

# Computational Photography



**Dr. Irfan Essa**

Professor

School of Interactive Computing

Study the basics of computation and its impact on the entire workflow of photography, from capturing, manipulating and collaborating on, and sharing photographs.

# What is Computational Photography? (Part 2)

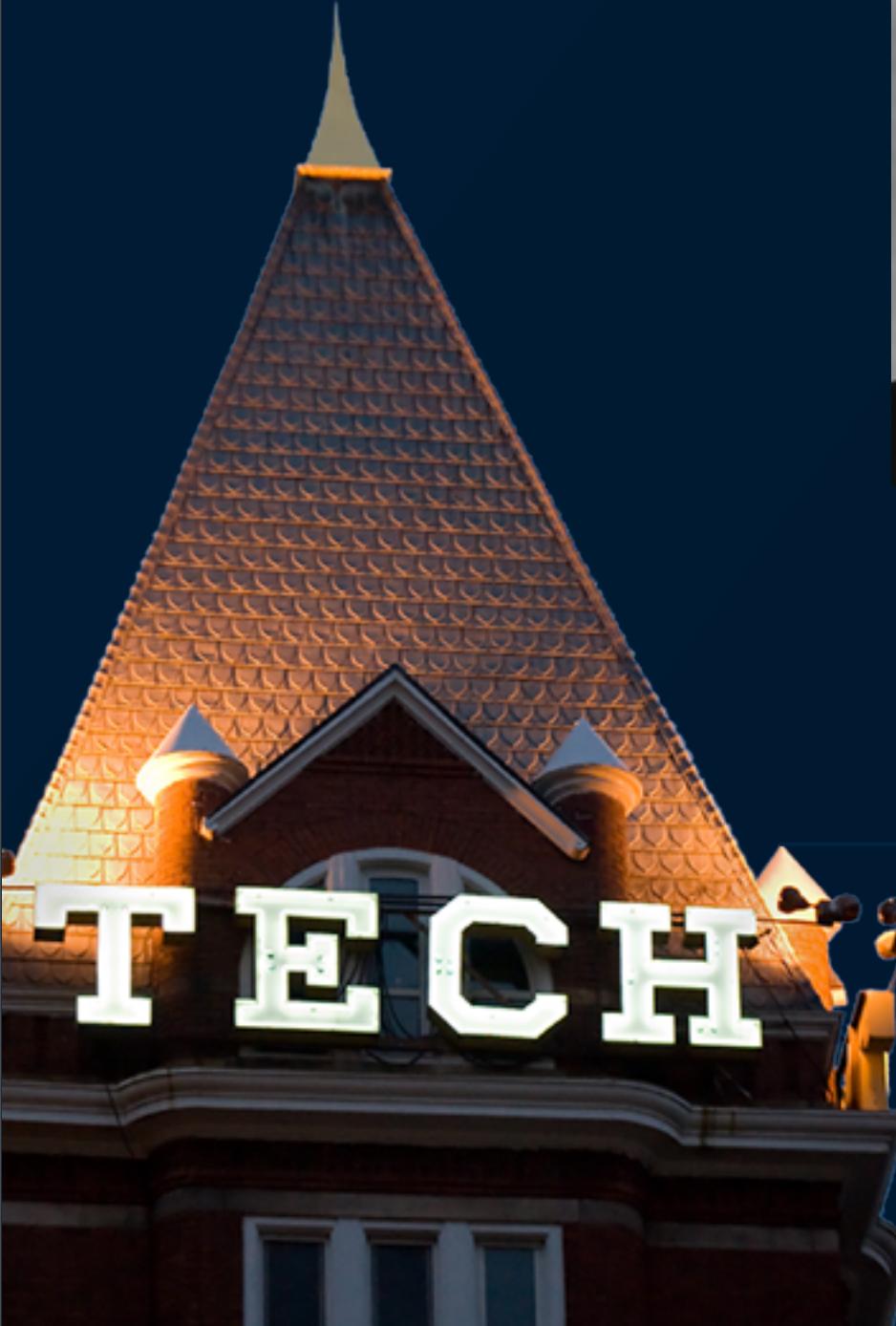


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Dual Photography, a specific example of the  
Computational Photography



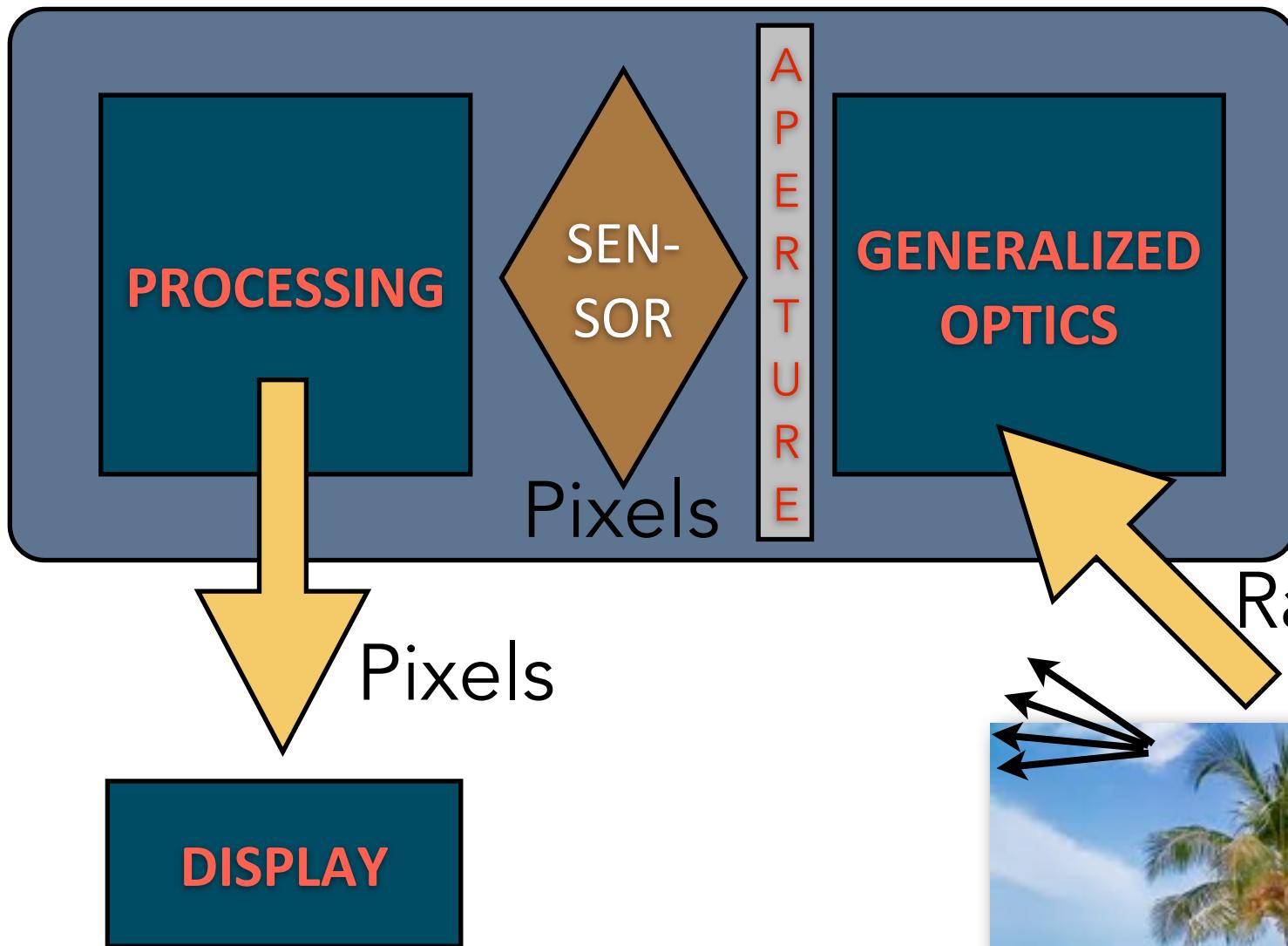
# Lesson Objectives

- ★ Describe in your own words an example of computational photography, using terms like novel illumination, novel cameras, generalized optics, aperture, sensors, rays, and pixels.
  
- ★ Describe in your own words the concept of “dual photography” with respect to appropriate use of controlled lighting and sensing to make new images.

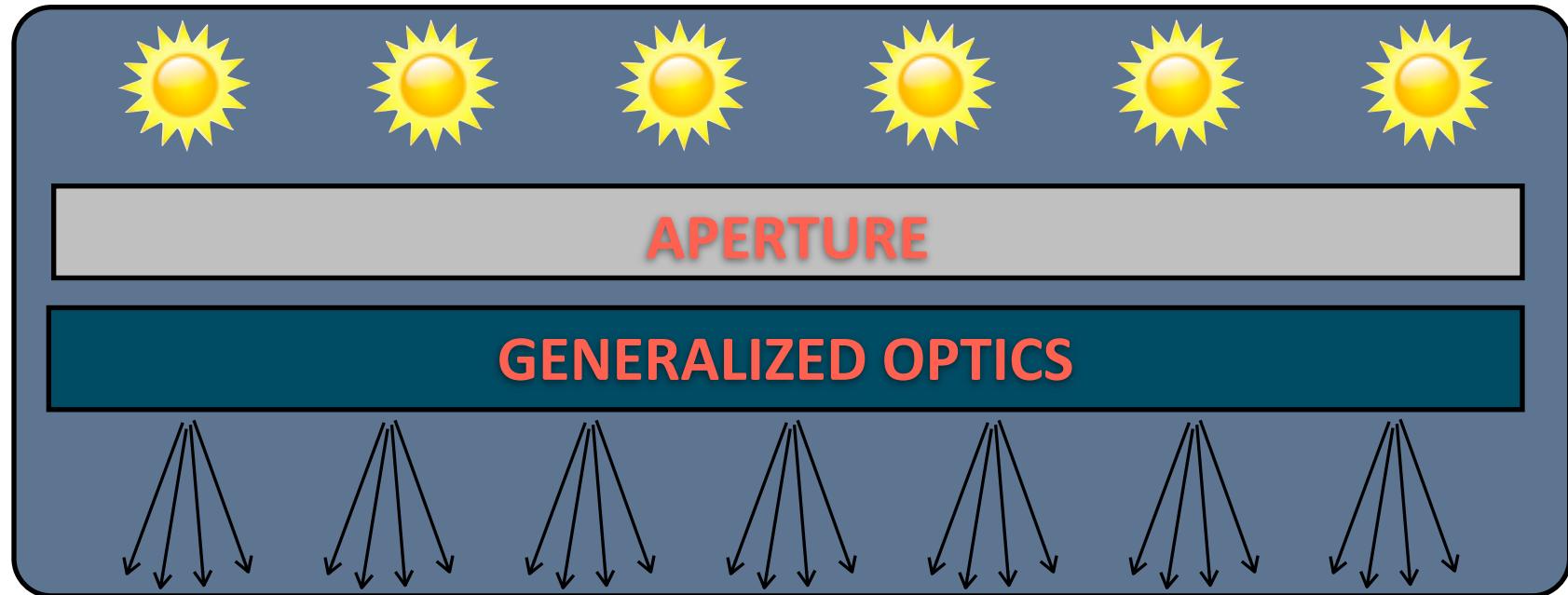


# Computational Photography (Rays to Pixels)

Novel Camera



Novel Illumination



Schematic motivated by Shree Nayar and Ramesh Raskar

3D Scene

# Novel Illumination

Schematic similar to one used by  
Shree Nayar and Ramesh Raskar

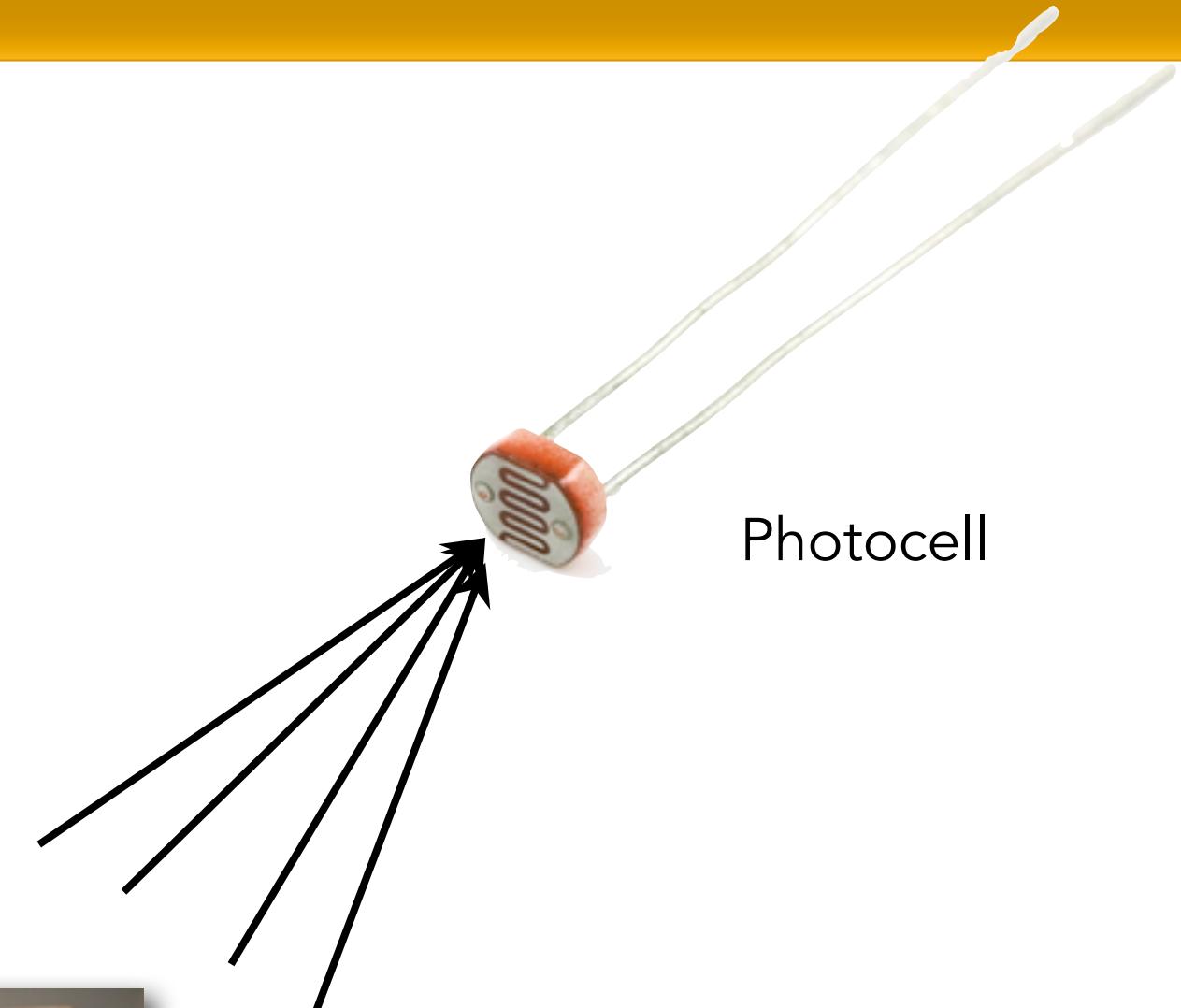


3D Scene

# Novel Illumination

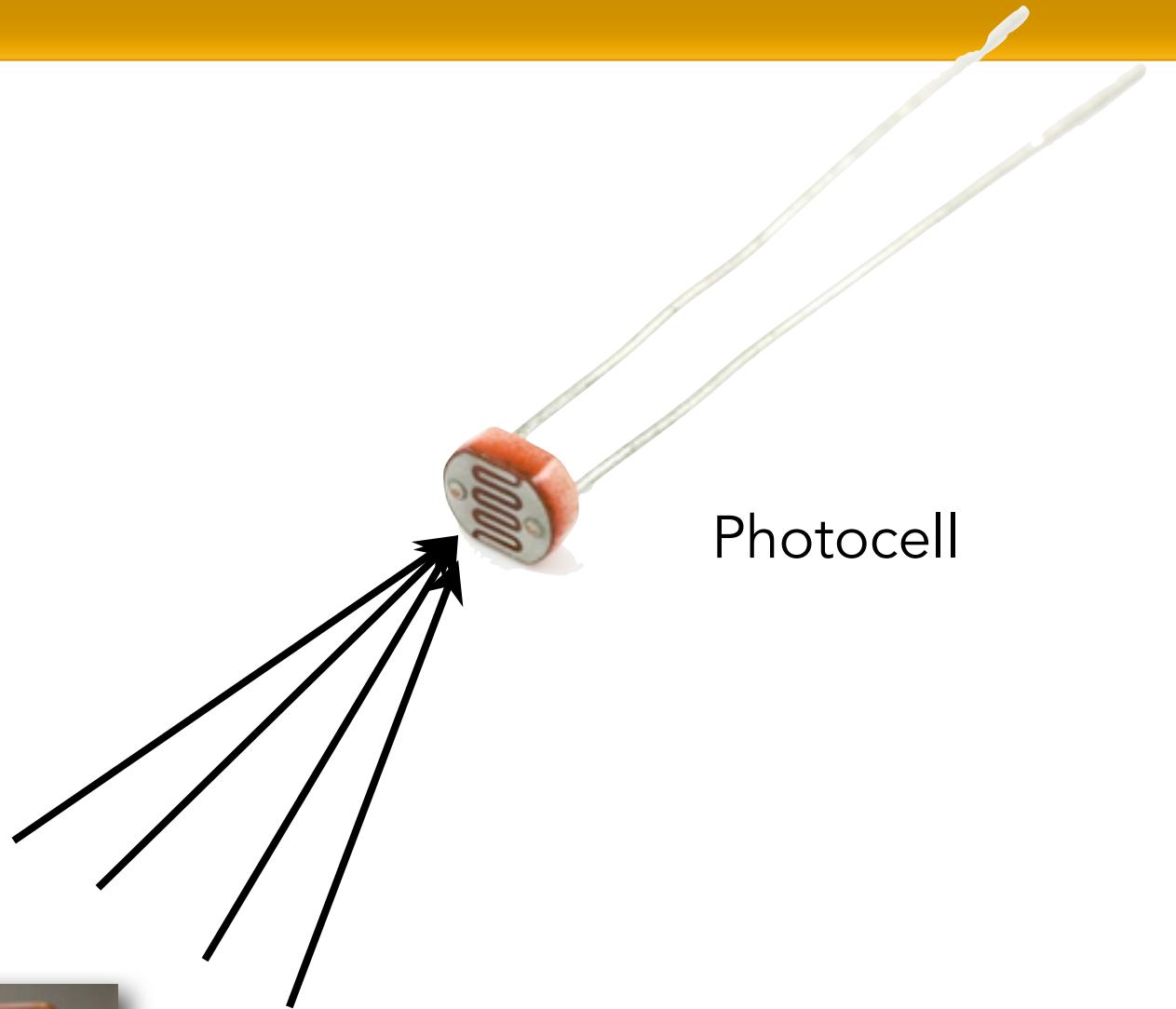


3D Scene



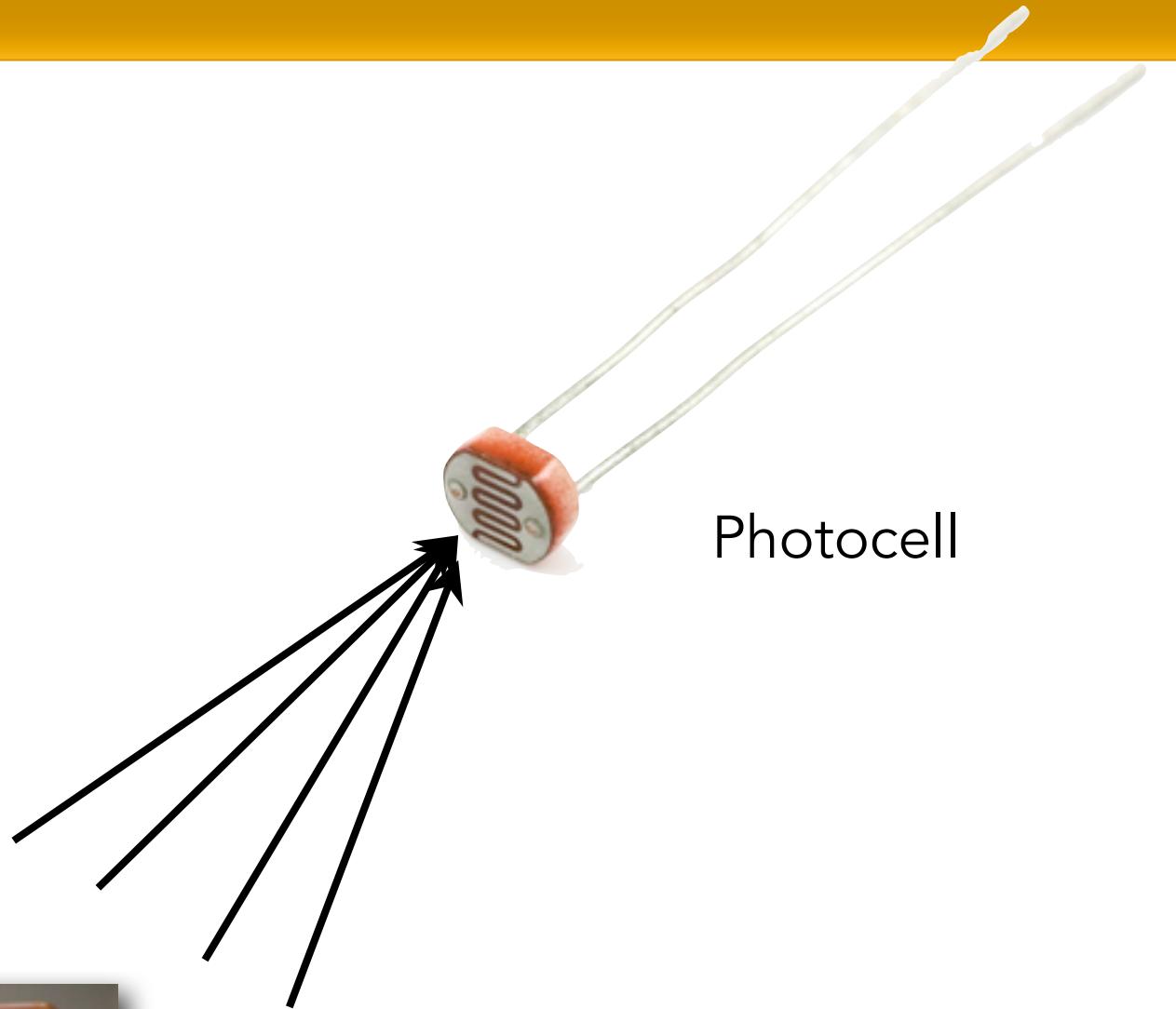
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# Novel Illumination



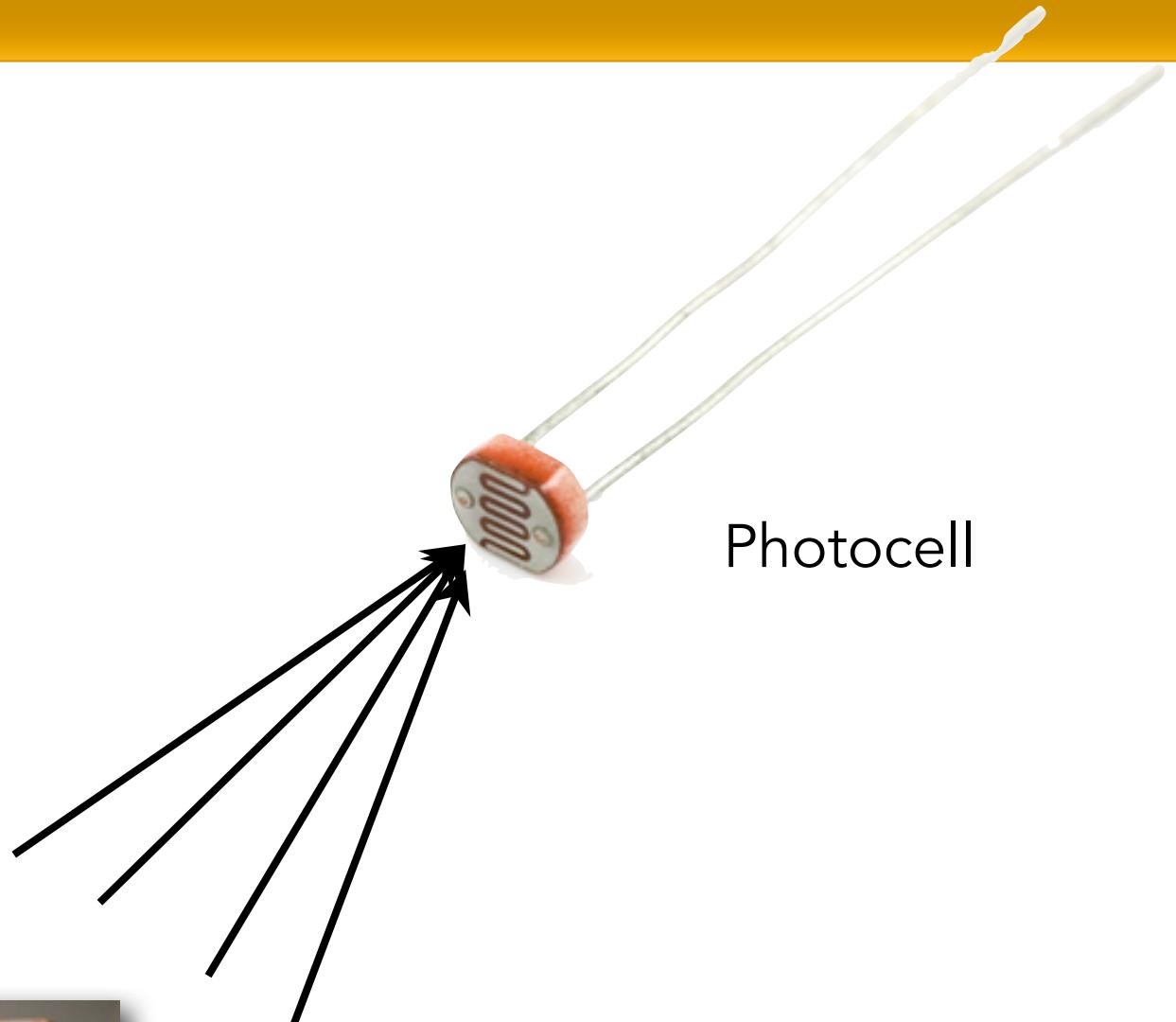
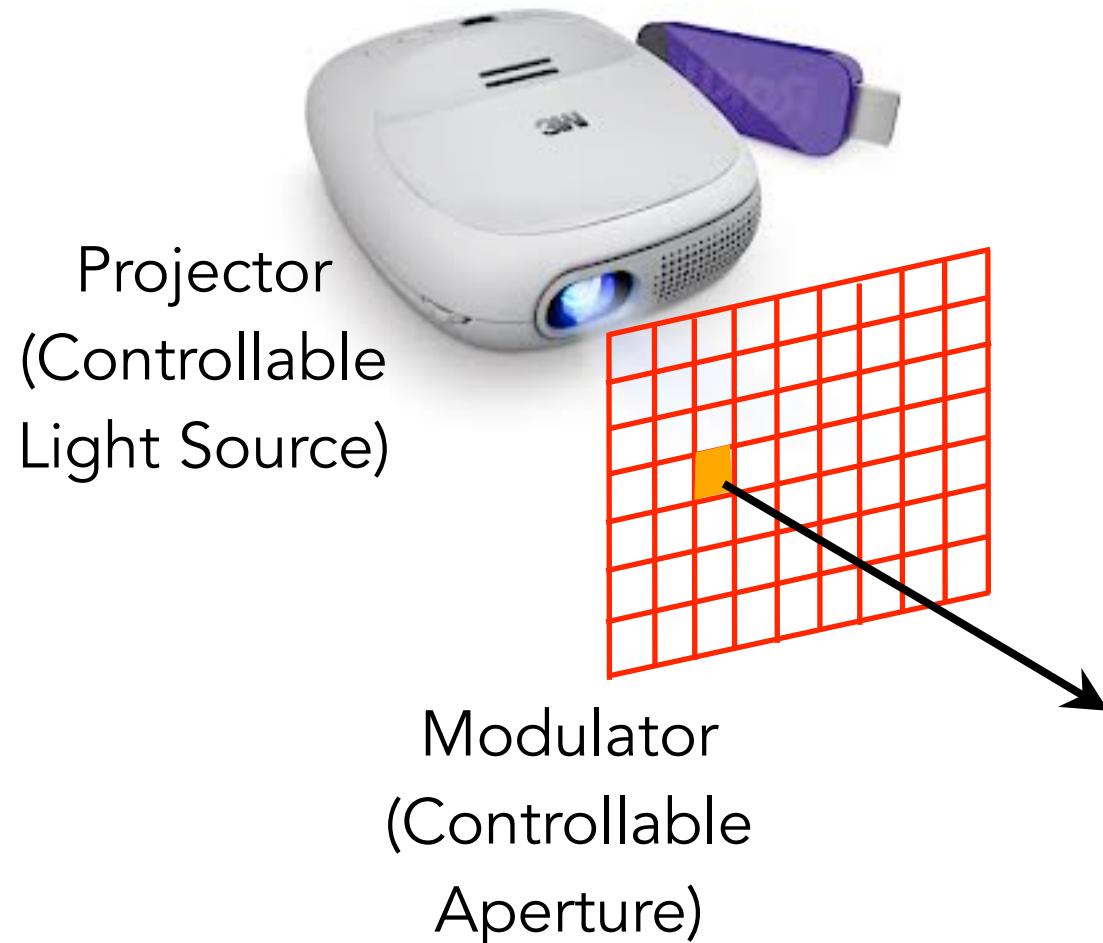
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# Novel Illumination



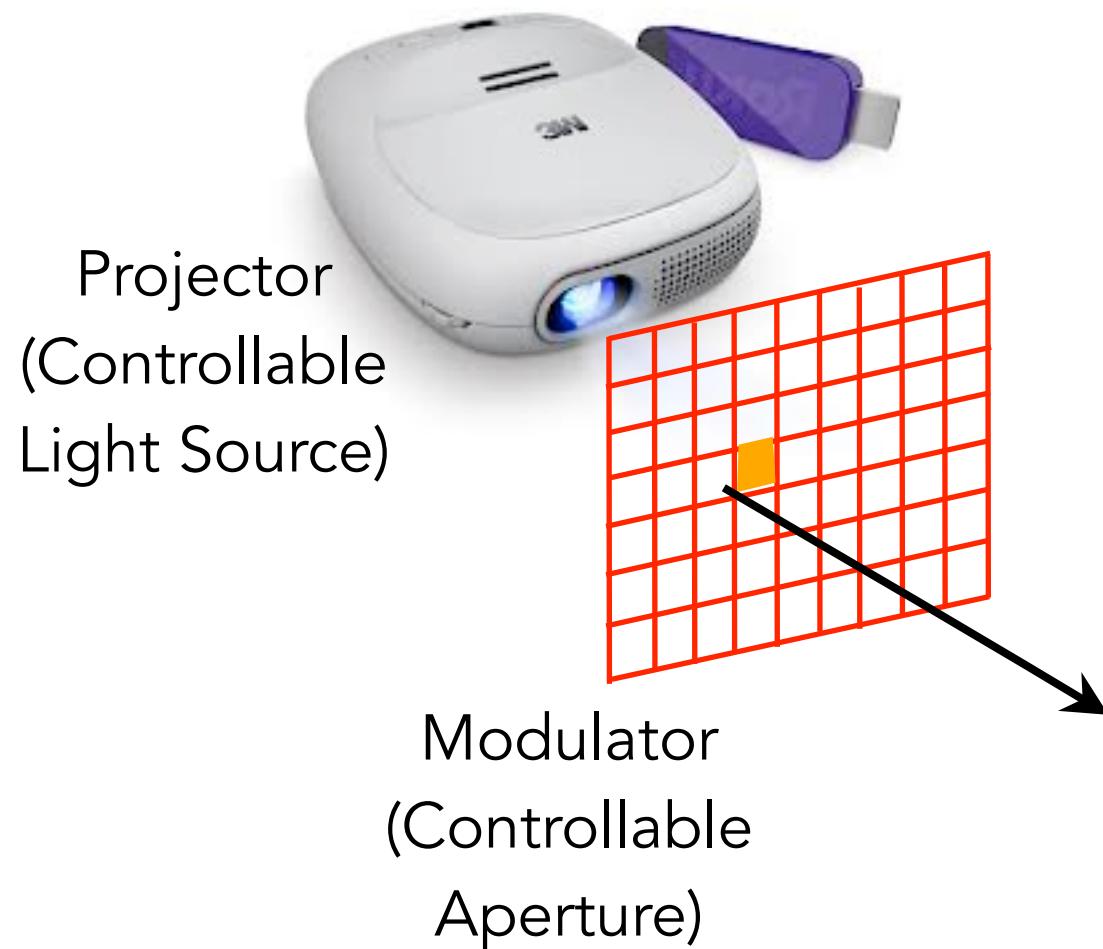
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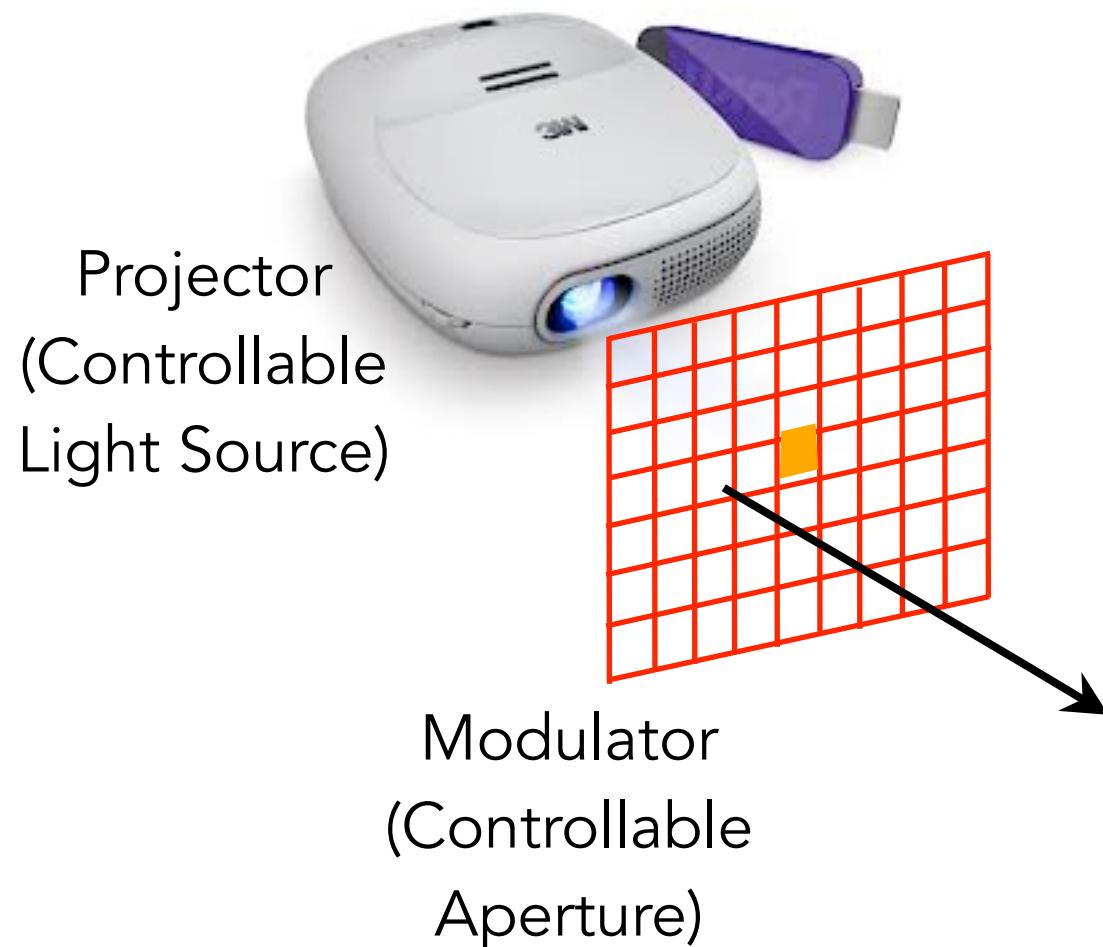
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# Novel Illumination

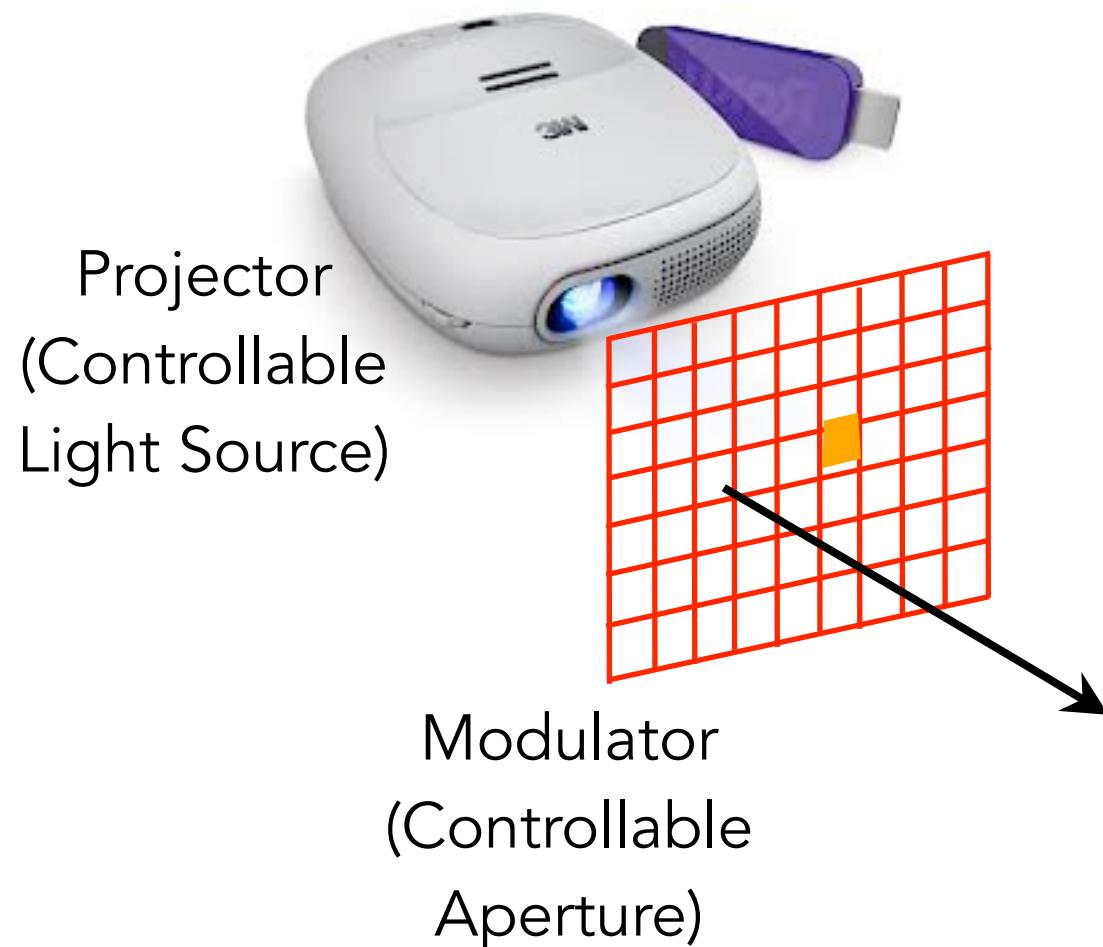


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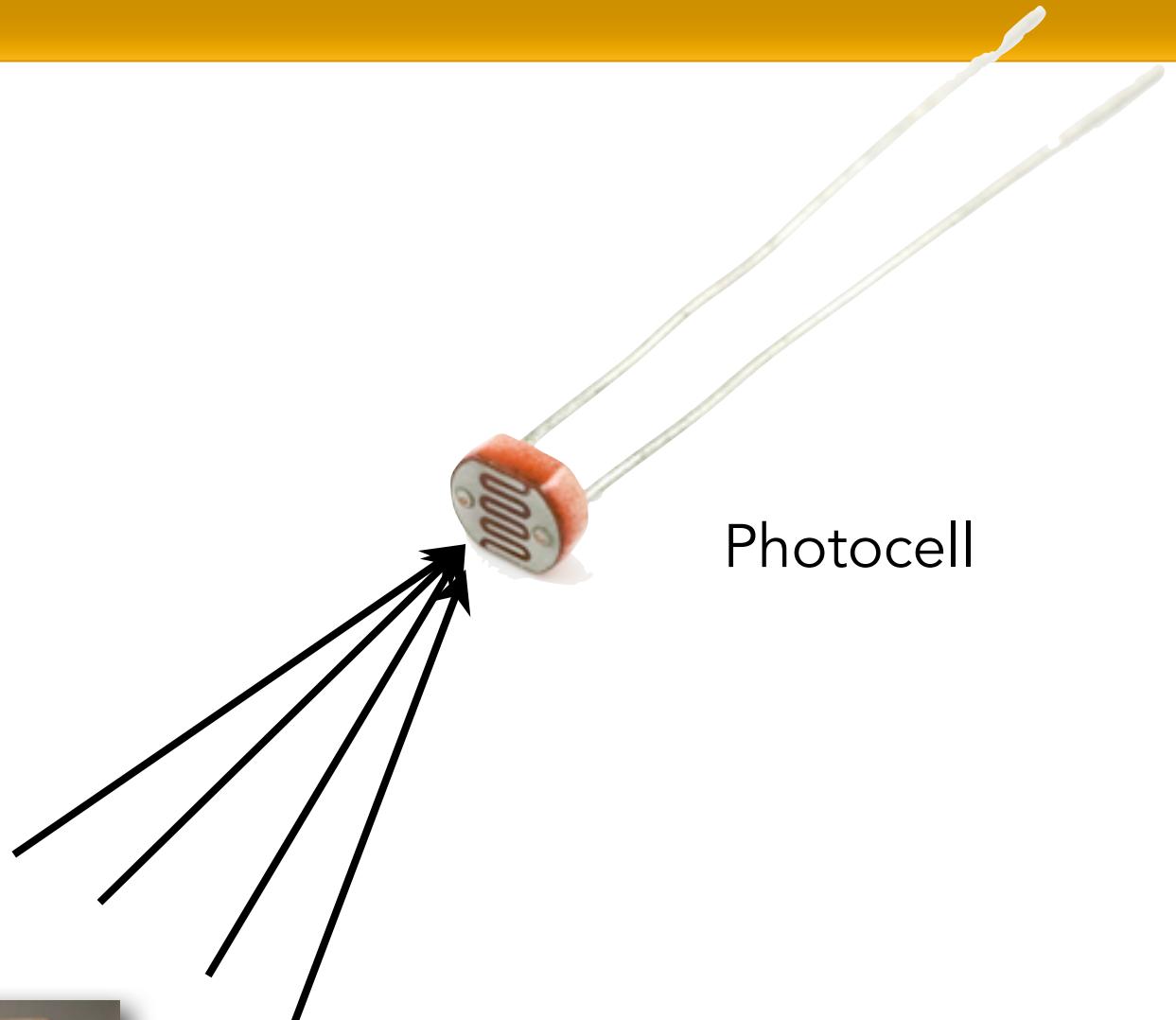


3D Scene

# Novel Illumination



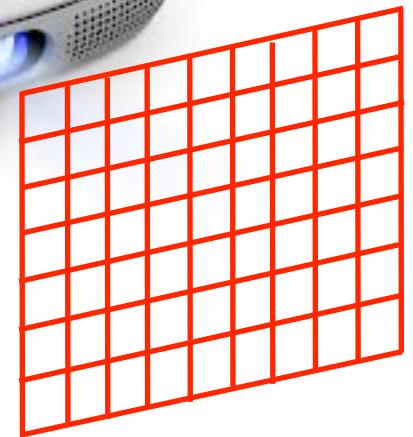
Schematic similar to one used by  
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# Novel Illumination



Projector  
(Controllable  
Light Source)



Modulator  
(Controllable  
Aperture)

Schematic similar to one used by  
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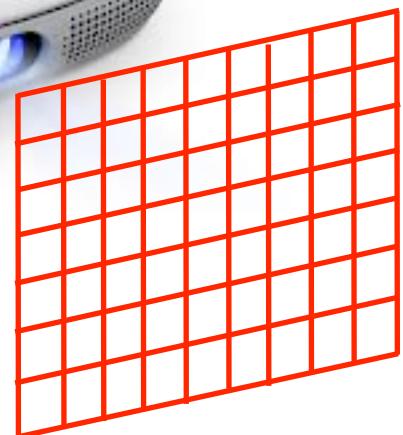
Scene



# Novel Illumination



Projector  
(Controllable  
Light Source)



Modulator  
(Controllable  
Aperture)



Schematic similar to one used by  
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Scene

# Novel Illumination



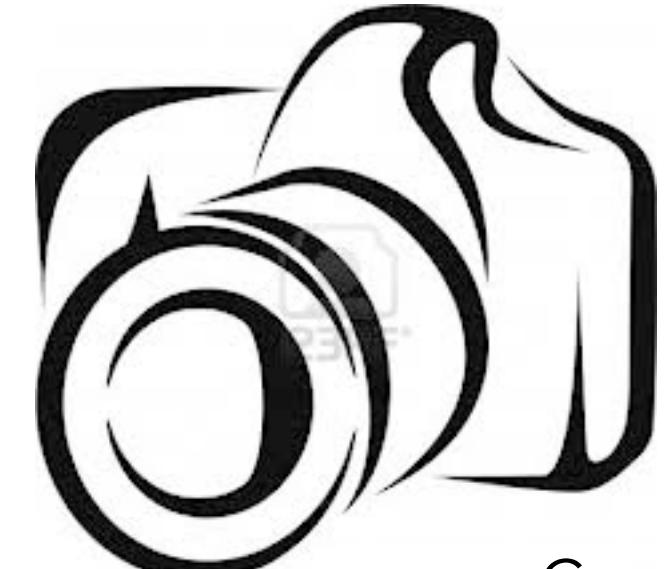
Projector  
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Light Source)

Modulator  
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Scene

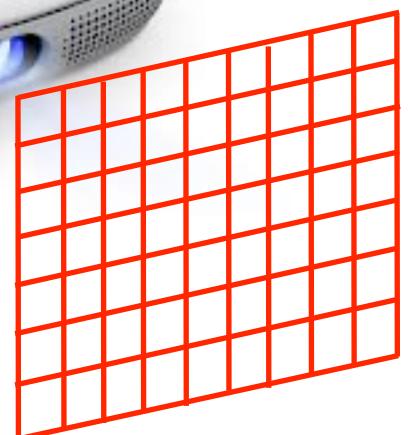


Camera

# Novel Illumination



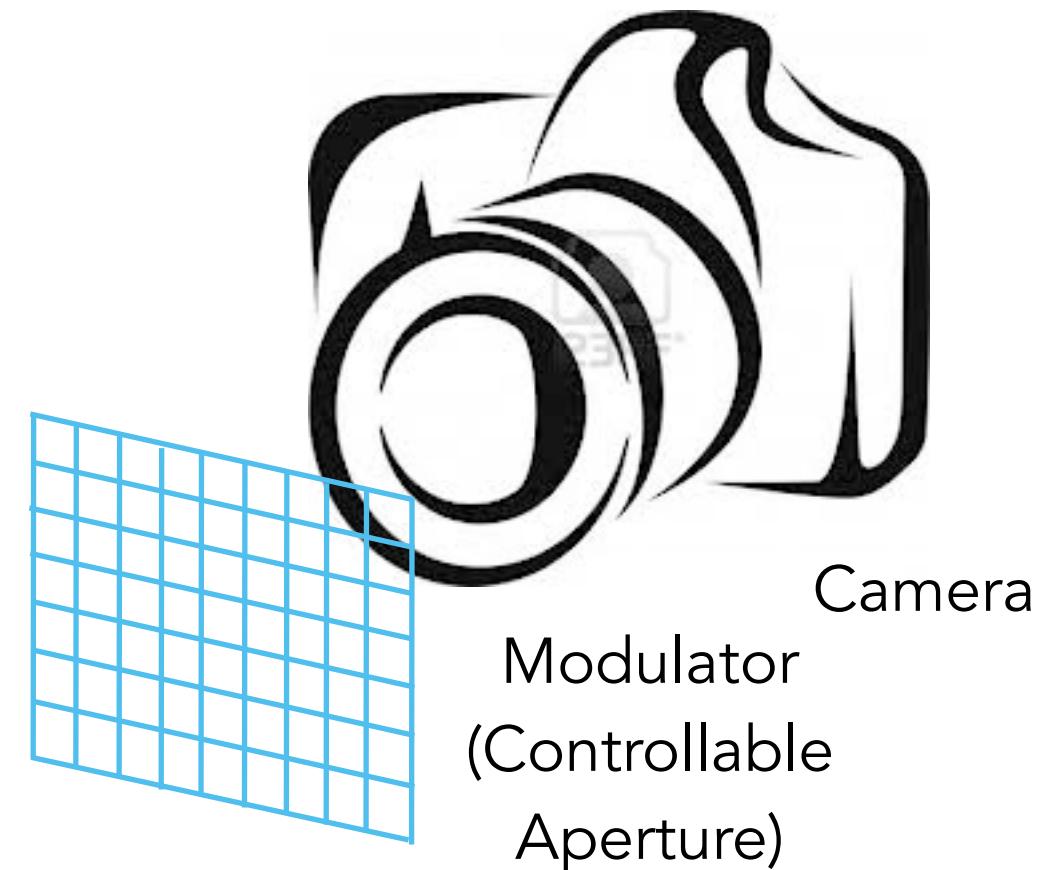
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Modulator  
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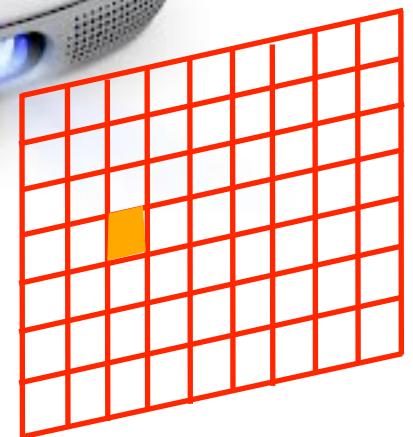
Camera  
Modulator  
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Aperture)

Scene

# Novel Illumination



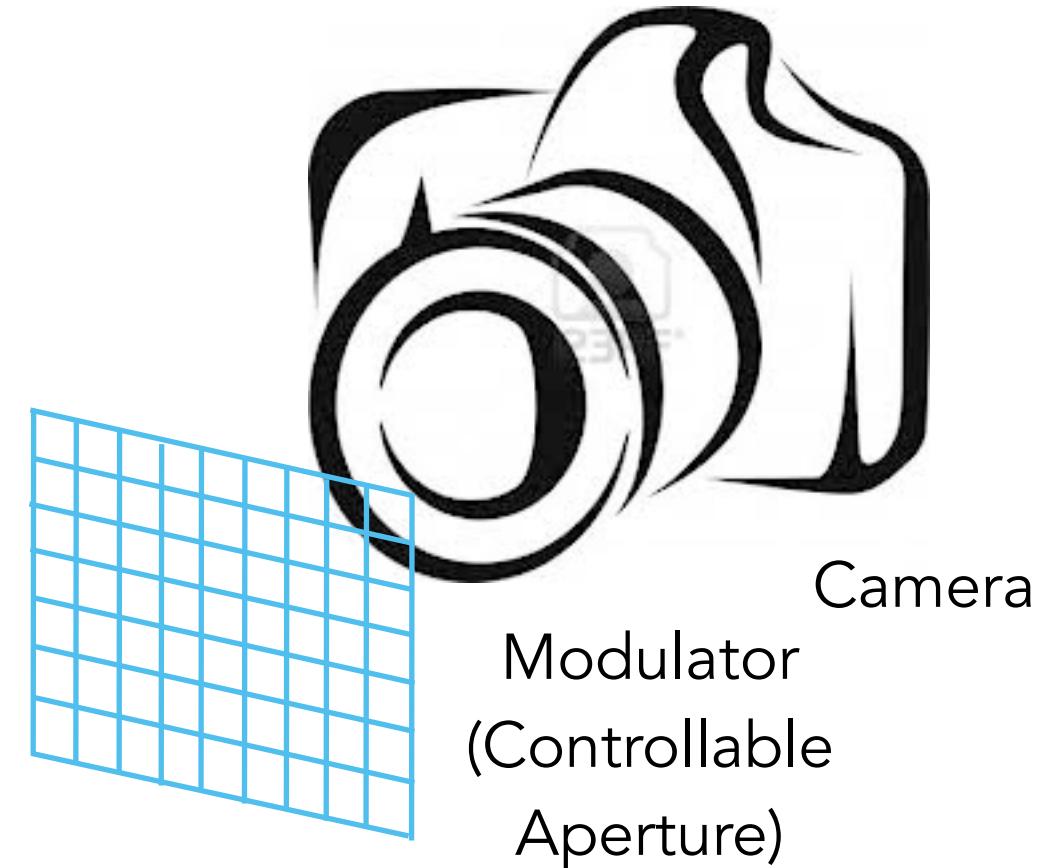
Projector  
(Controllable  
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Modulator  
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Aperture)



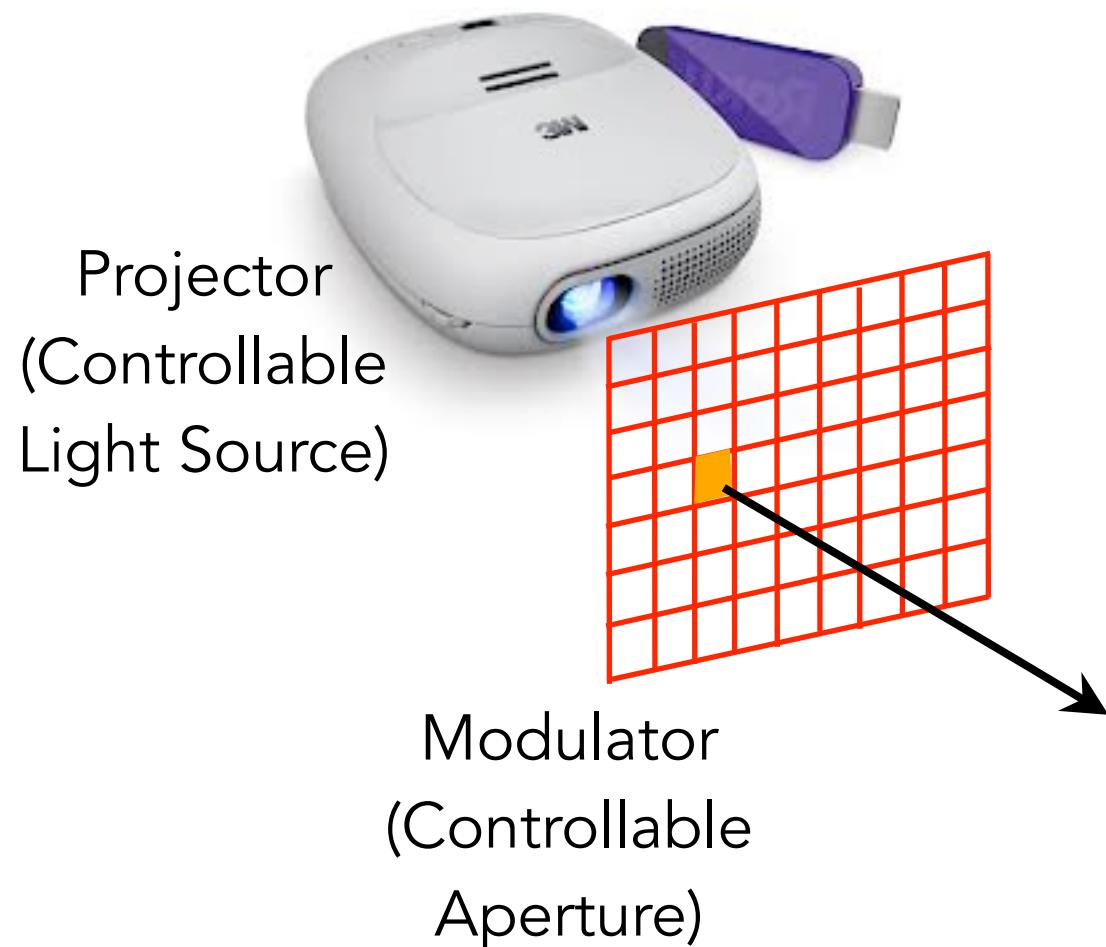
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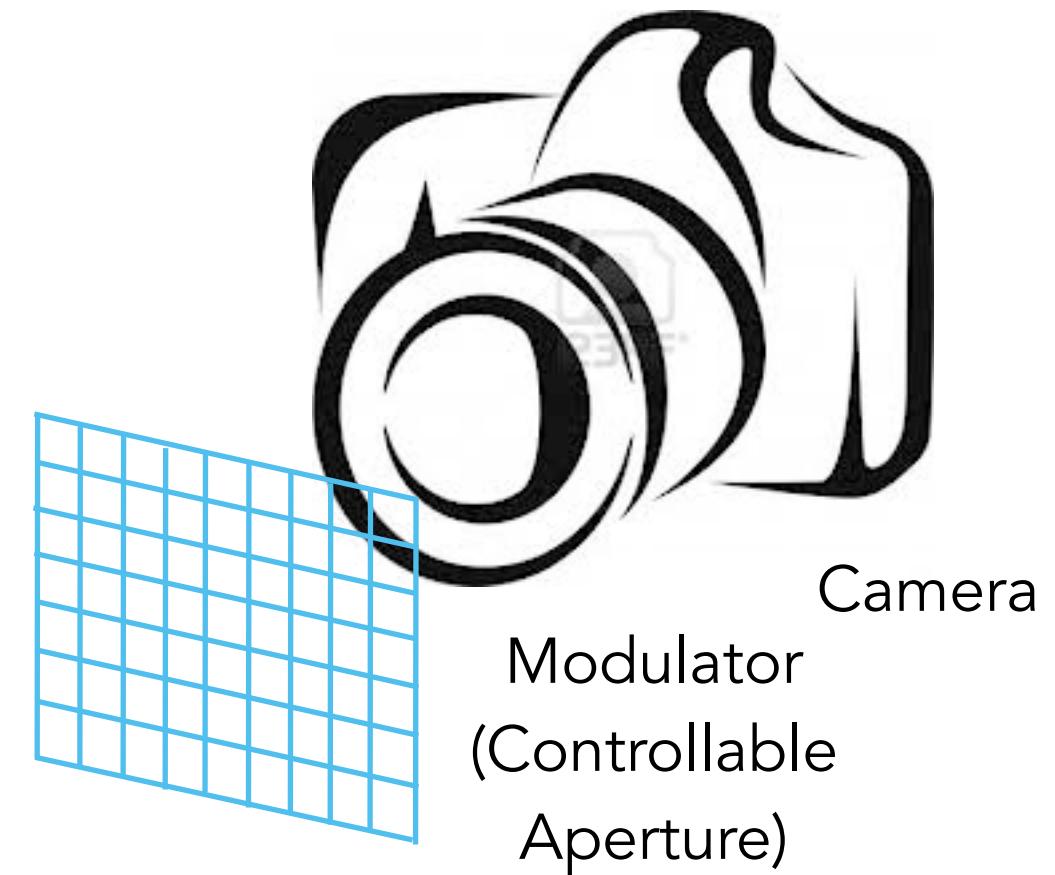
Camera  
Modulator  
(Controllable  
Aperture)

Scene

# Novel Illumination

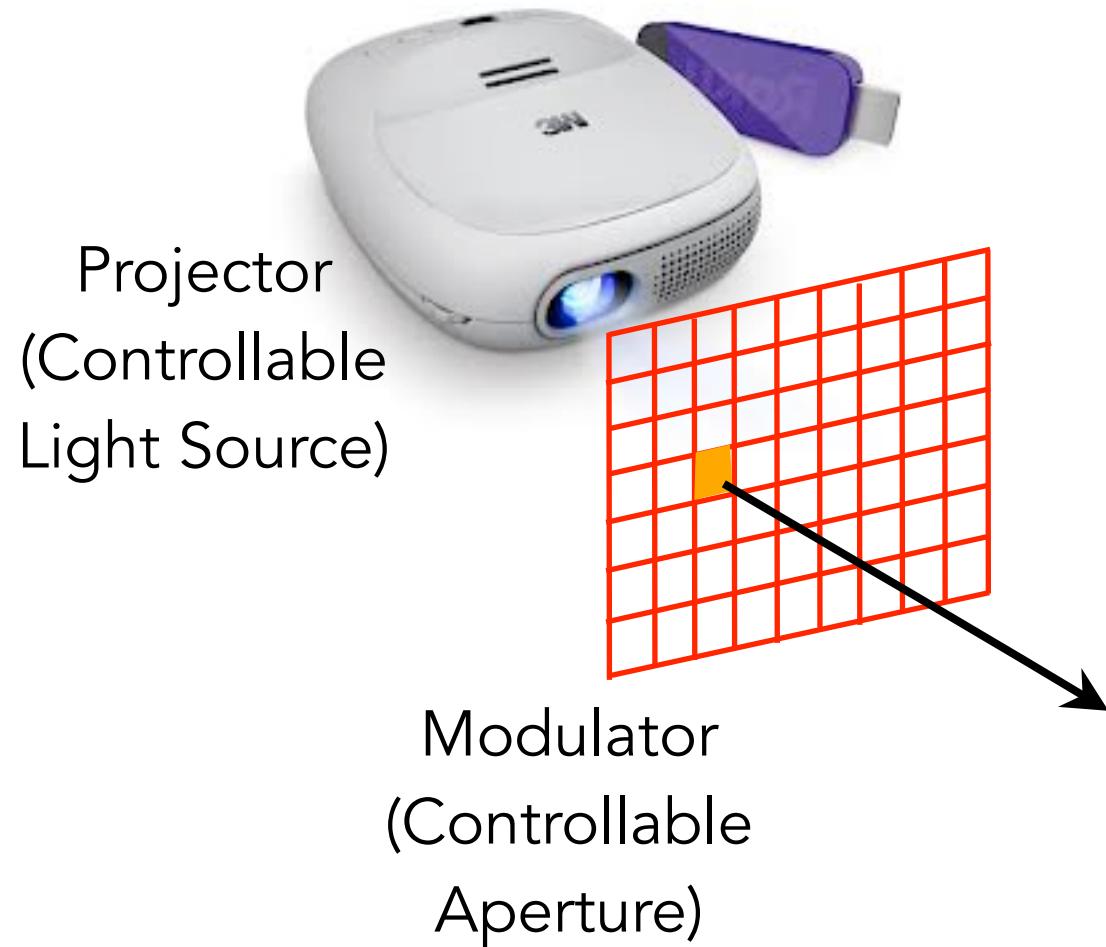


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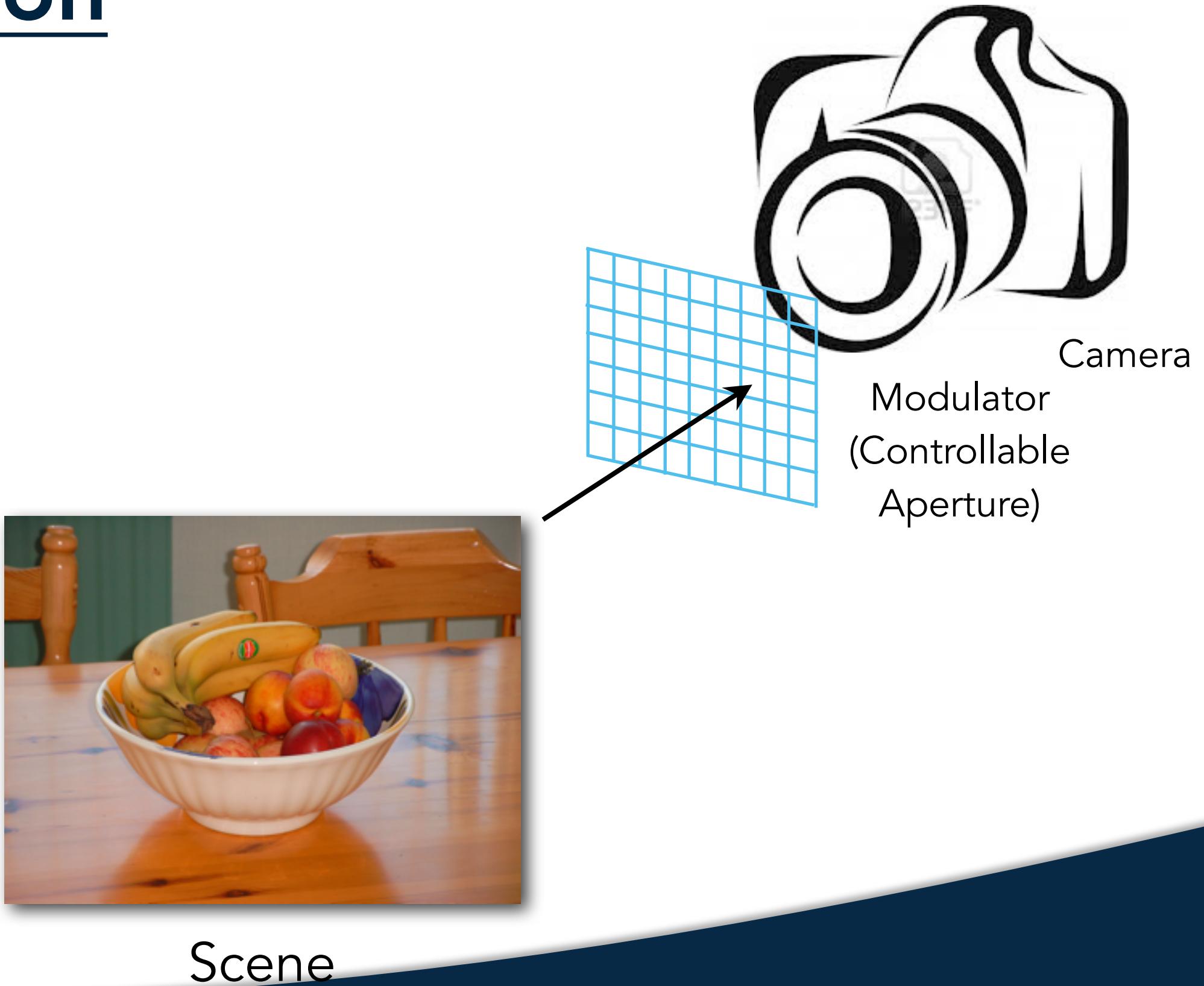


Scene

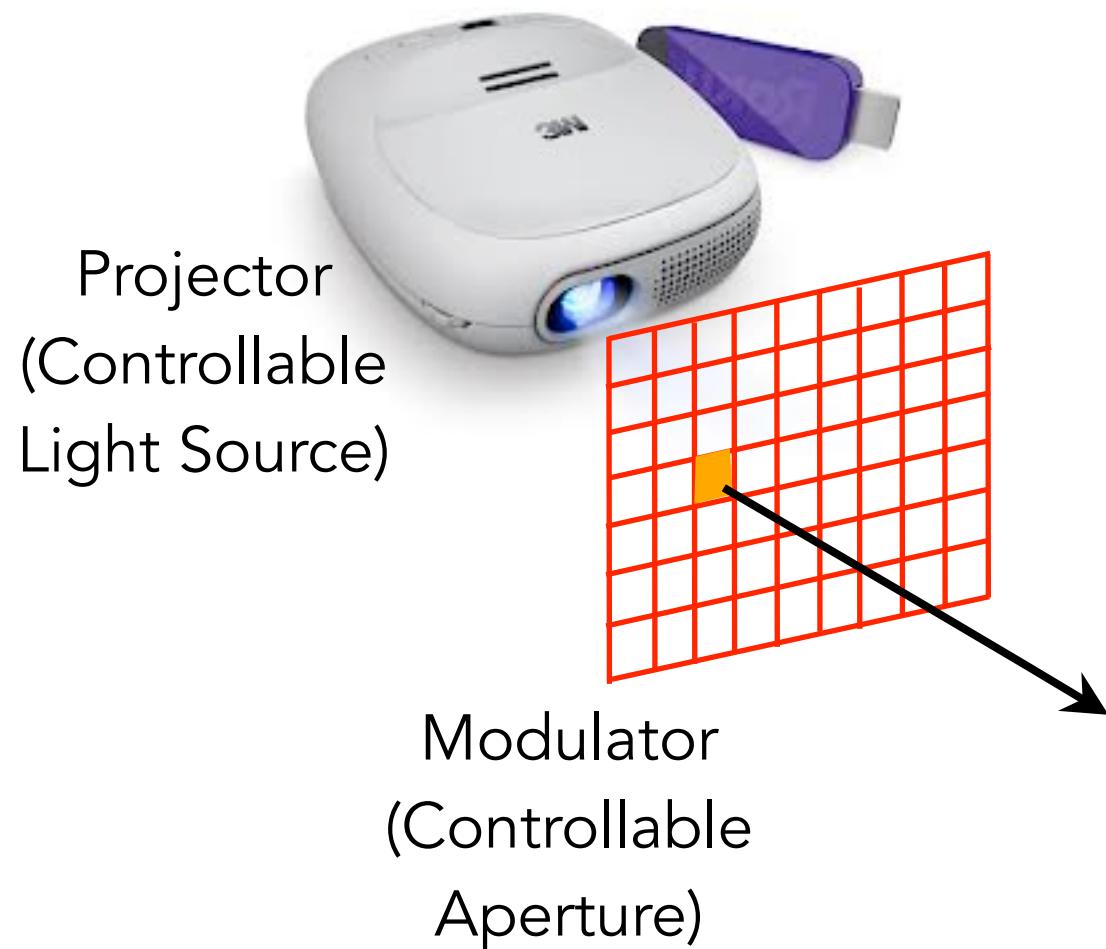
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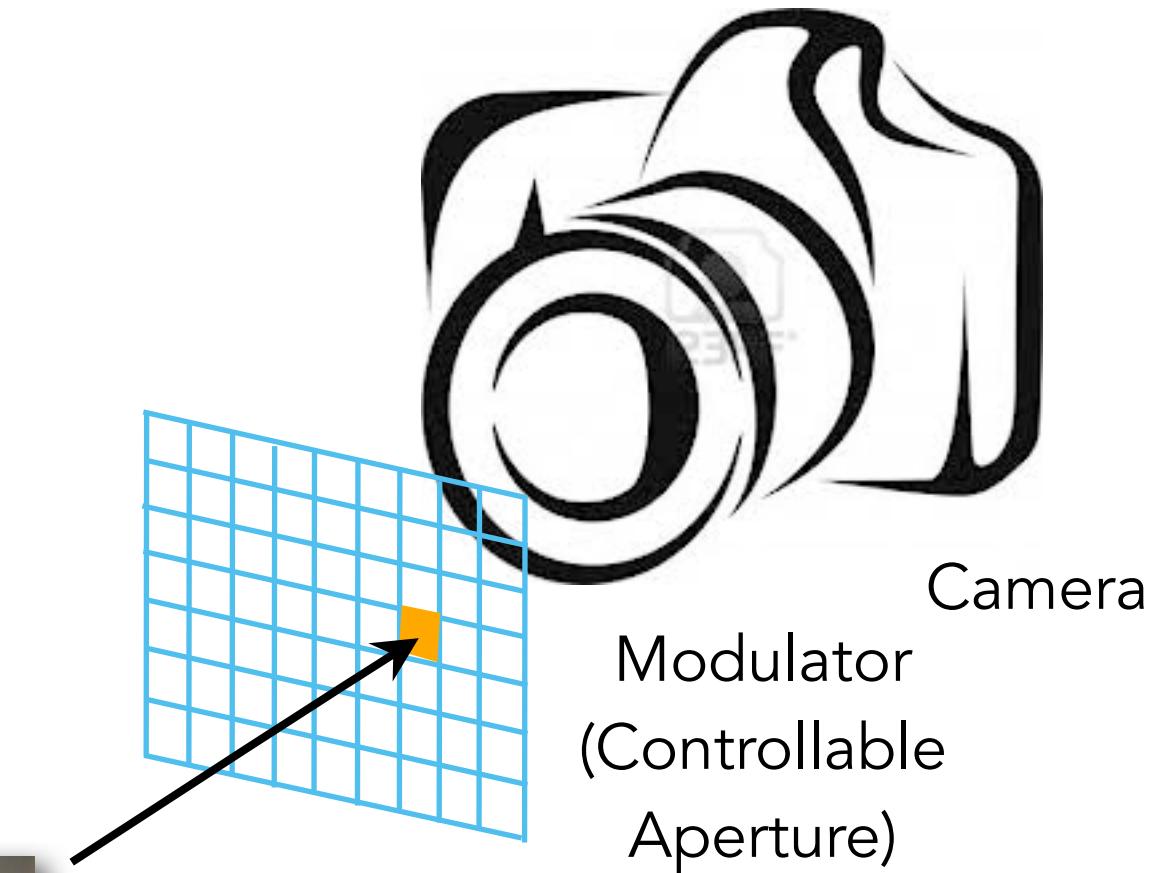
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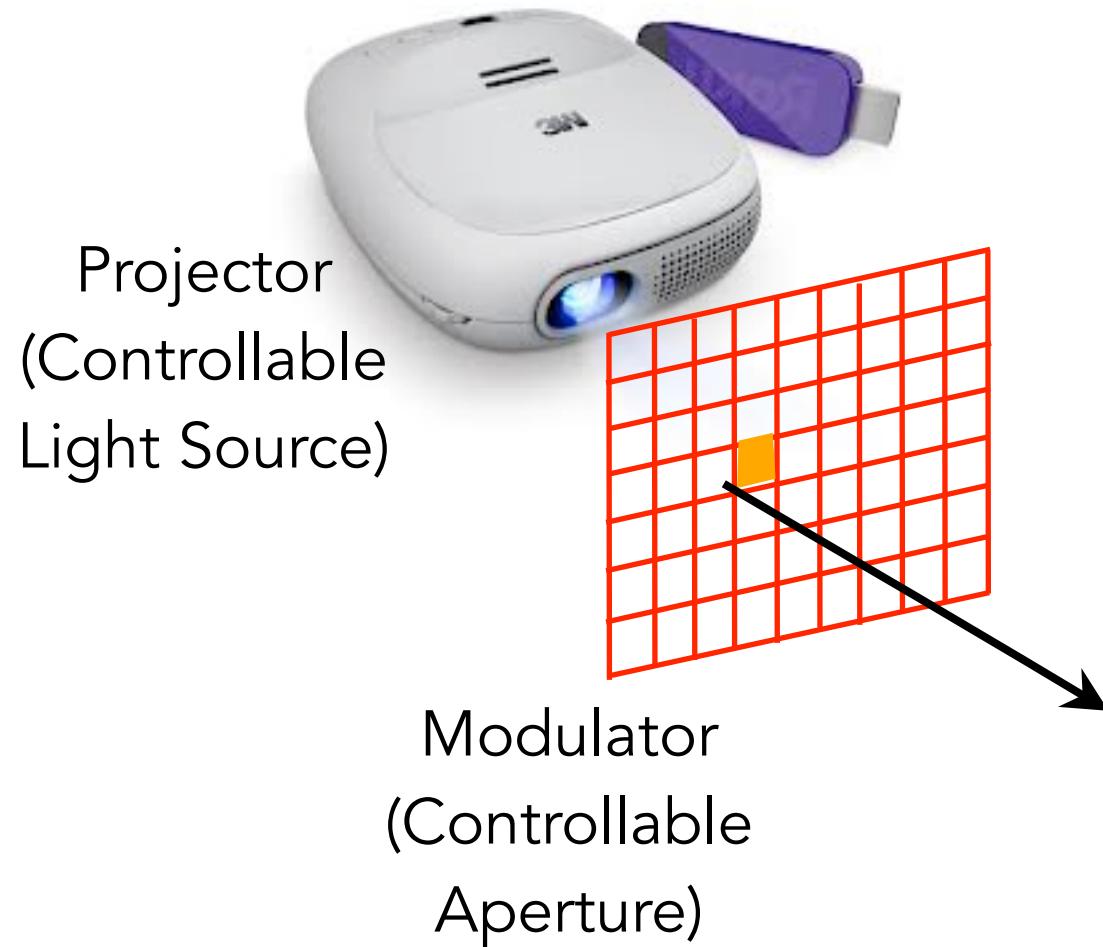


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Scene

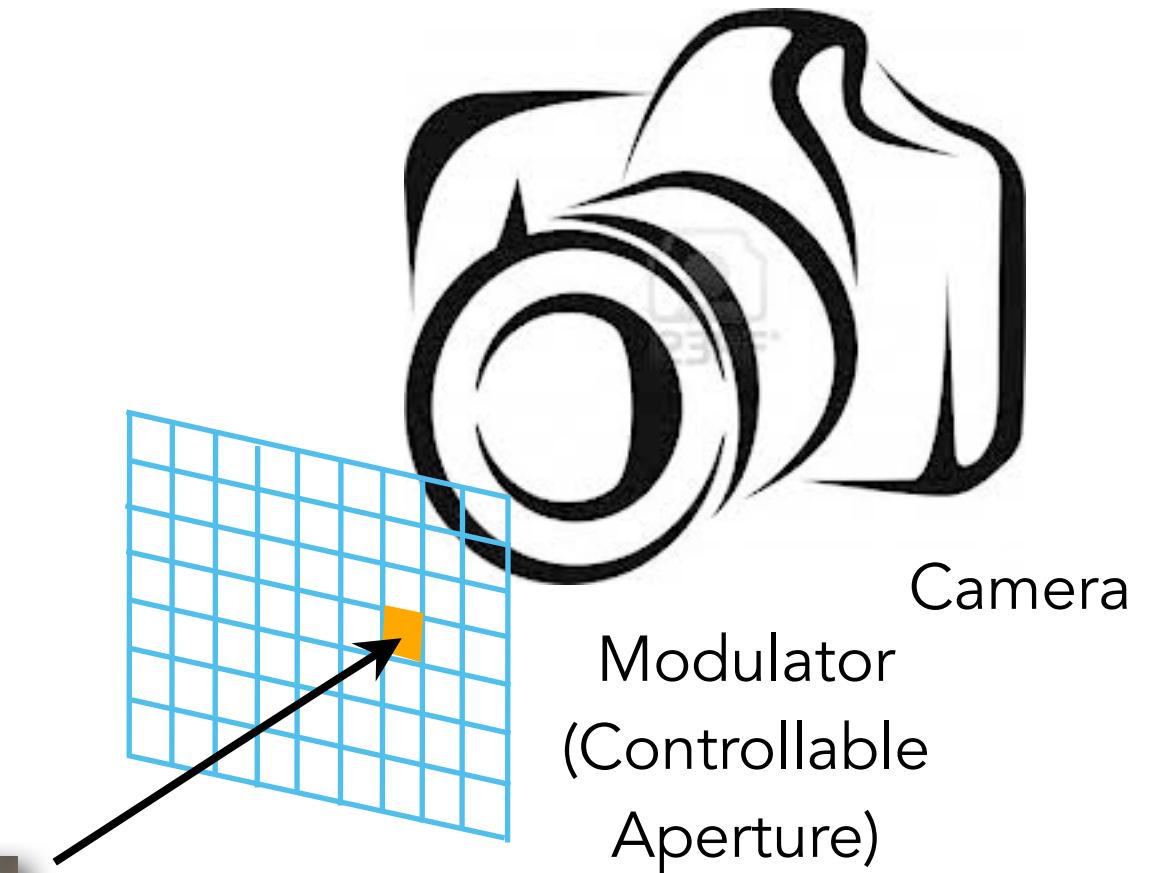
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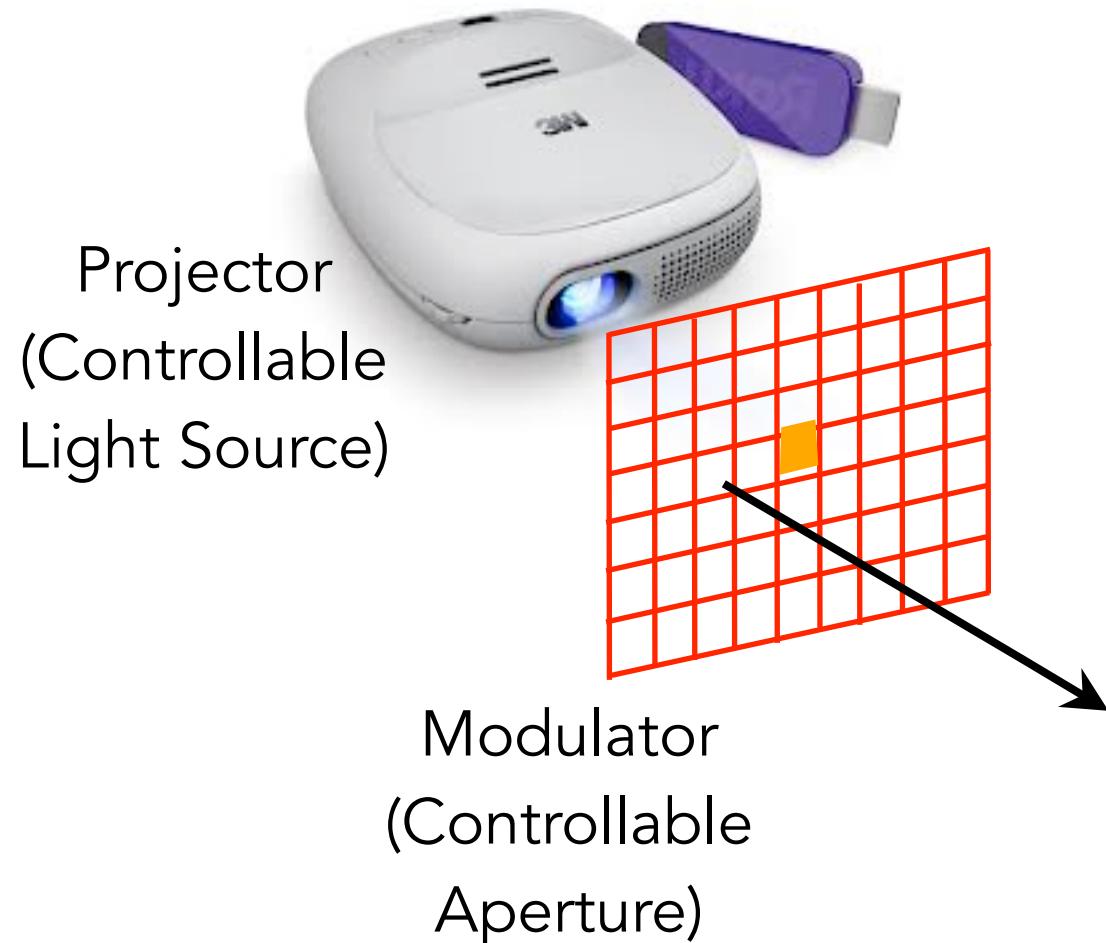
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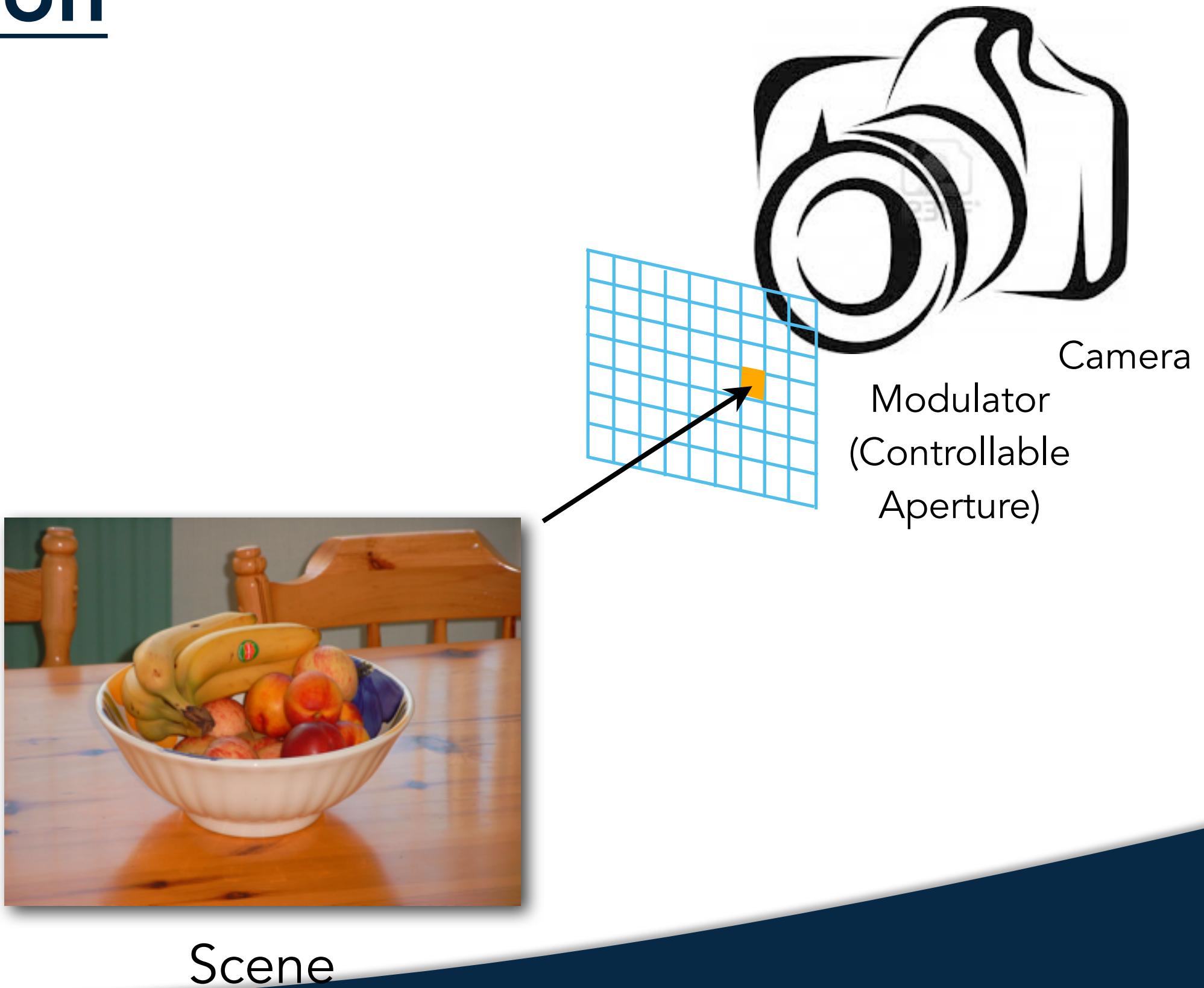
Scene



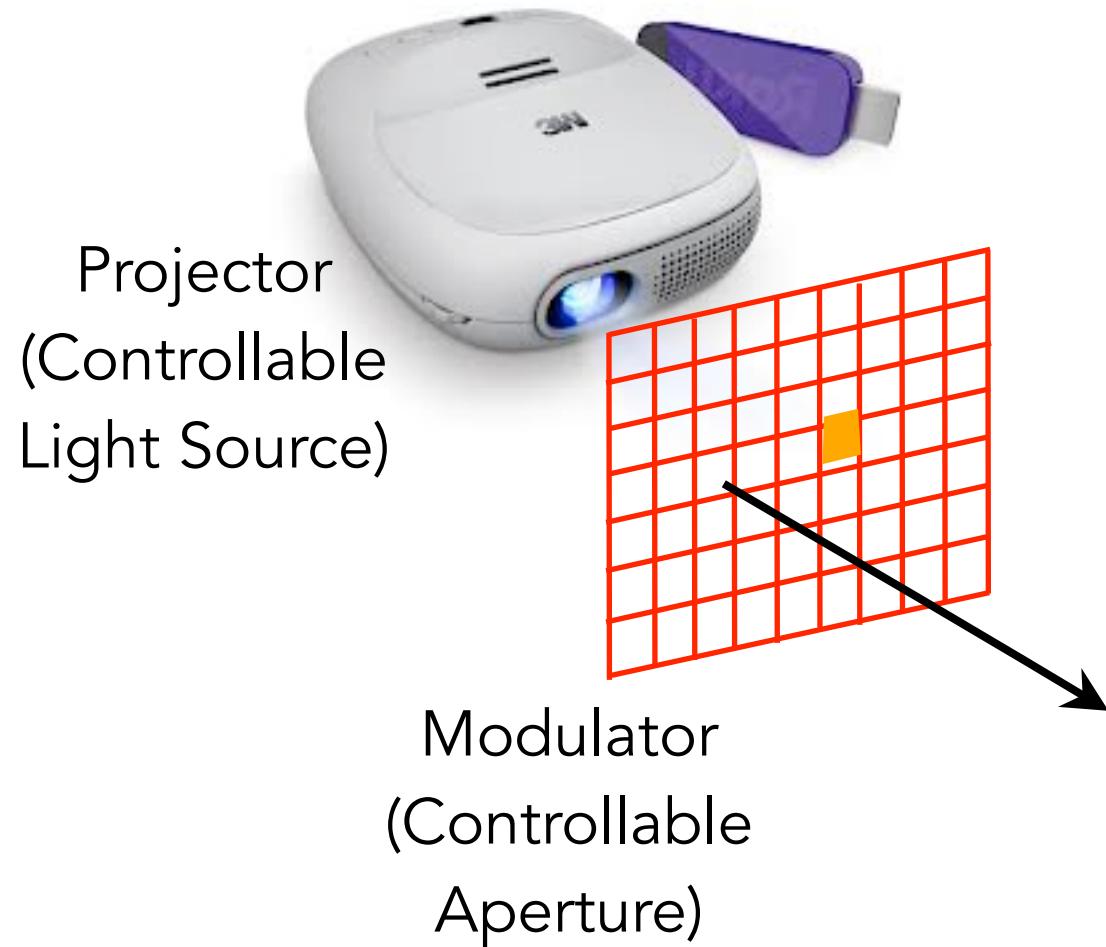
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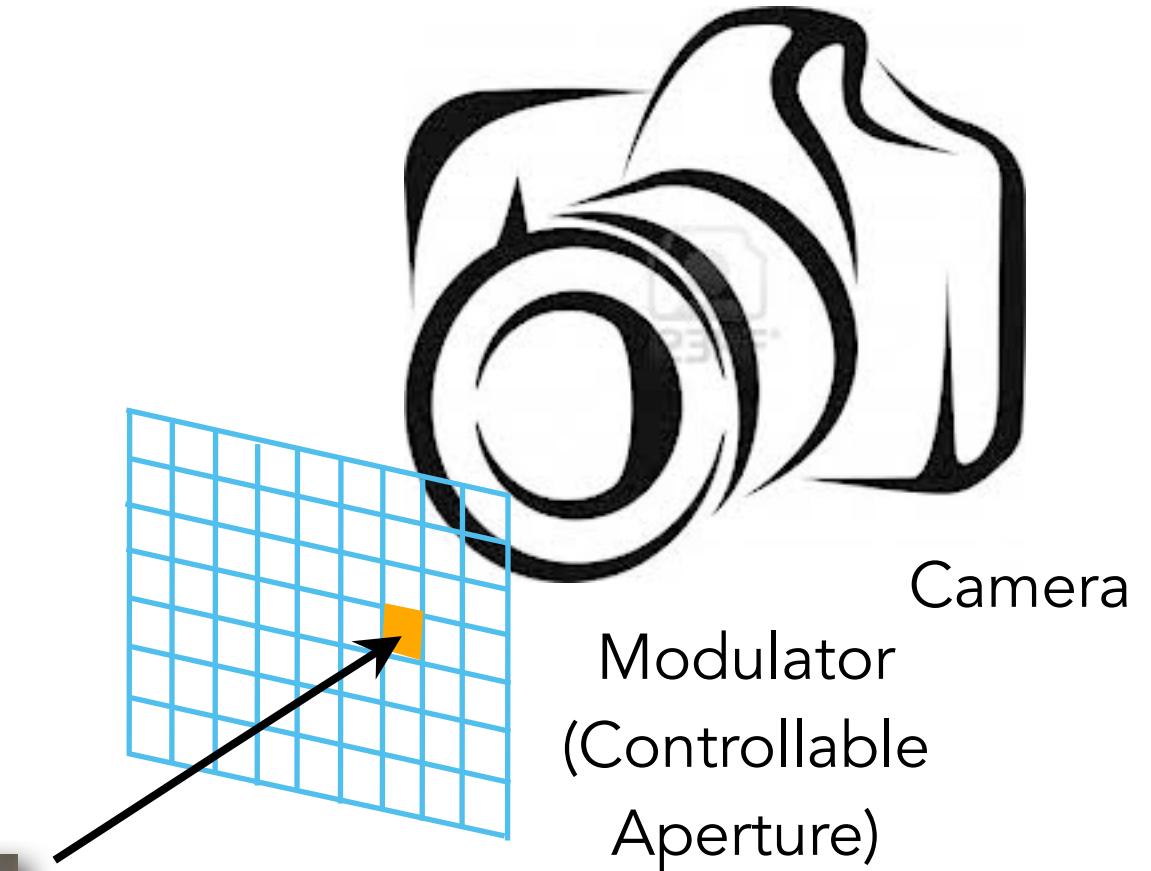
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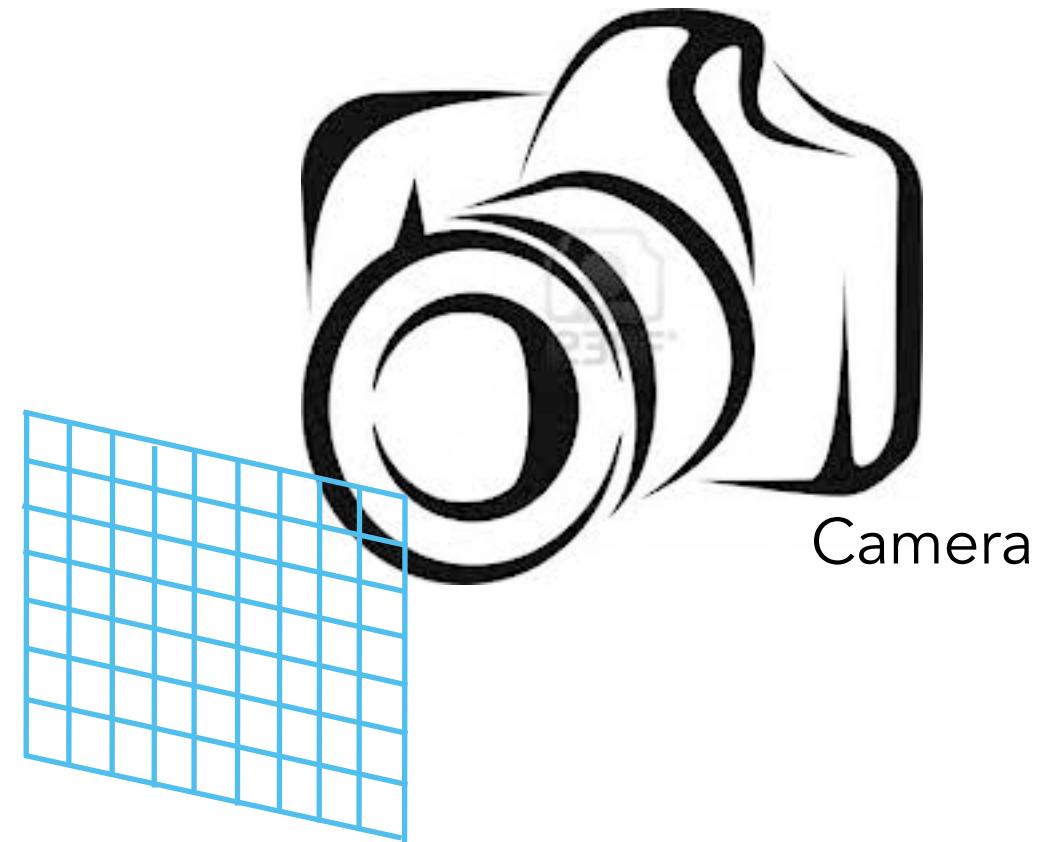
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Scene



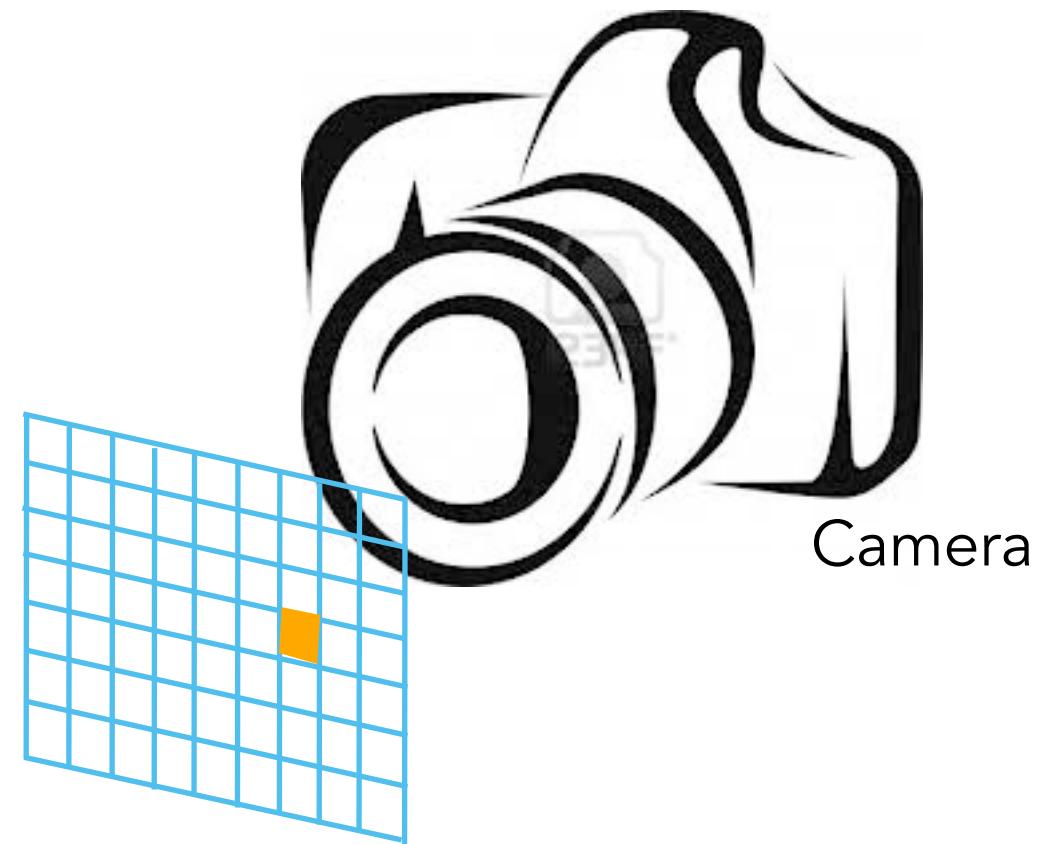
# Dual Photography



*Dual Photography, Sen et al. SIGGRAPH 2005*

*Schematic similar to one used by Shree Nayar and Ramesh Raskar*

# Dual Photography



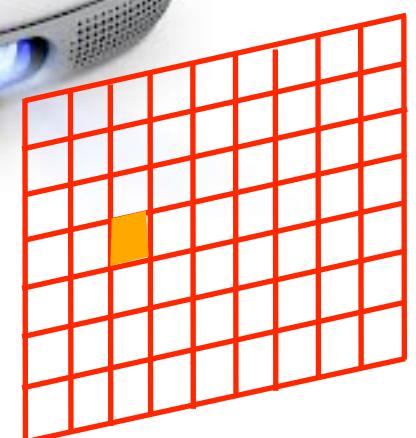
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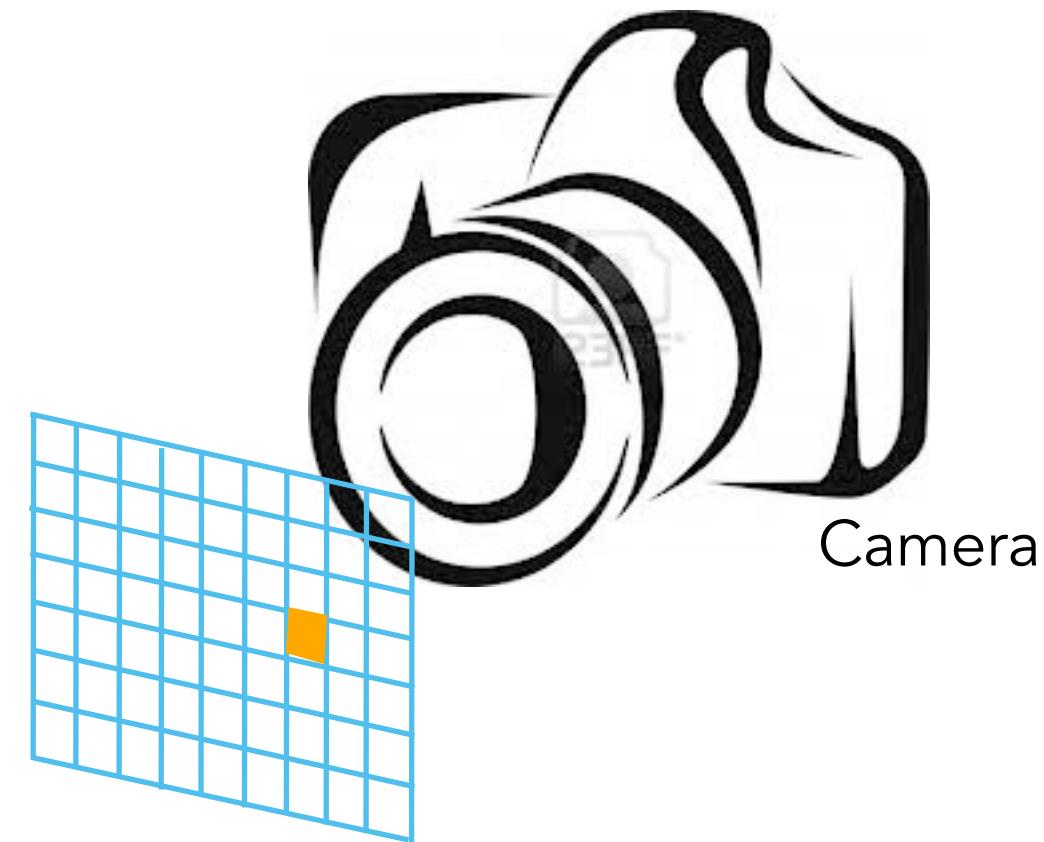
Projector  
(Controllable  
Light Source)



Modulator  
(Controllable  
Aperture)



Scene

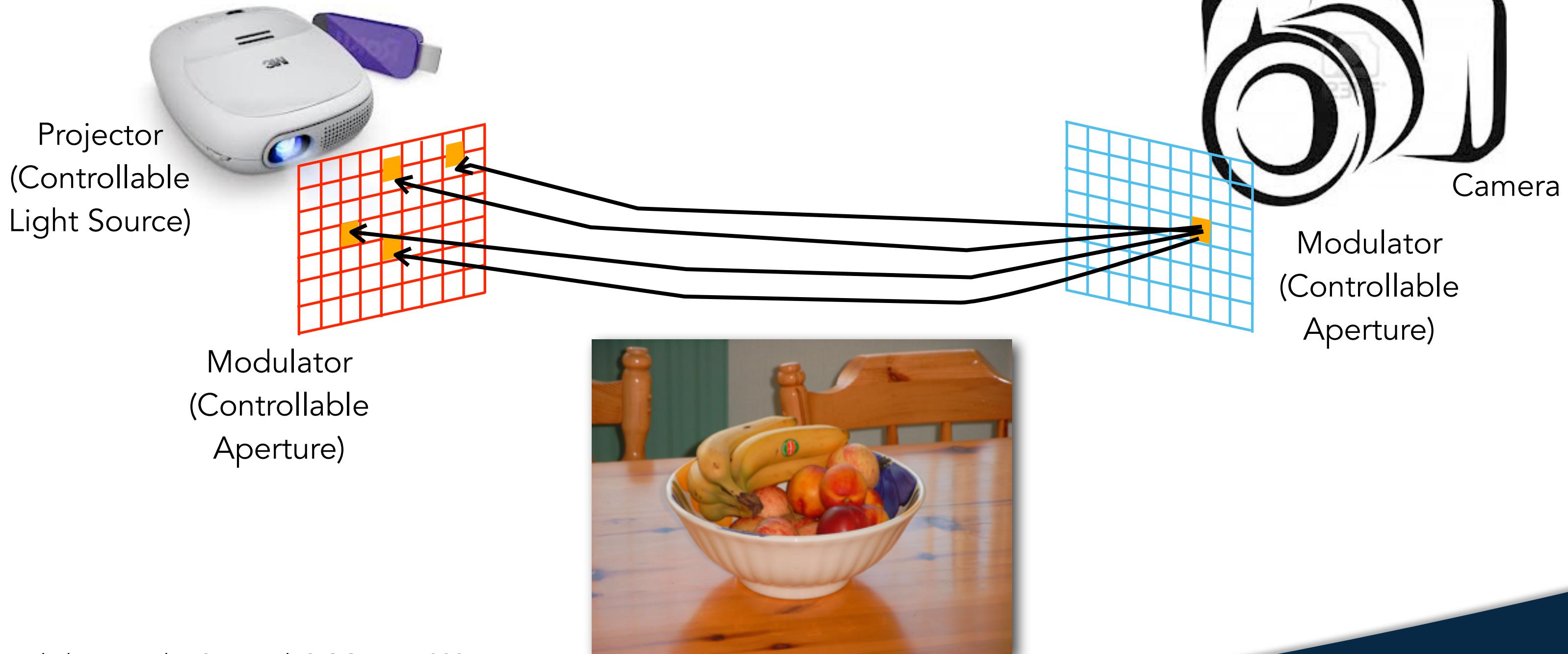


Camera

*Dual Photography, Sen et al. SIGGRAPH 2005*

*Schematic similar to one used by Shree Nayar and Ramesh Raskar*

# Dual Photography



*Dual Photography, Sen et al. SIGGRAPH 2005*

*Schematic similar to one used by Shree Nayar and Ramesh Raskar*

*Scene*

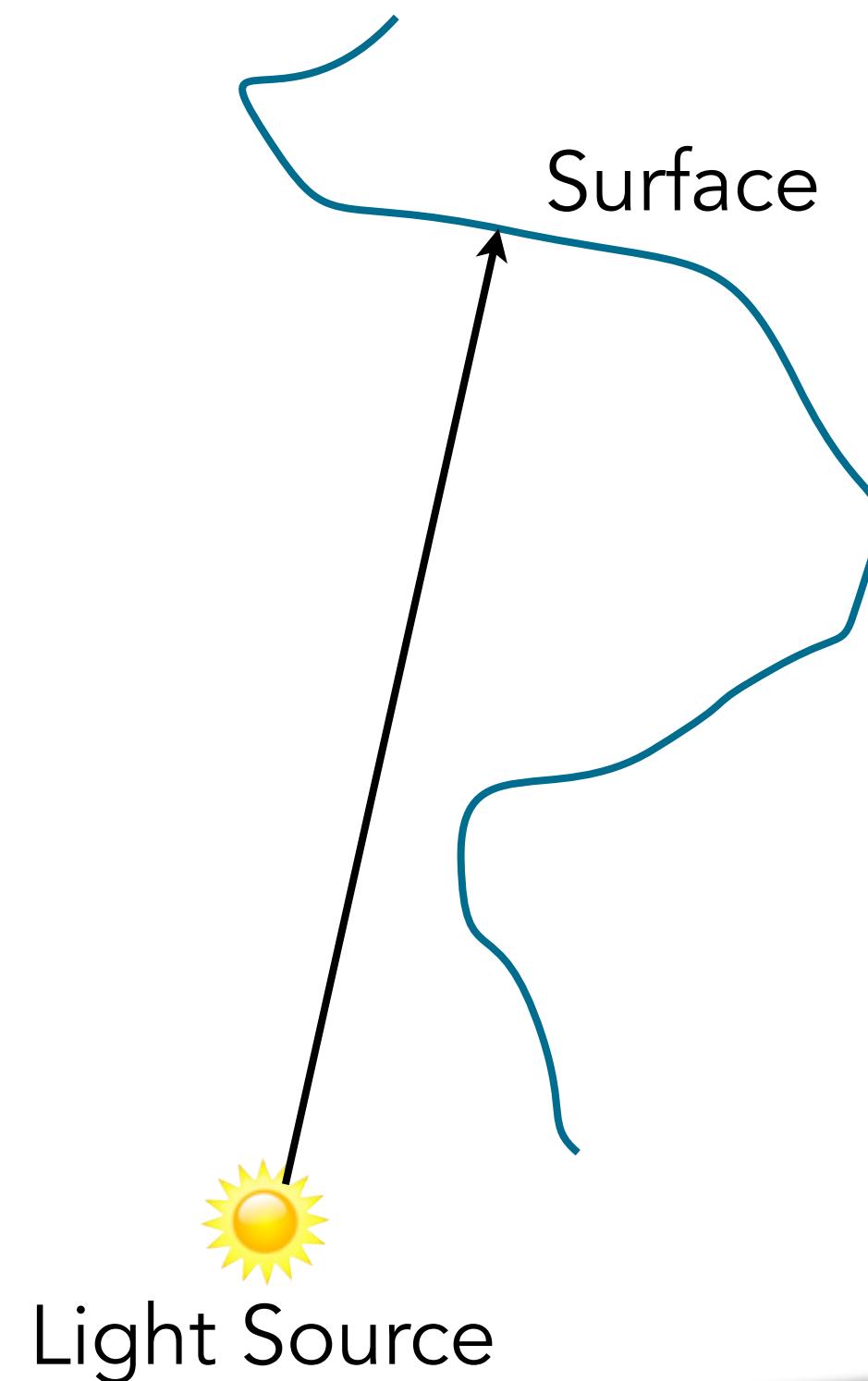
# Reflective properties of ray of light



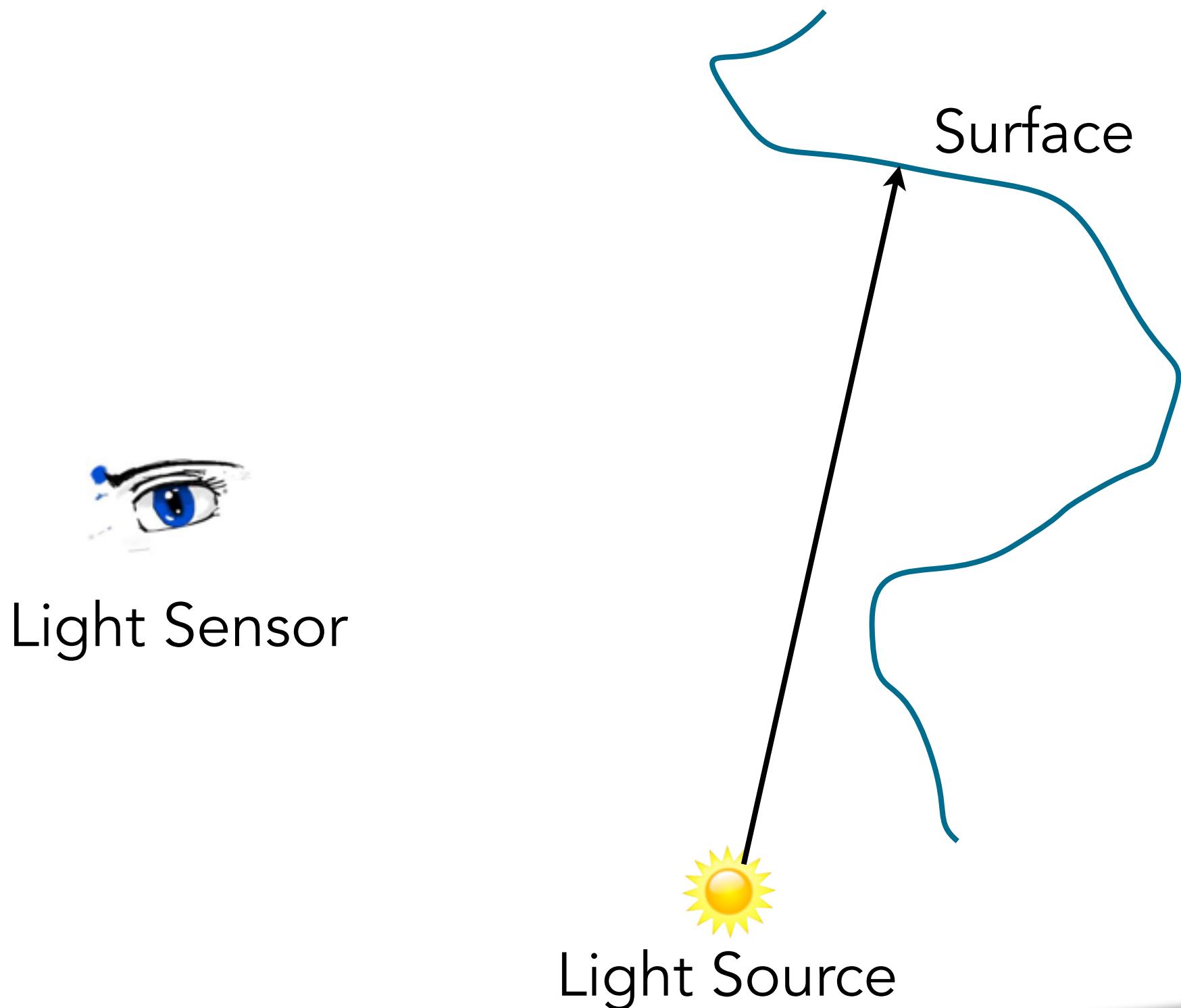
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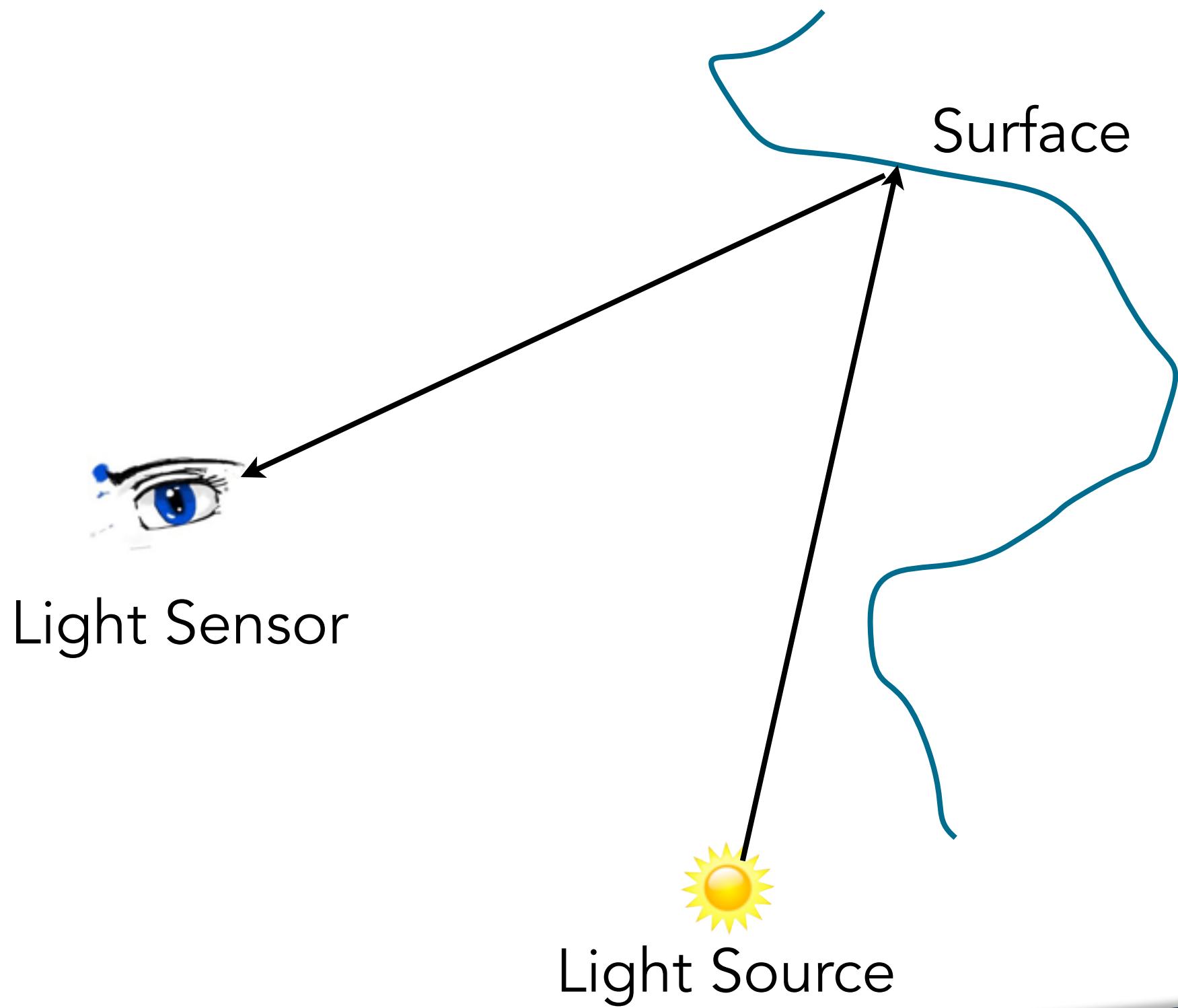
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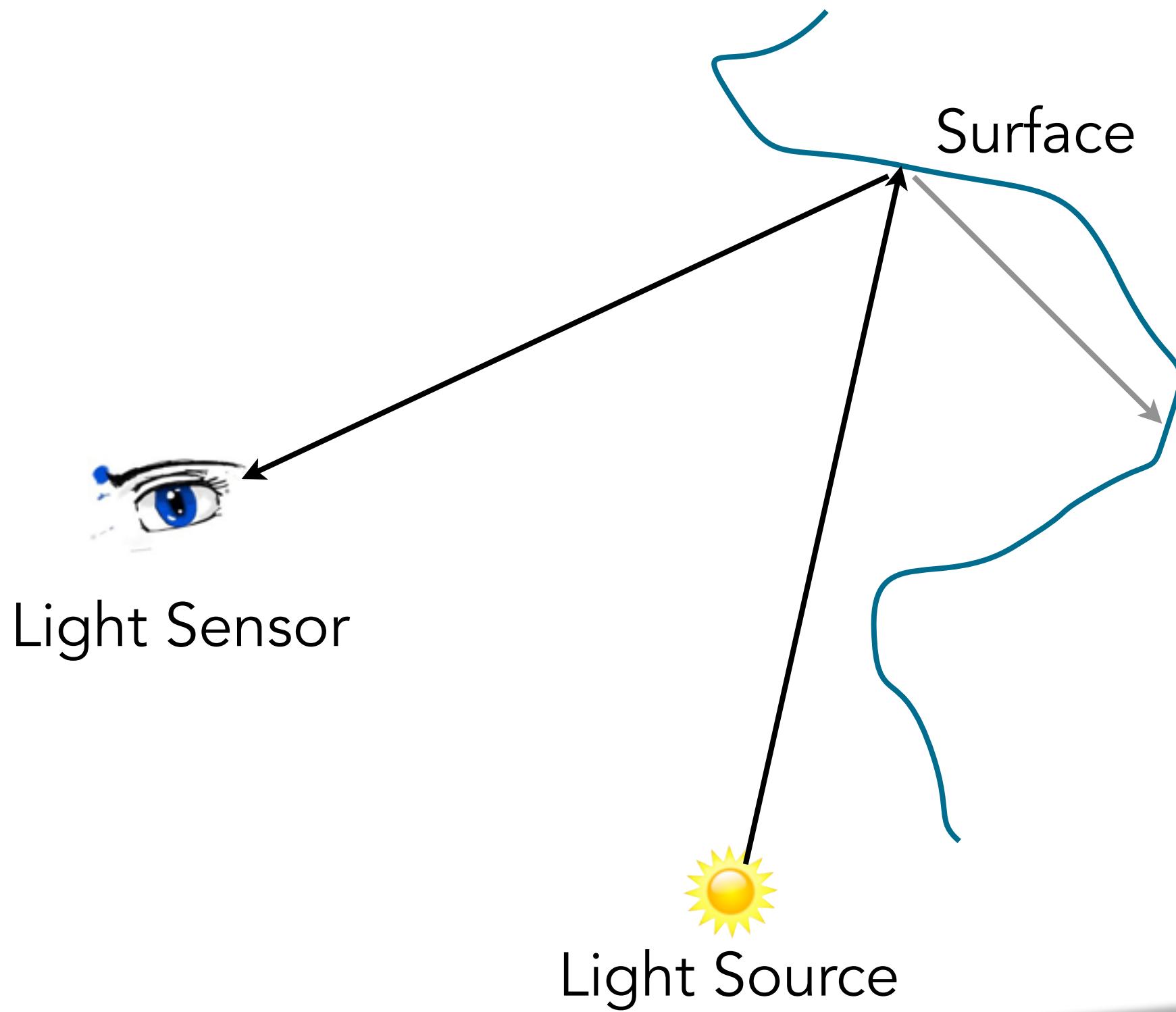
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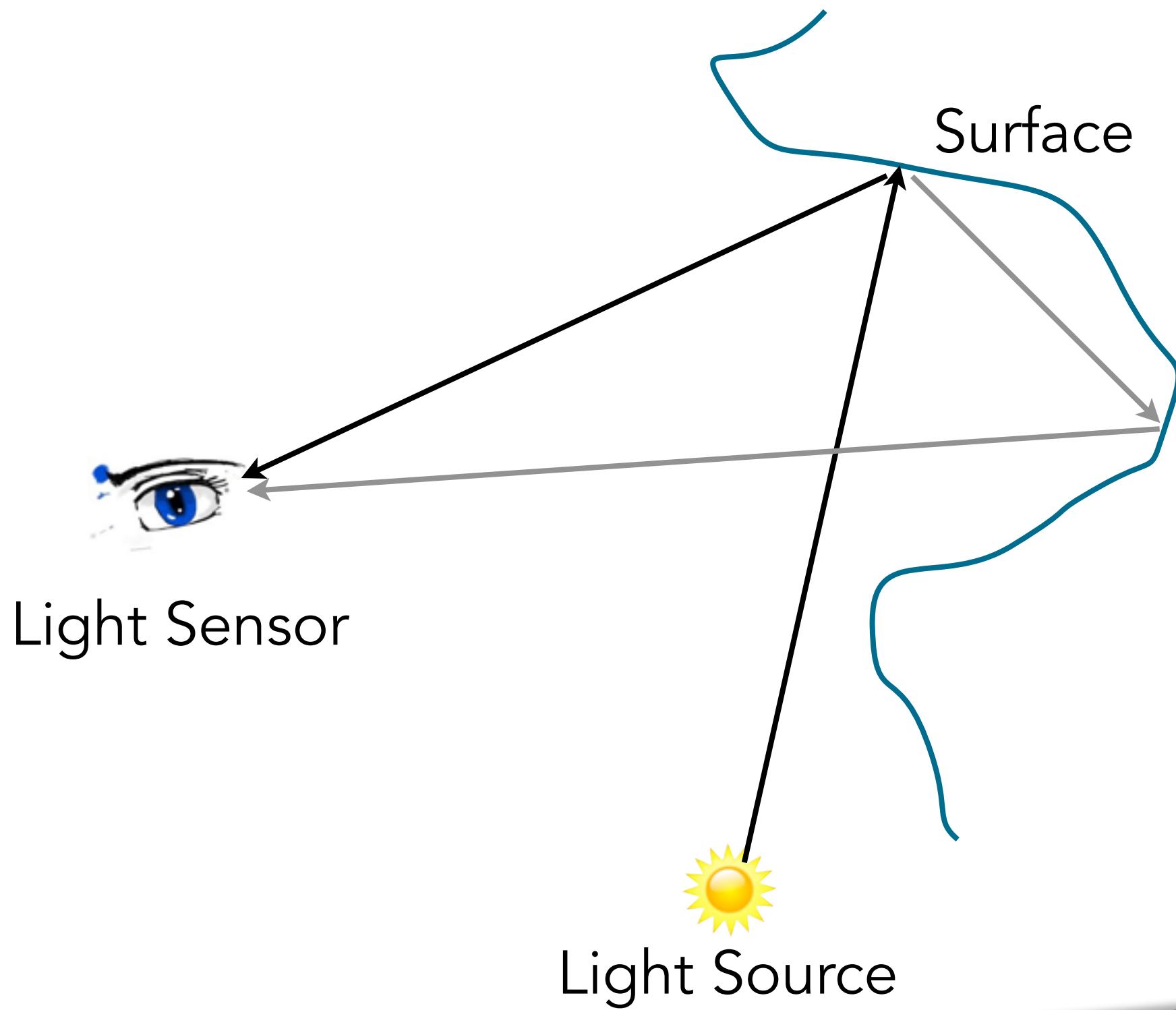
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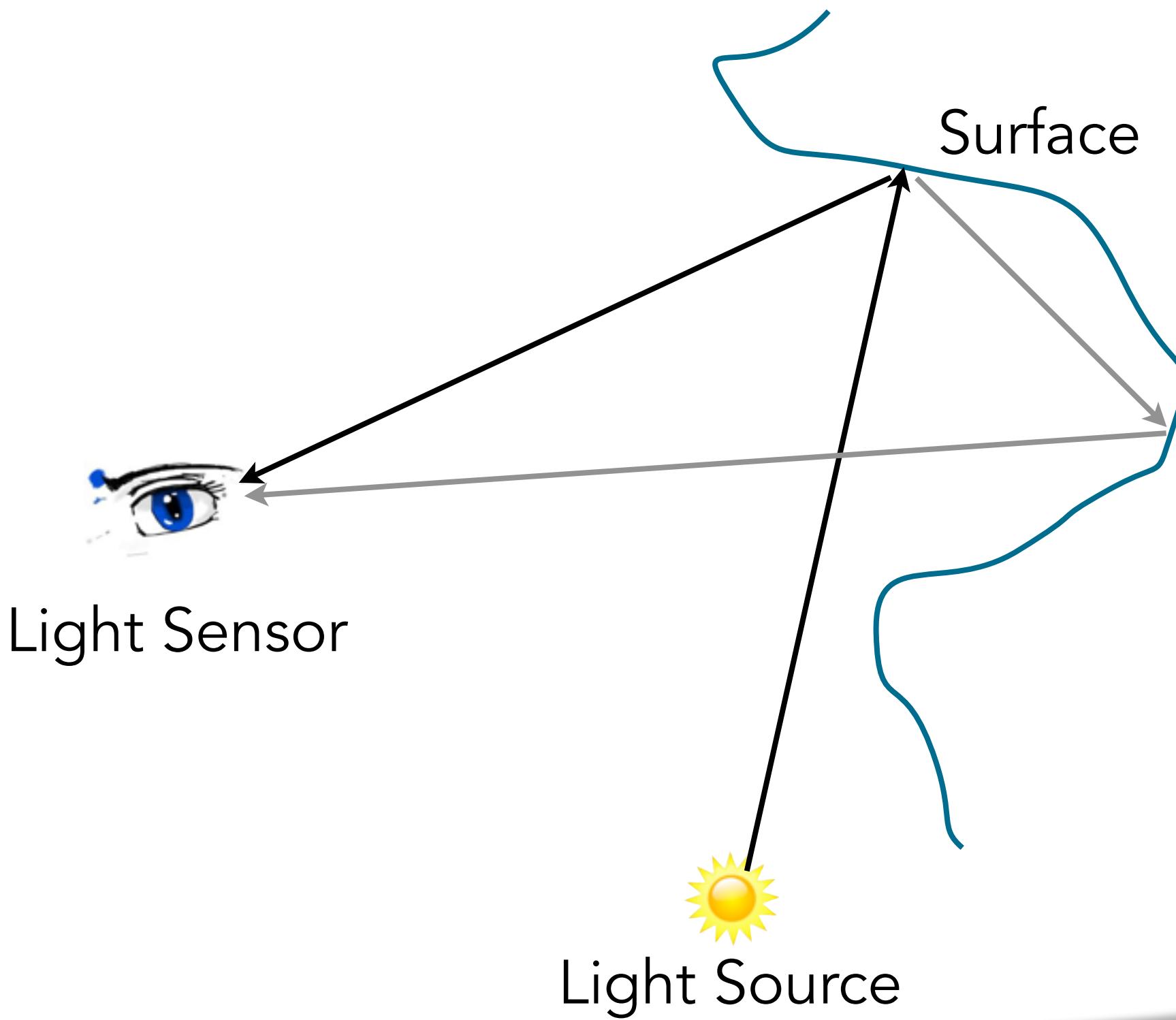
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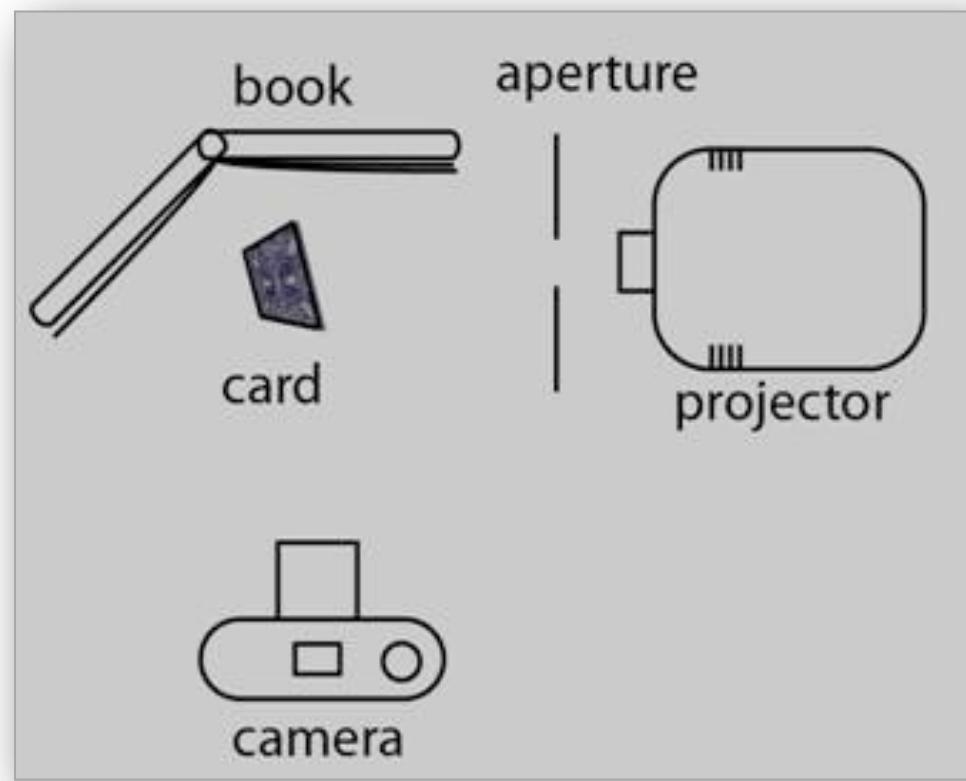


# Reflective properties of ray of light



Reflection of light depends  
on the kind of surface  
Specular (mirror),  
Diffuse (matte), etc.

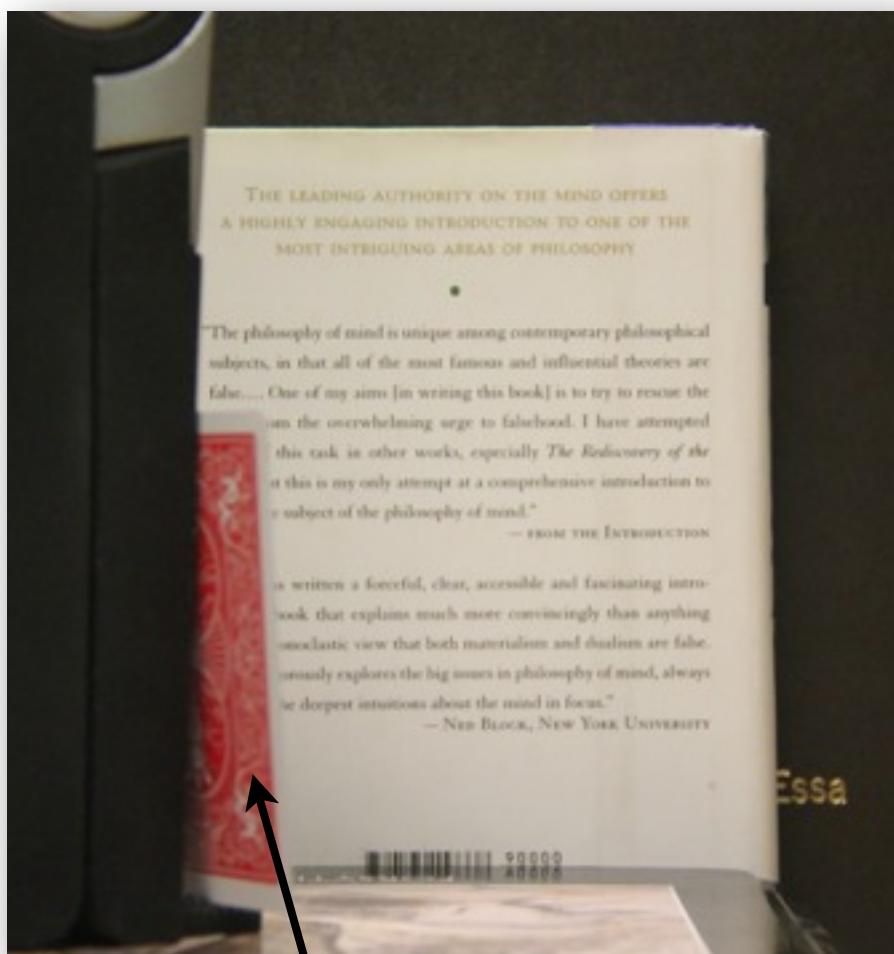
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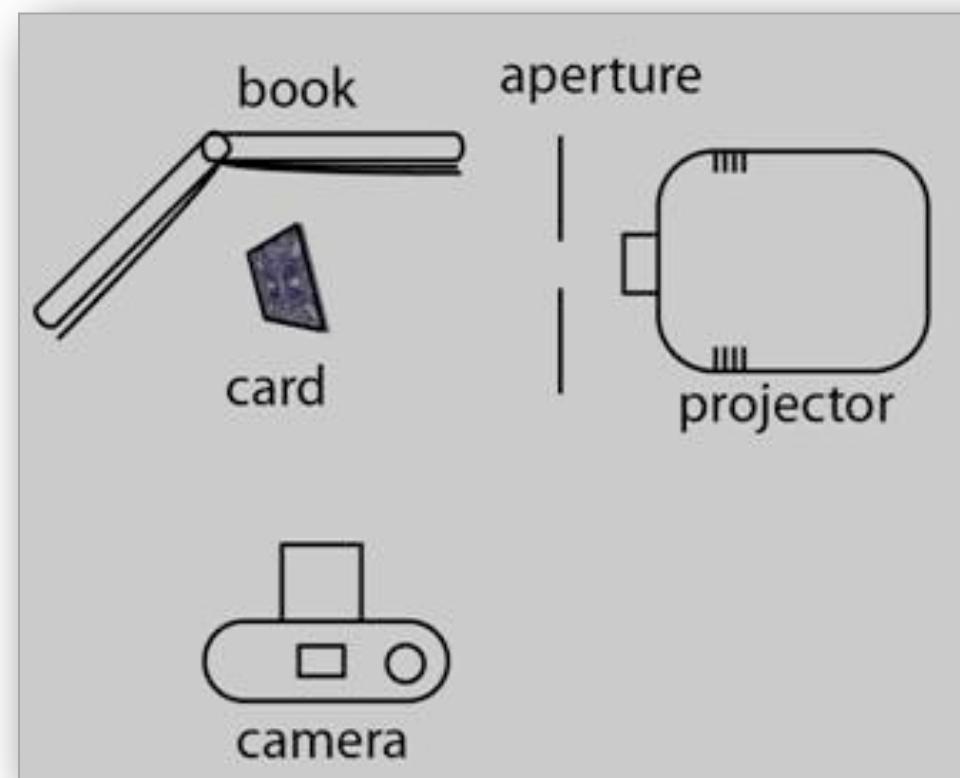
*This just shows a MOCK-UP of the experiment*

# Dual Photography

This is what the  
camera sees



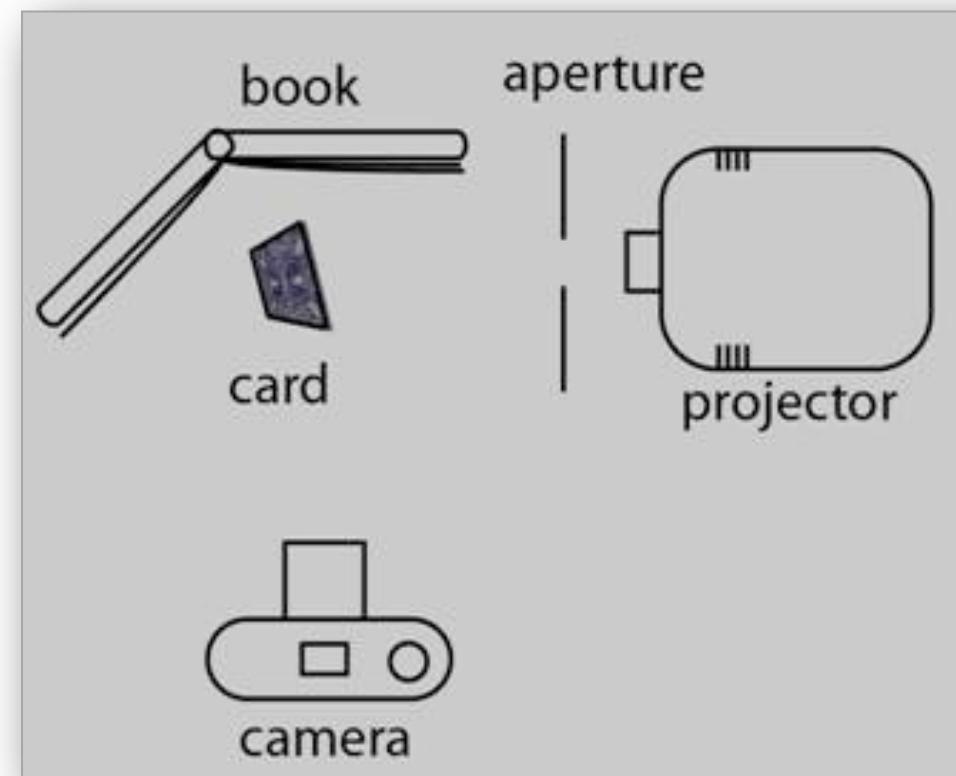
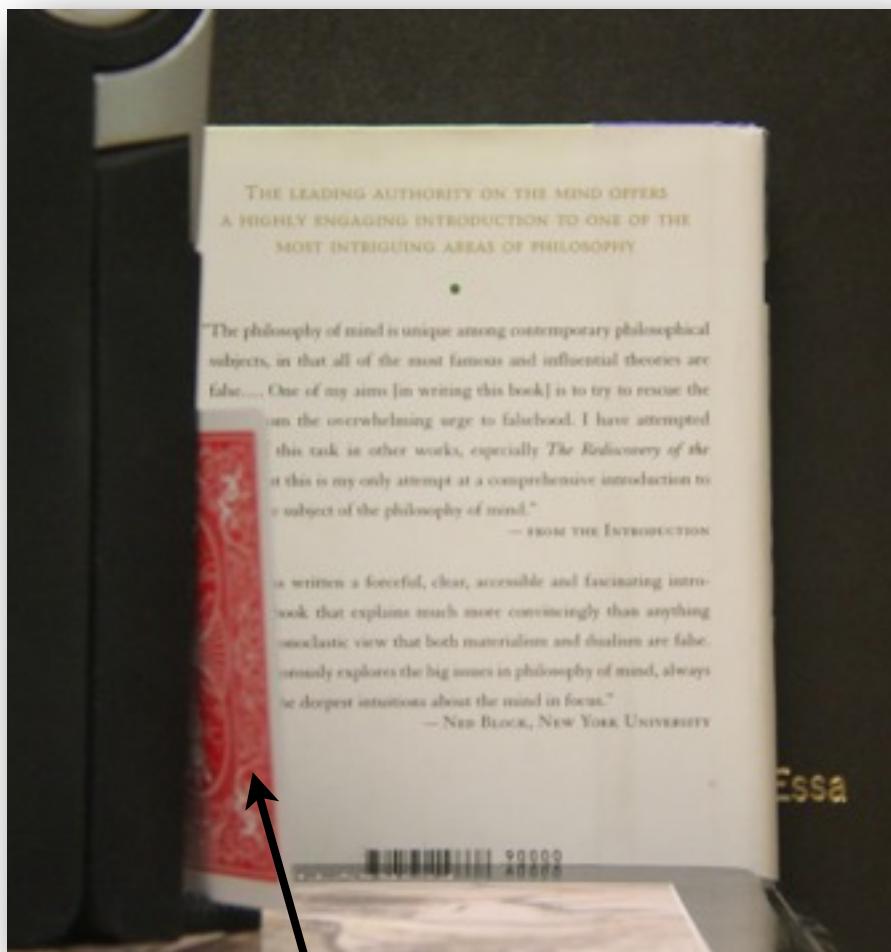
Back of the Card



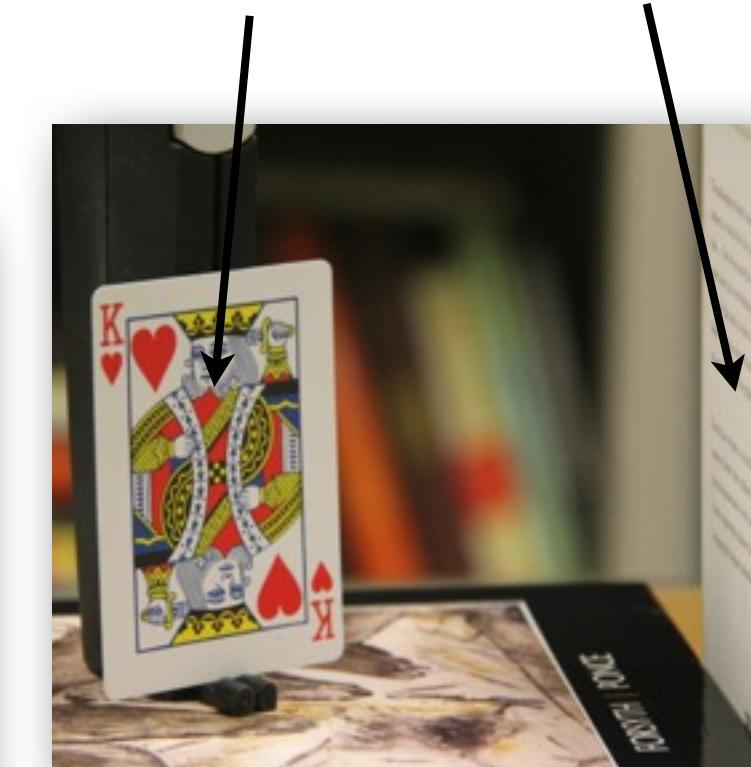
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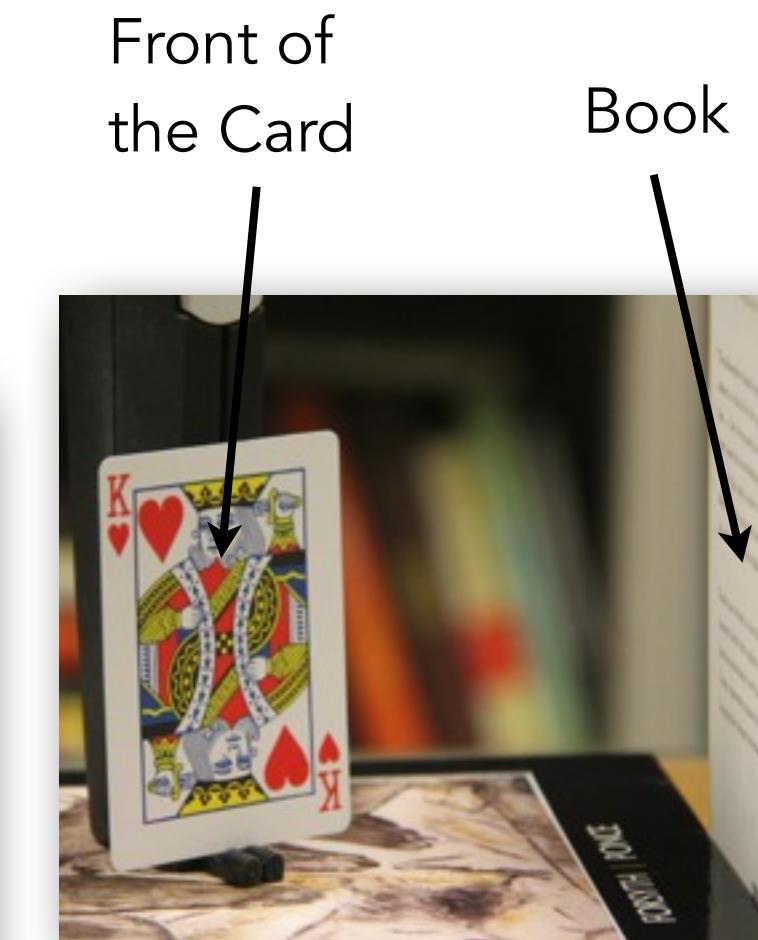
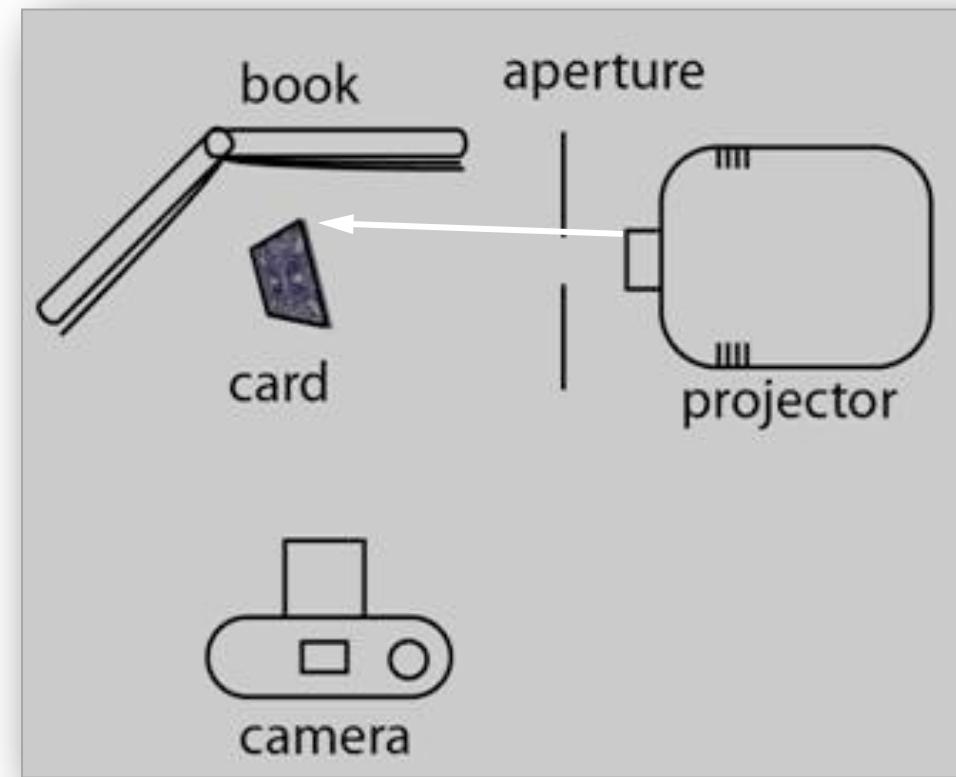
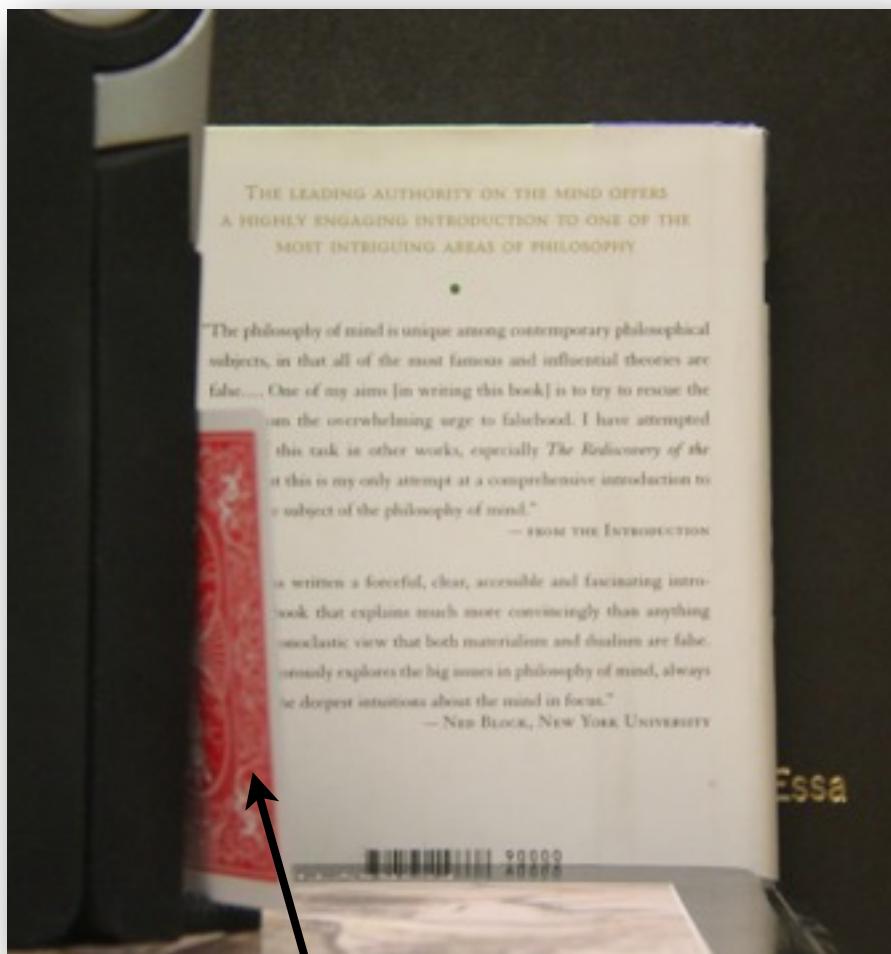
Front of  
the Card      Book



*This just shows a MOCK-UP of the experiment*

# Dual Photography

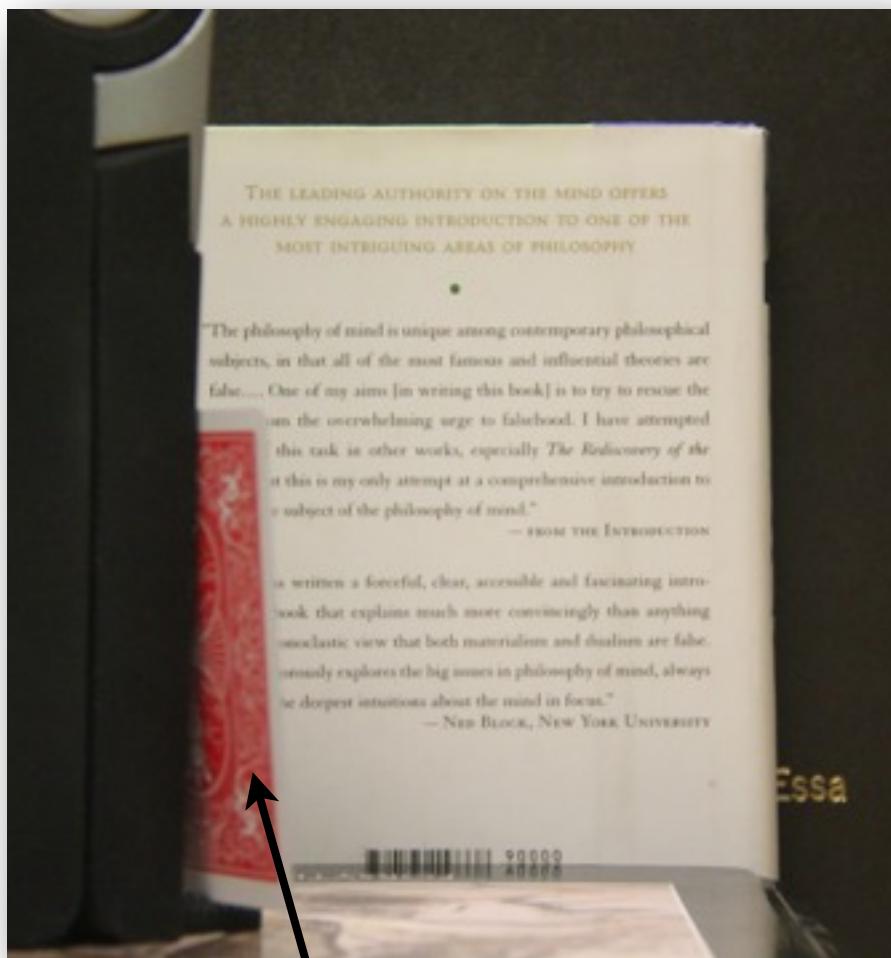
This is what the camera sees



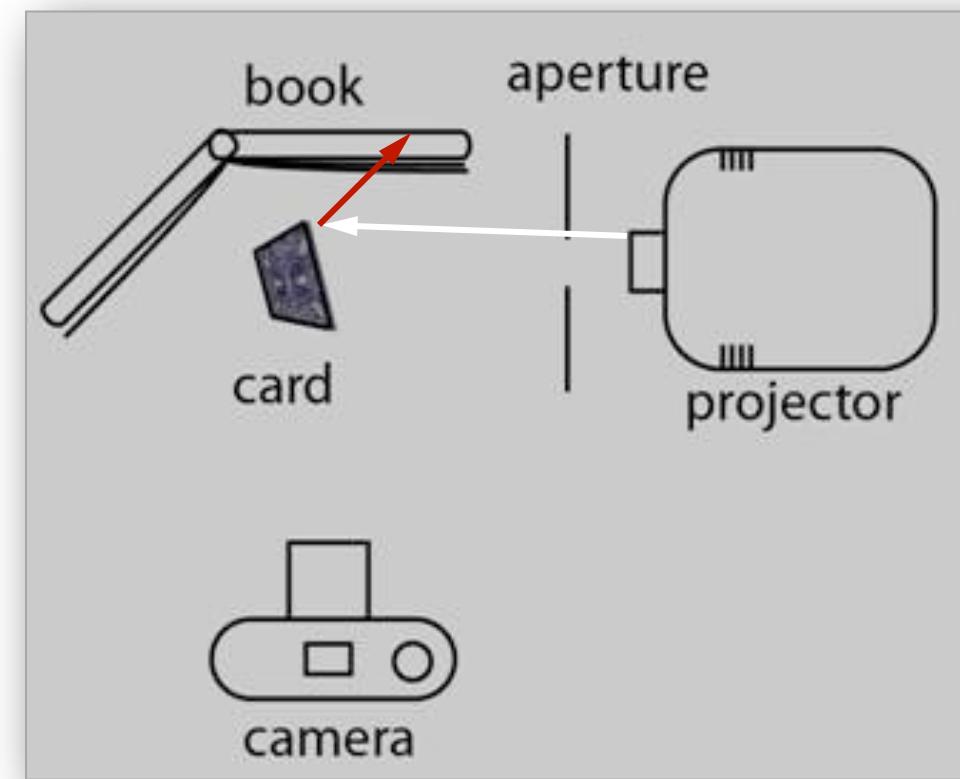
*This just shows a MOCK-UP of the experiment*

# Dual Photography

This is what the camera sees



Back of the Card



Front of  
the Card

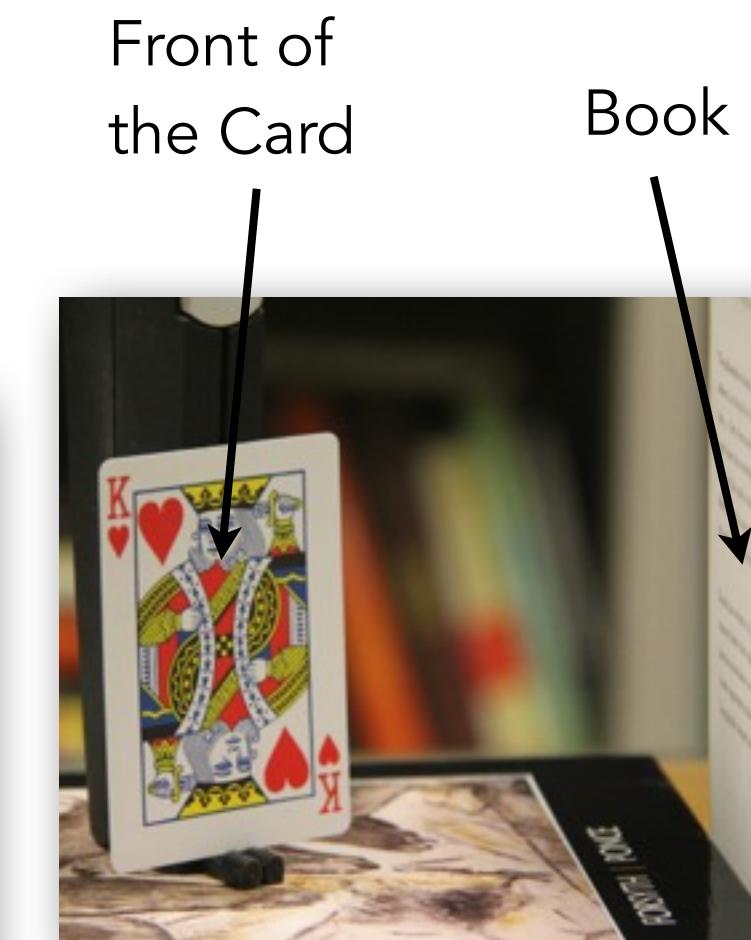
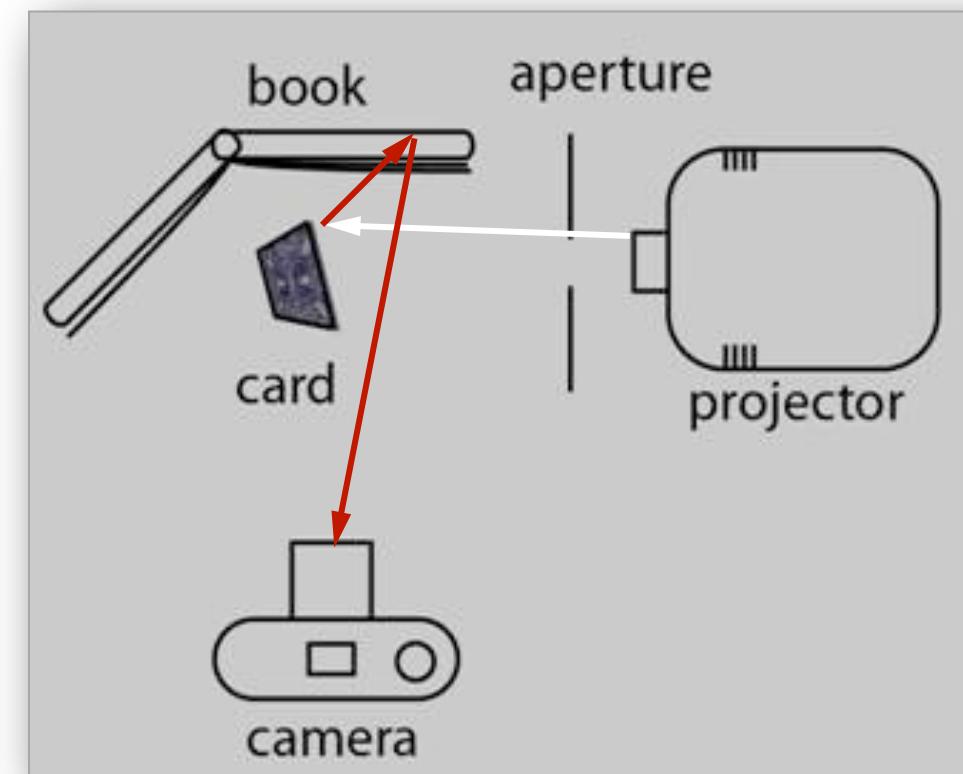
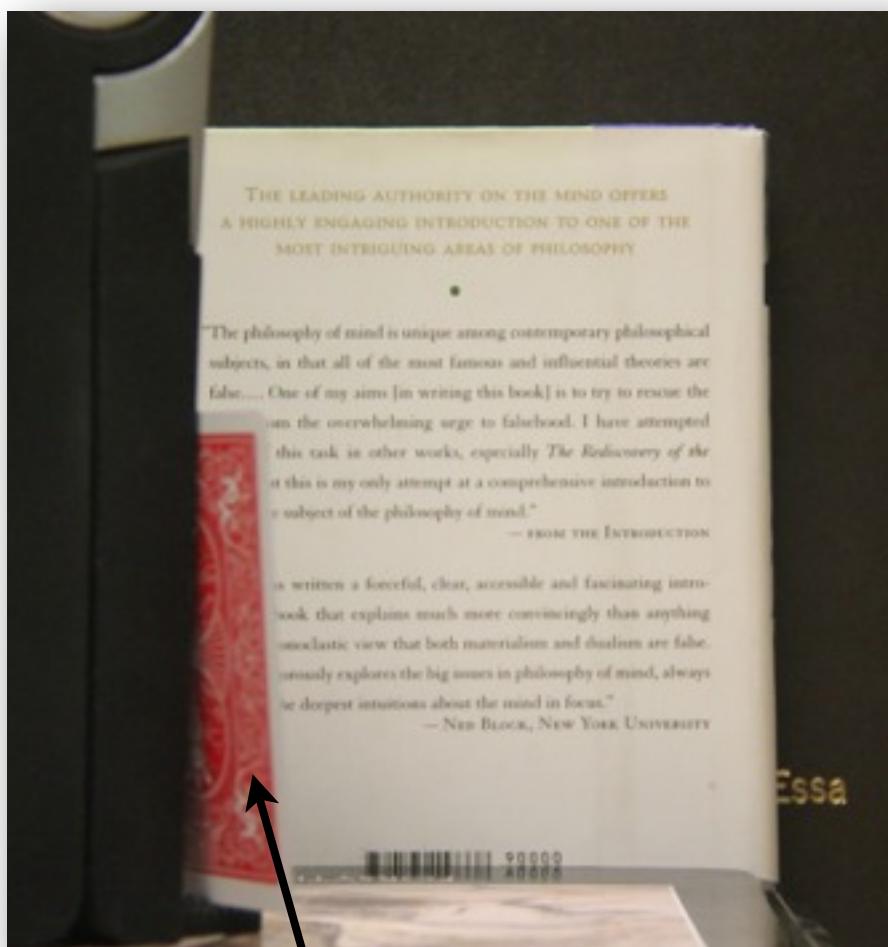


Book

*This just shows a MOCK-UP of the experiment*

# Dual Photography

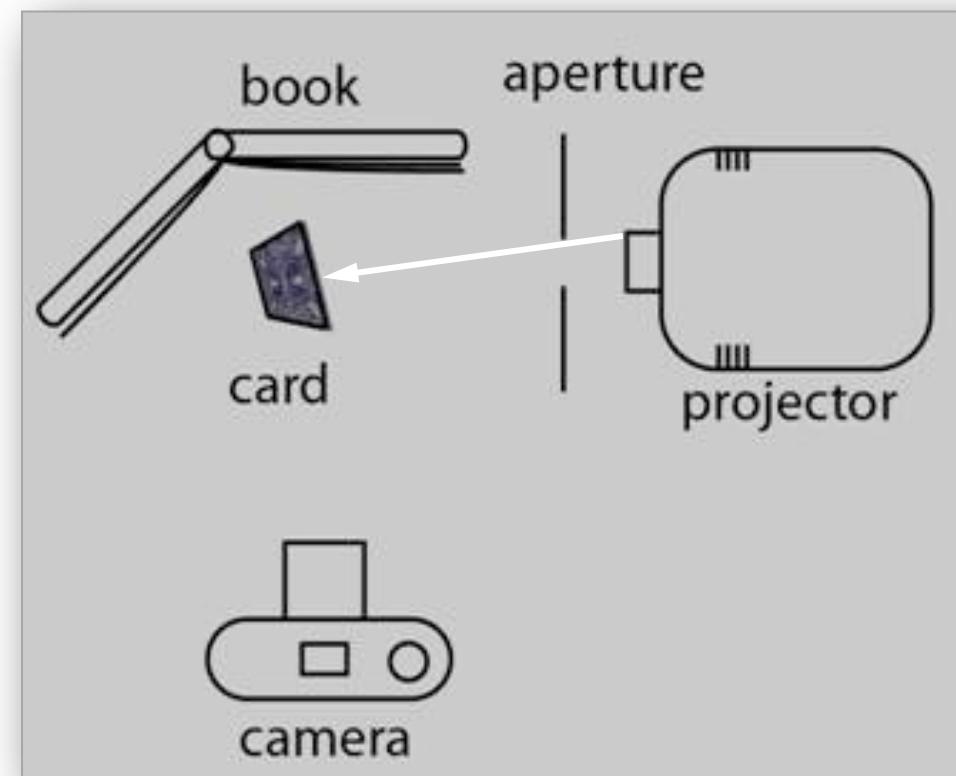
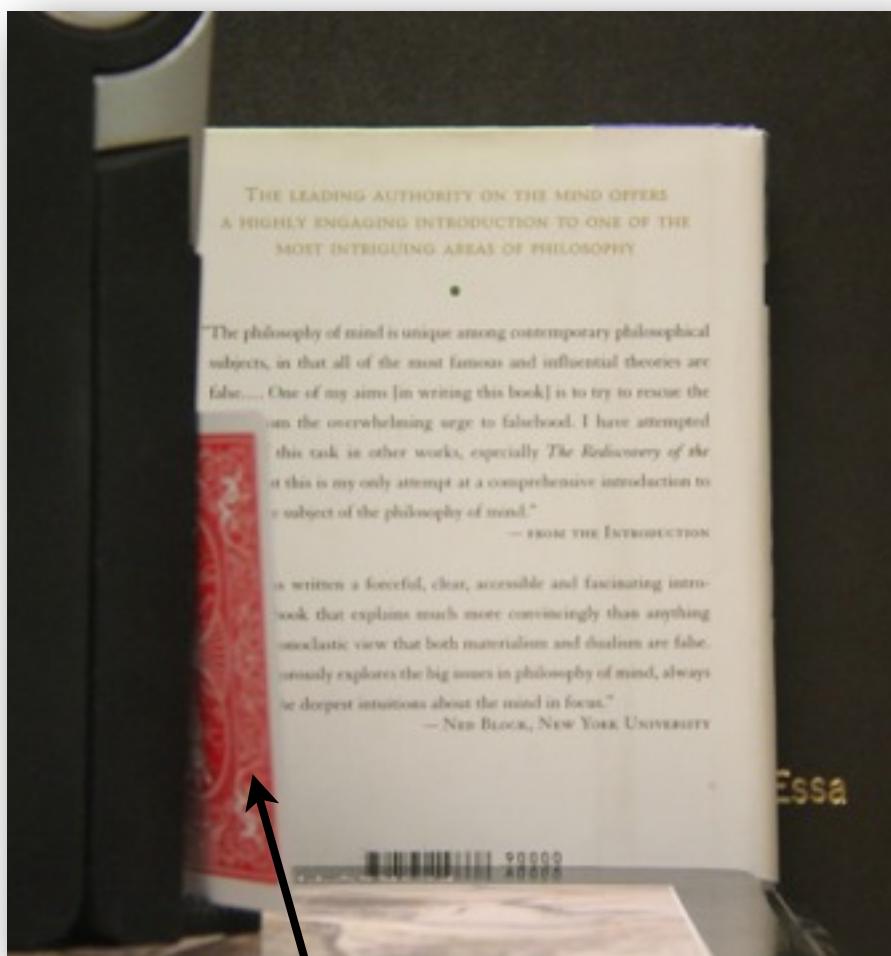
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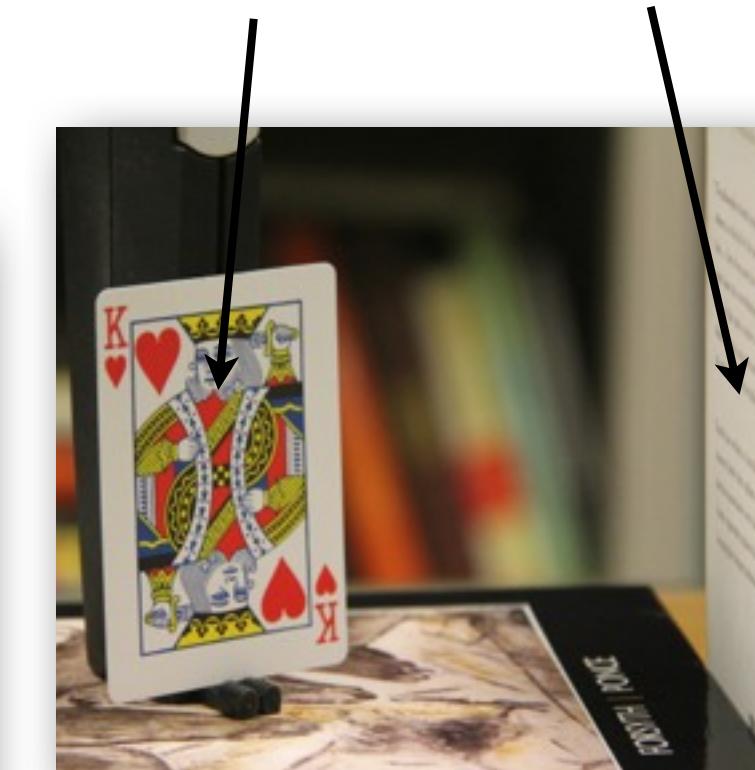
# Dual Photography

This is what the camera sees



Back of the Card

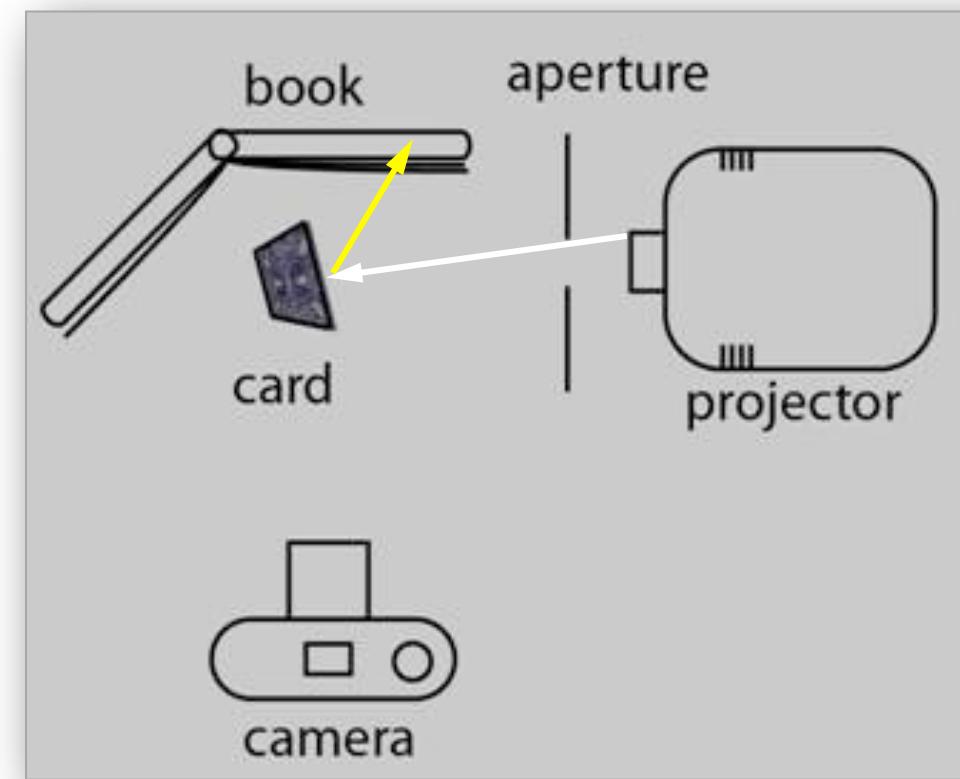
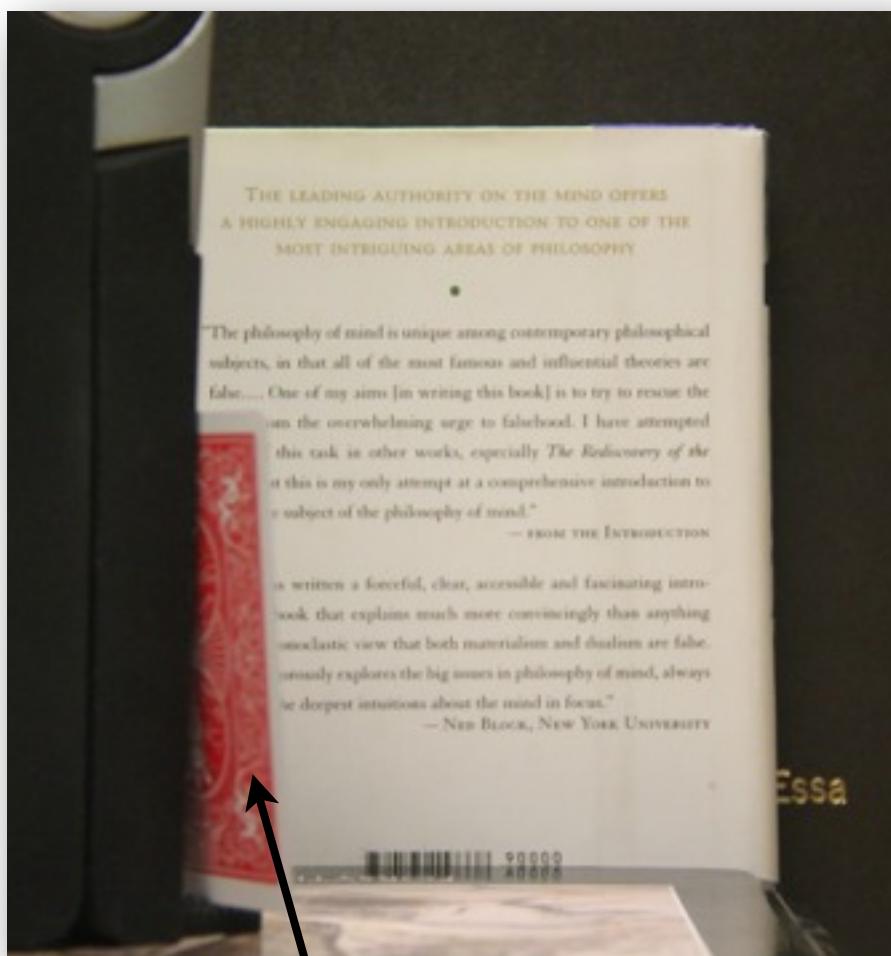
Front of  
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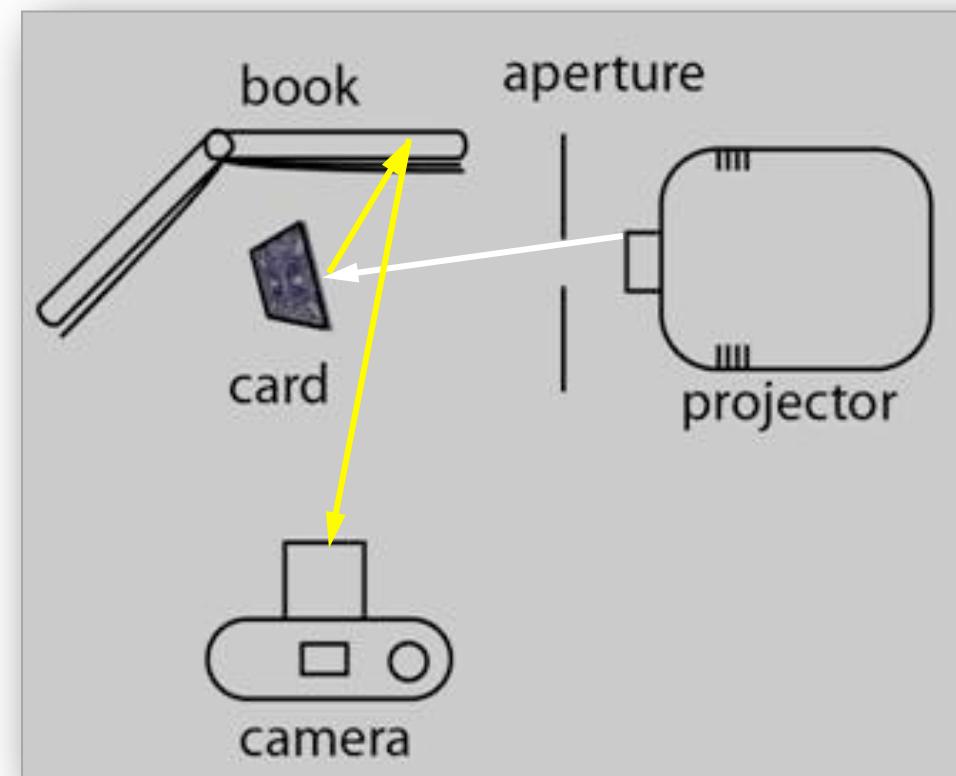
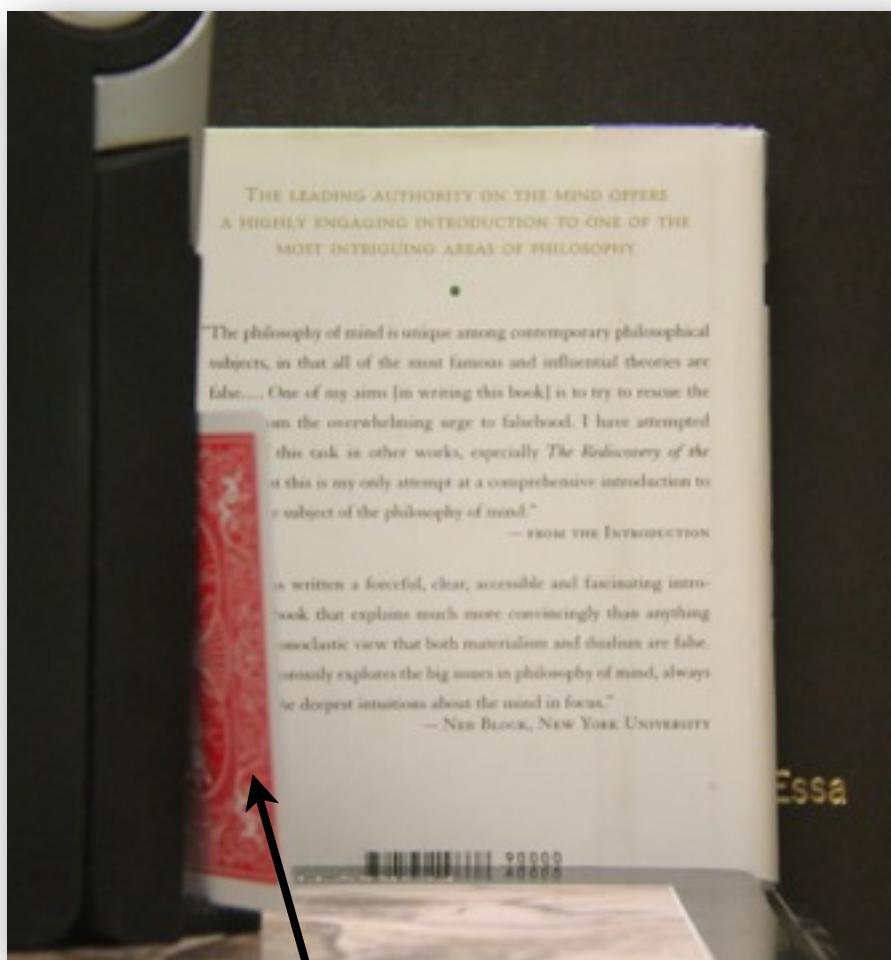
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# Dual Photography

This is what the camera sees



Front of  
the Card

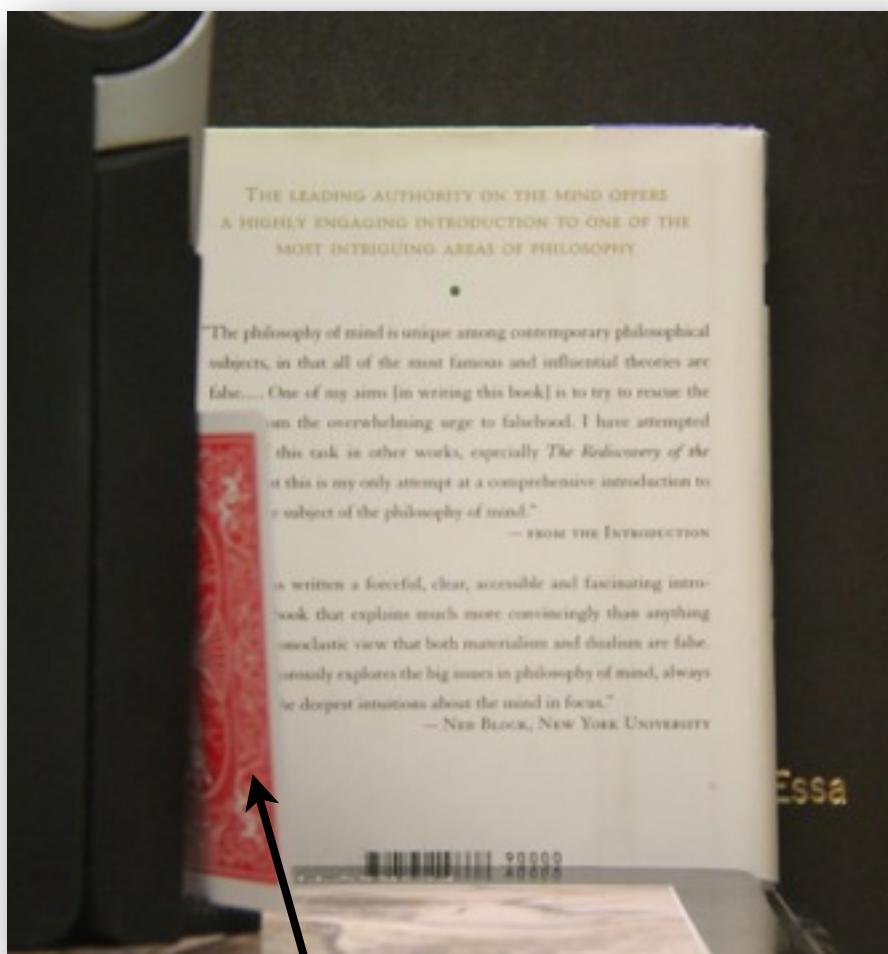


Back of the Card

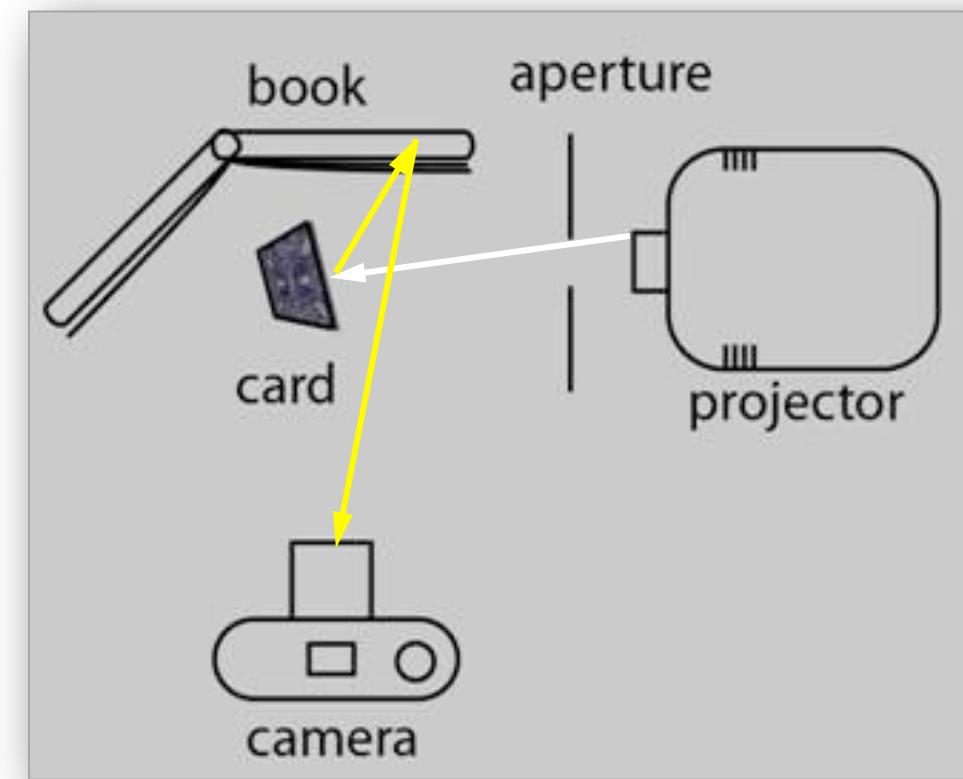
*This just shows a MOCK-UP of the experiment*

# Dual Photography

This is what the camera sees



Back of the Card



*Dual Photography, Sen et al. SIGGRAPH 2005  
see the video at  
[http://www.youtube.com/watch?v=p5\\_tpq5ejFQ](http://www.youtube.com/watch?v=p5_tpq5ejFQ)*

*This just shows a MOCK-UP of the experiment*

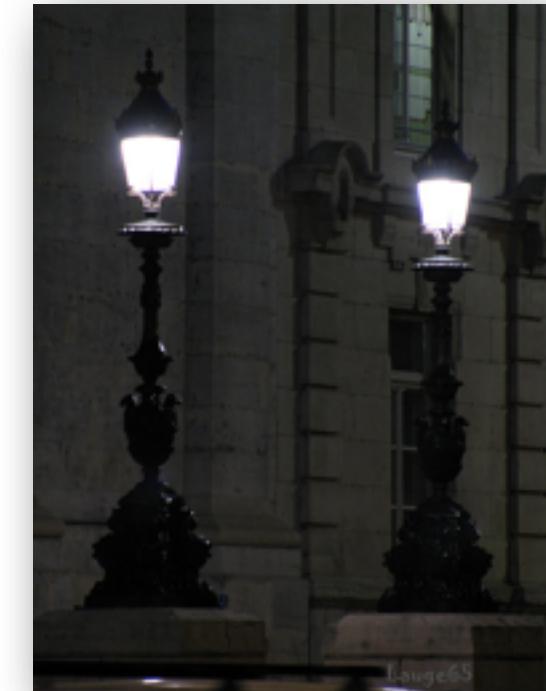
Front of  
the Card

Book



# Summary

- ★ Introduced to previously used and new computational photography terms: *novel illumination, novel cameras, generalized optics, aperture, sensors, rays, and pixels.*
- ★ Studied a core computational photography example (Dual Photography)
  - The effects of controlling the *illumination* and *aperture* on the camera to generate *novel images* (in this case, see a card by just measuring the reflections!)



# Next Class

- ★ Another example of Computational Photography
- ★ Panorama
  - How to stitch multiple images to generate a “larger” image?



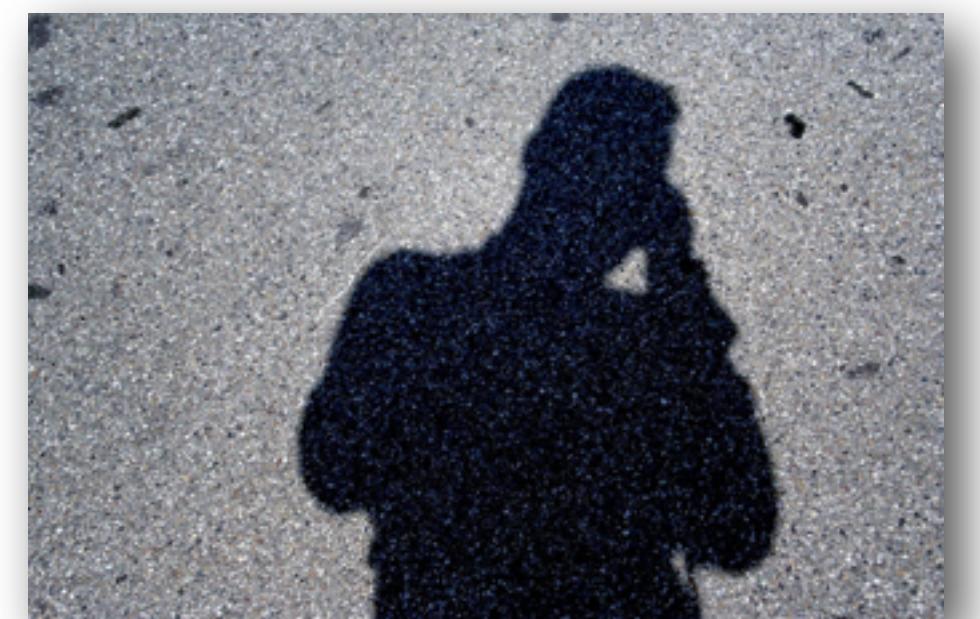
# Credits

## ★ References

- Sen et al. (2005), "Dual Photography" SIGGRAPH 2005
- Some schematics adapted from Shree Nayar and Ramesh Raskar

## ★ Creative Commons Images

- [http://farm1.staticflickr.com/48/132530501\\_14b56e7796\\_z.jpg?zz=1](http://farm1.staticflickr.com/48/132530501_14b56e7796_z.jpg?zz=1)
- <http://commons.wikimedia.org/wiki/File:Fruitbowl.jpg>
- <http://www.ipernity.com/doc/lauge65/11487272>
- <http://www.flickr.com/photos/heredragons/2479043774/>



# Computational Photography



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Study the basics of computation and its impact on the entire workflow of photography, from capturing, manipulating and collaborating on, and sharing photographs.