpg>
- I.9 <http://www.flickr.com/photos/mattbell/1591769889/>
- I.10 [http://www.flipwallpapers.com/wallpapers/the\\_curly\\_hair\\_girl-2560x1600.jpg](http://www.flipwallpapers.com/wallpapers/the_curly_hair_girl-2560x1600.jpg)