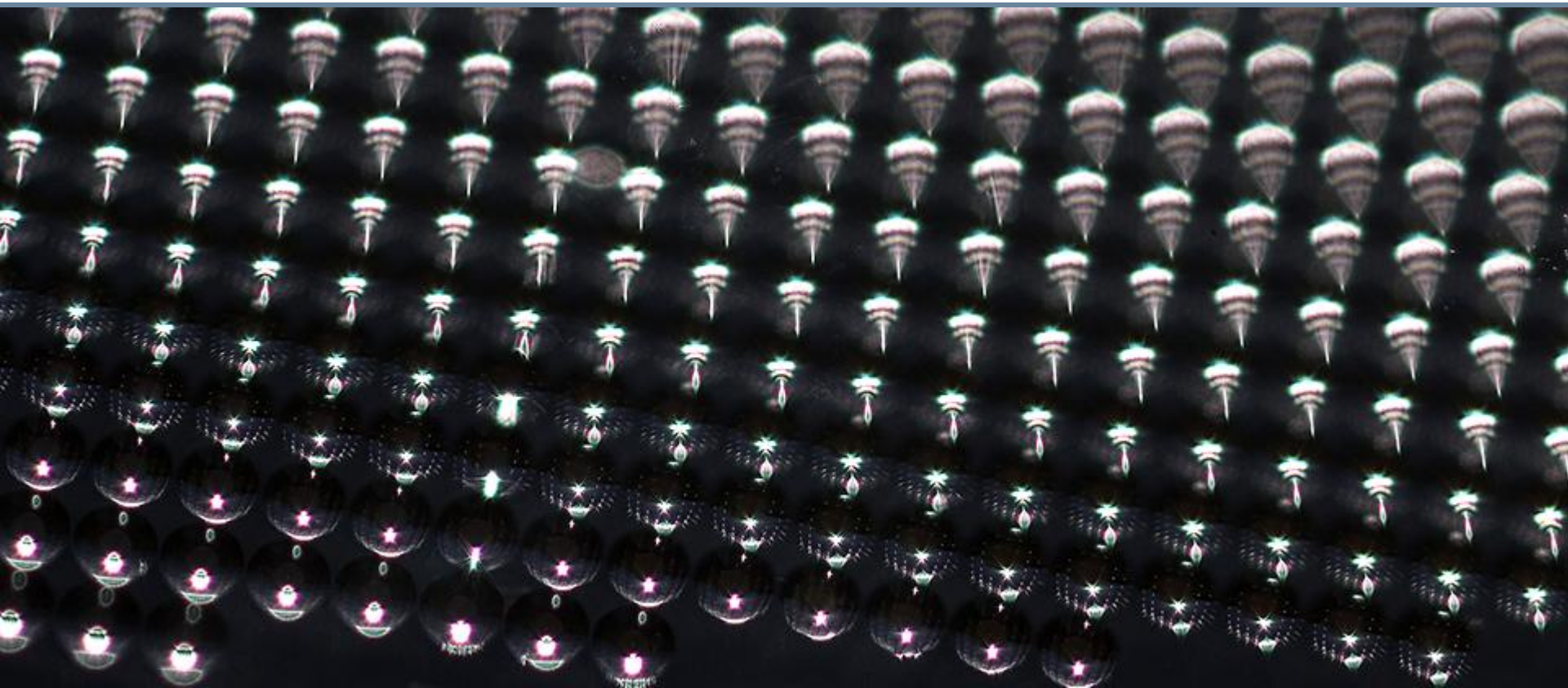




# Computational Photography: Real Time Plenoptic Rendering

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# Overview

- Plenoptic cameras
- Rendering with GPUs
- Effects
  - Choosing focus
  - Choosing viewpoint (parallax)
  - Stereo
  - Choosing depth of field
  - HDR
  - Polarization
  - Super resolution
- Demos
- Conclusion



# Making (and Recreating) Memories

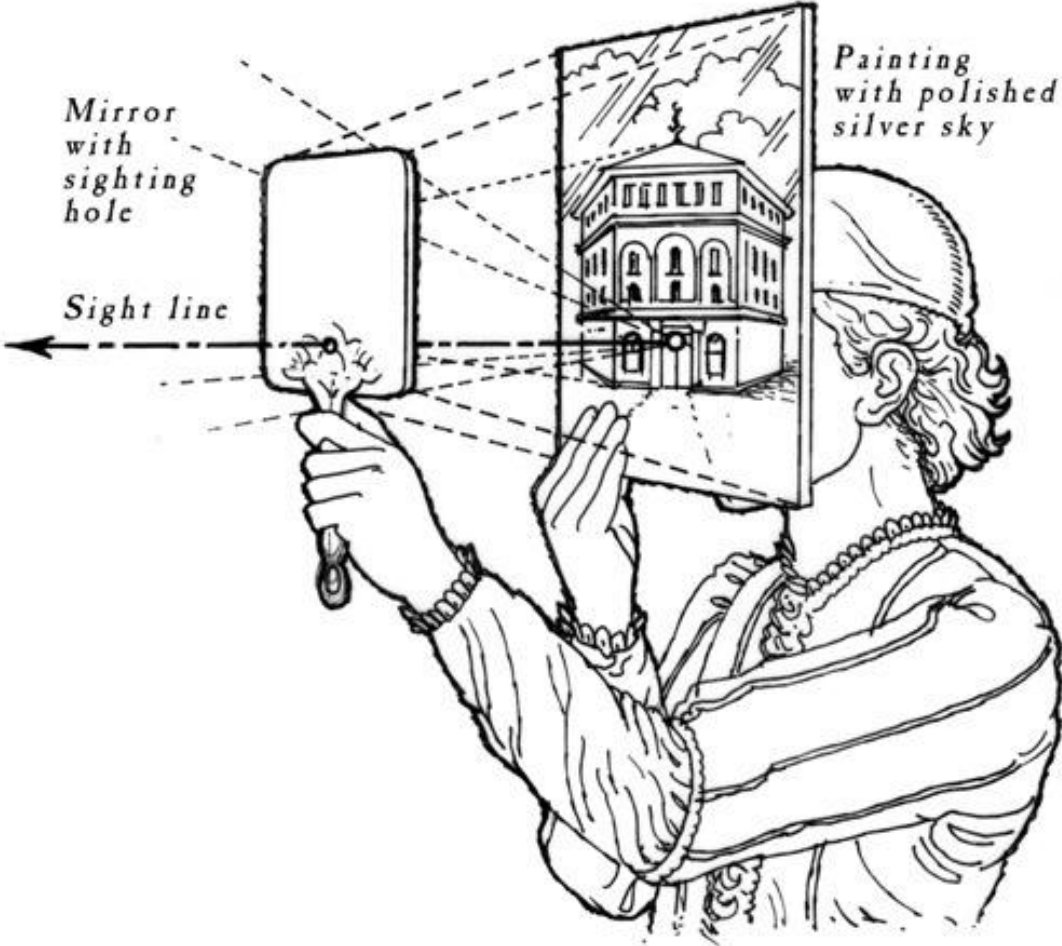




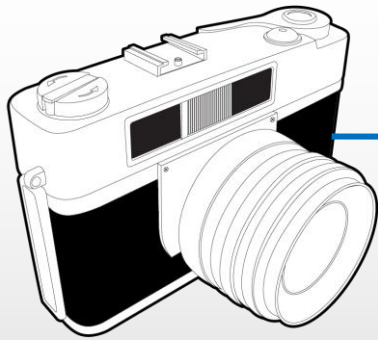
# What's Wrong with this Picture?



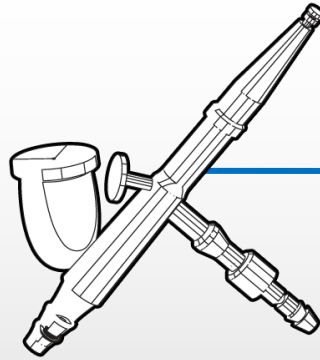
# Perspective



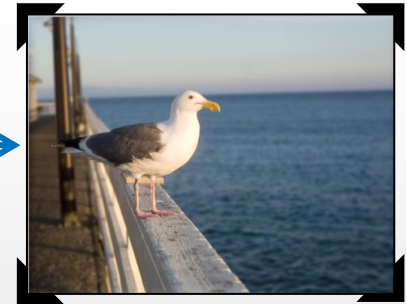
## CAPTURE



## PROCESS



## VIEW



Color



Exposure



Focus



Color

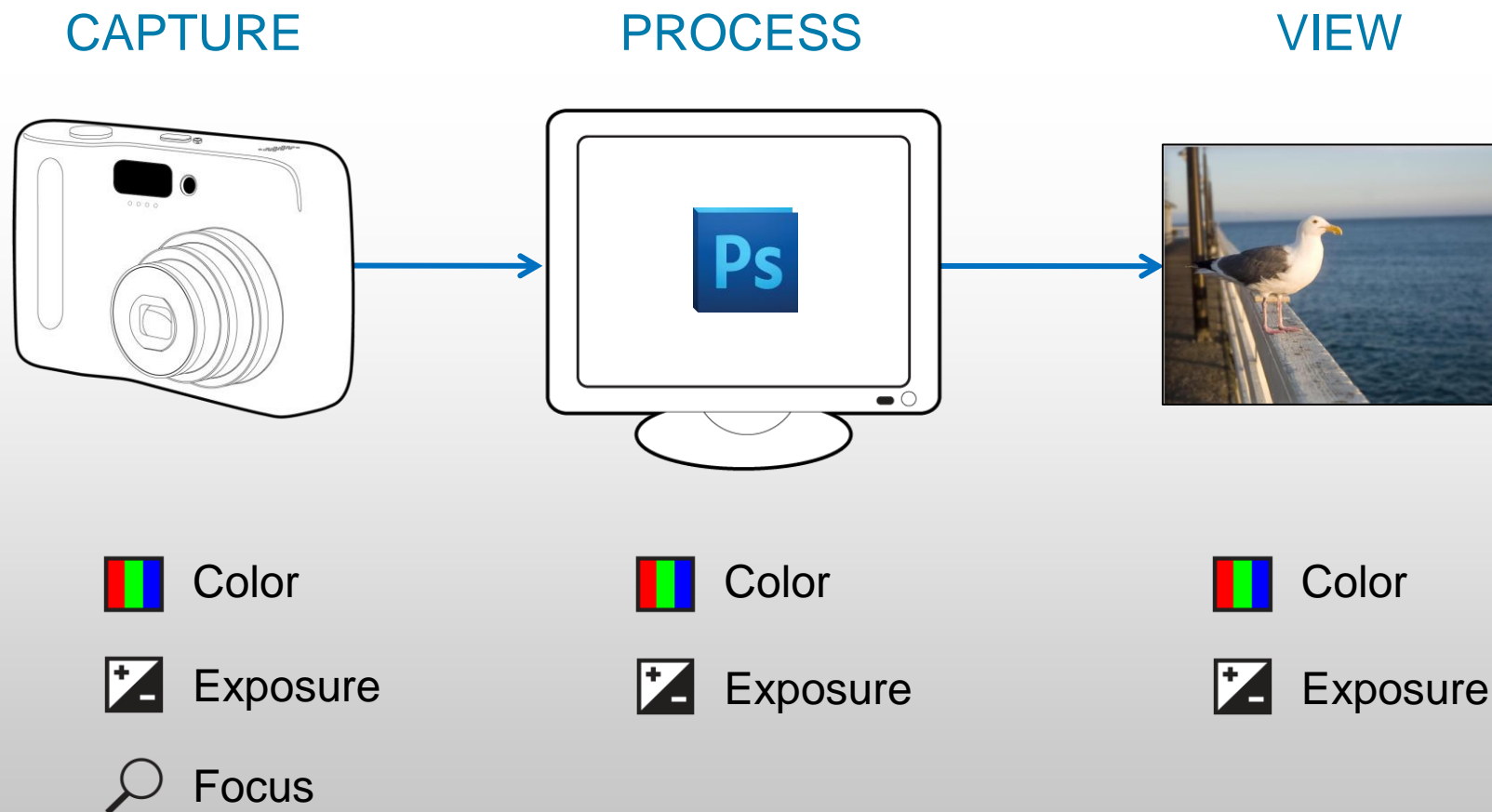


Exposure



Difficult  
to Adjust

# Along Came Photoshop





# What's Wrong with This Picture?





# What's Wrong? It's Only a Picture!



# Can We Create More than Pictures?

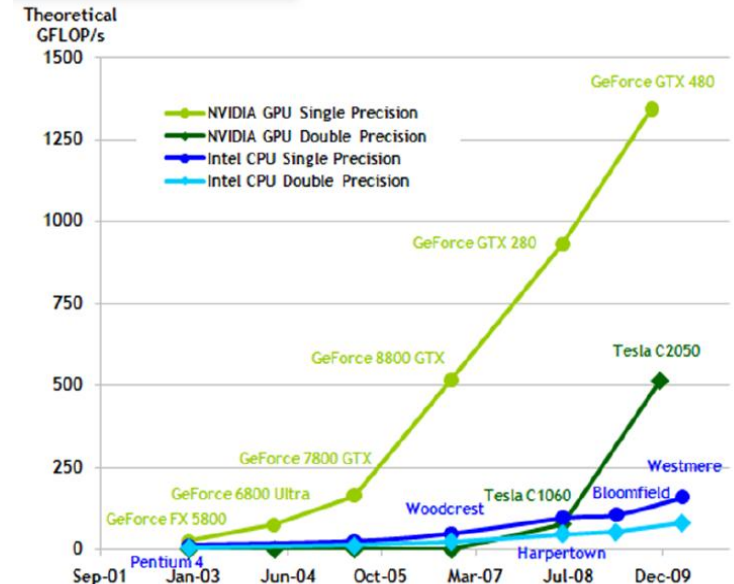
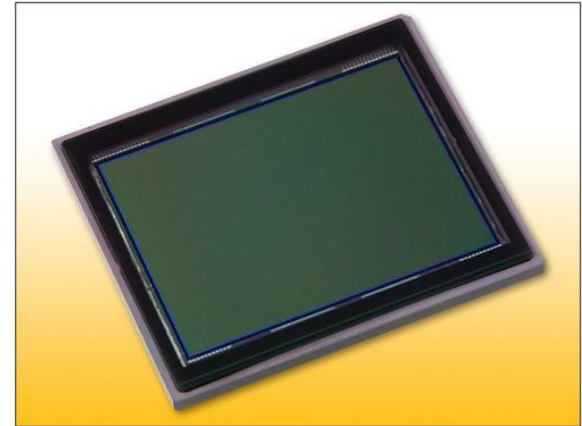


- *Can we request that Photography renders the full variety offered by the direct observation of objects? Is it possible to create a photographic print in such a manner that it represents the exterior world framed, in appearance, between the boundaries of the print, as if those boundaries were that of a window opened on reality.*

Gabriel Lippmann, 1908.

# Pixels and Cores

- Moore's Law: Megapixels keep growing
  - 7.2 MP = 8 by 10 at 300dpi
  - Available on cell phones
- 60MP sensors available now
  - Larger available soon (can a use be found?)
- Use pixels to capture richer information about a scene
- Computationally process captured data
  - GPU power also riding Moore's Law curve



# Infinite Variety (Focusing)





# Focusing



# Focusing



# Different Views



# Different Views



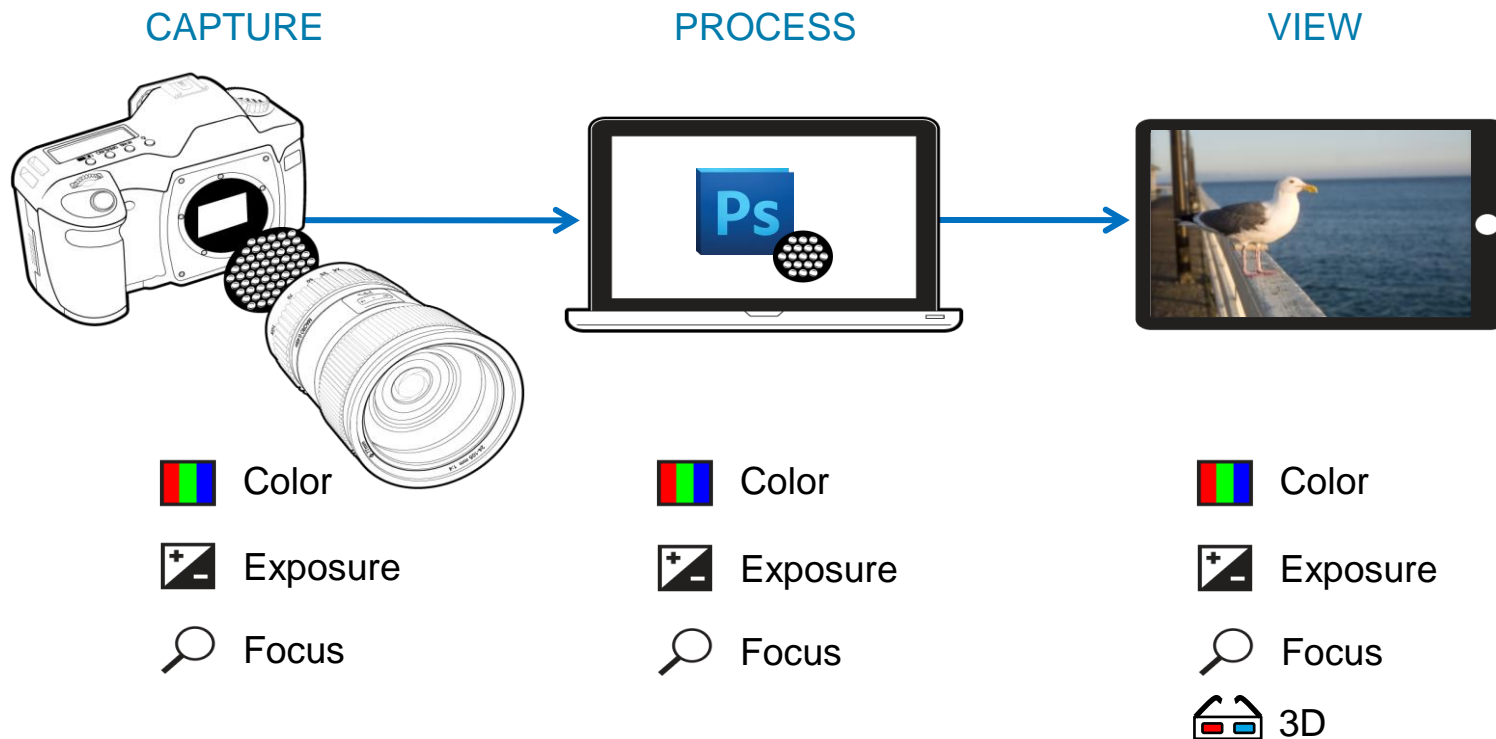


# Different Views



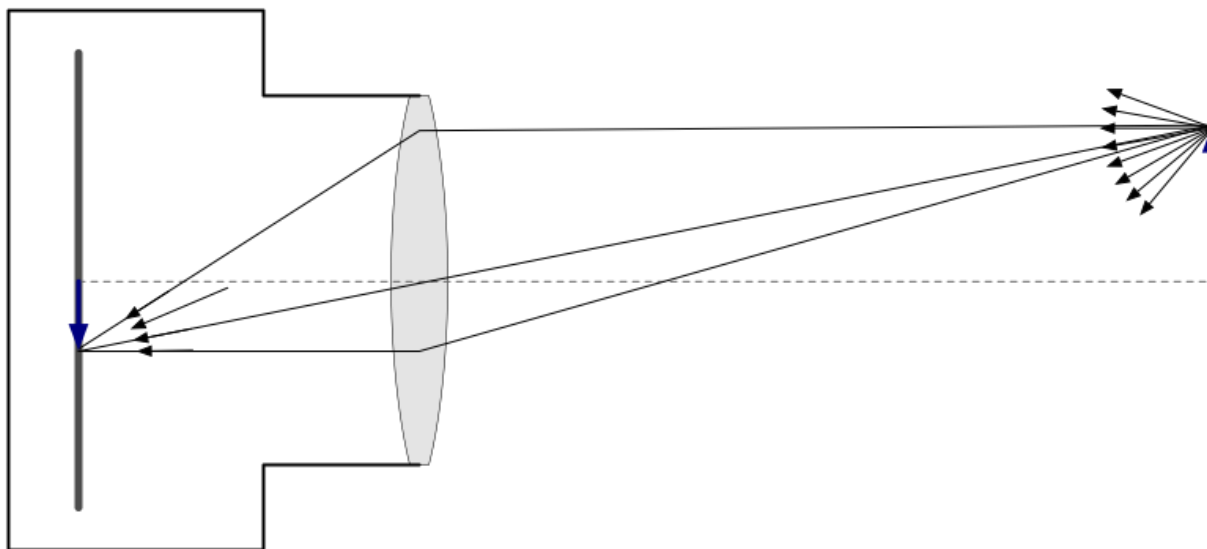
# Computational Photography

- With traditional photography light rays in a scene go through optical elements and are captured by a sensor
- With computational photography, we capture the light rays and apply optical elements computationally



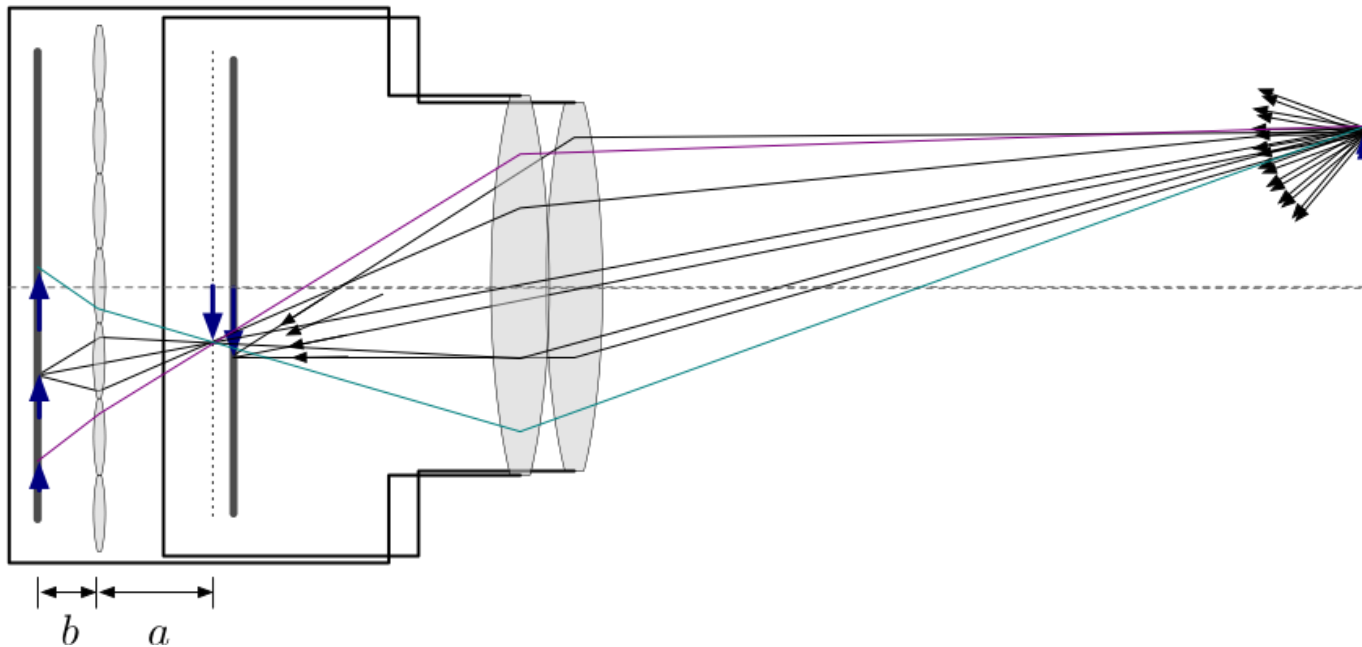
# Taking Pictures

- A traditional camera places optical elements into the light rays in a scene
- A pixel on the sensor is illuminated by rays from all directions
- The sensor records the intensity of the **sum** of those rays
- We lose all of the information about individual rays



# Radiance (Plenoptic Function, Lightfield)

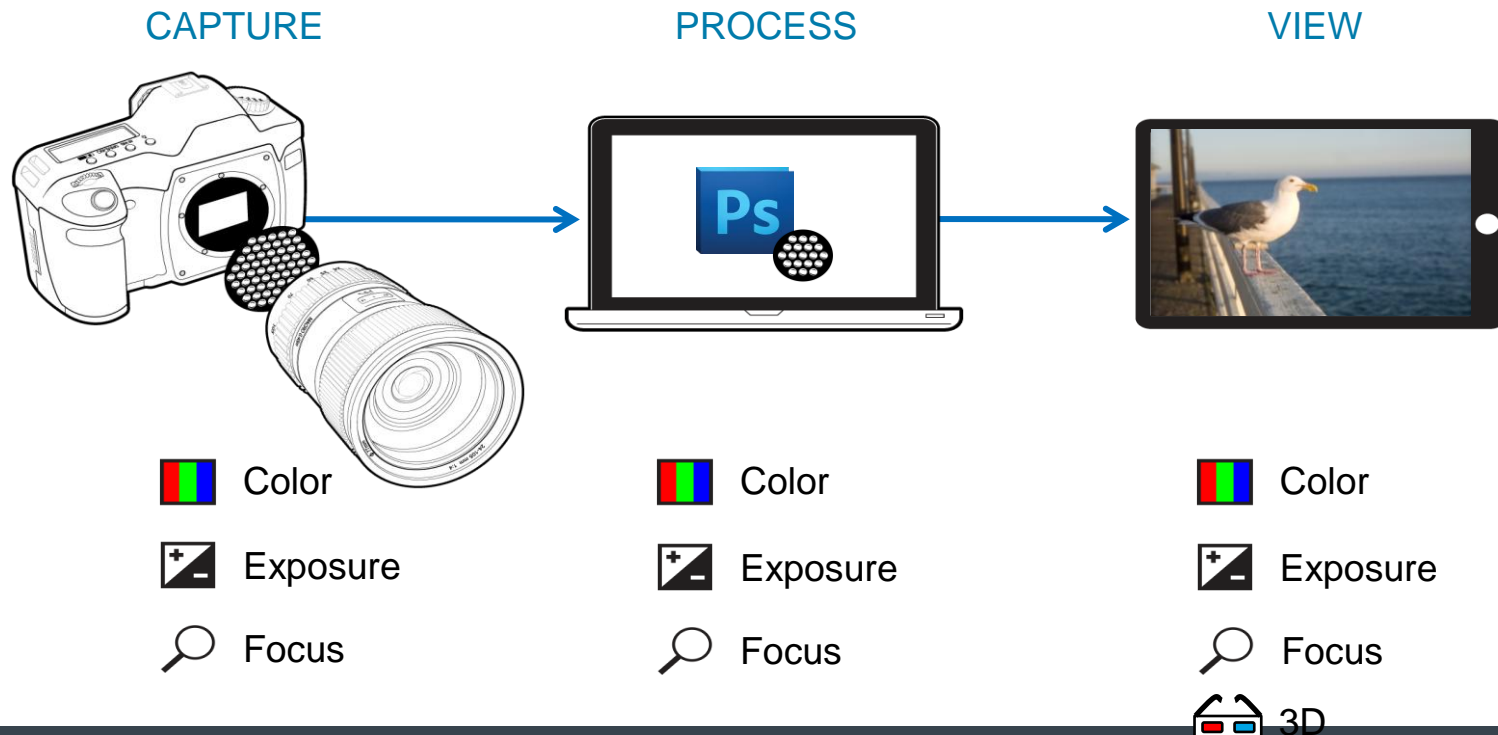
- Instead of integrating rays from all directions, capture the rays themselves (the radiance)
- Record **all** the information about the scene





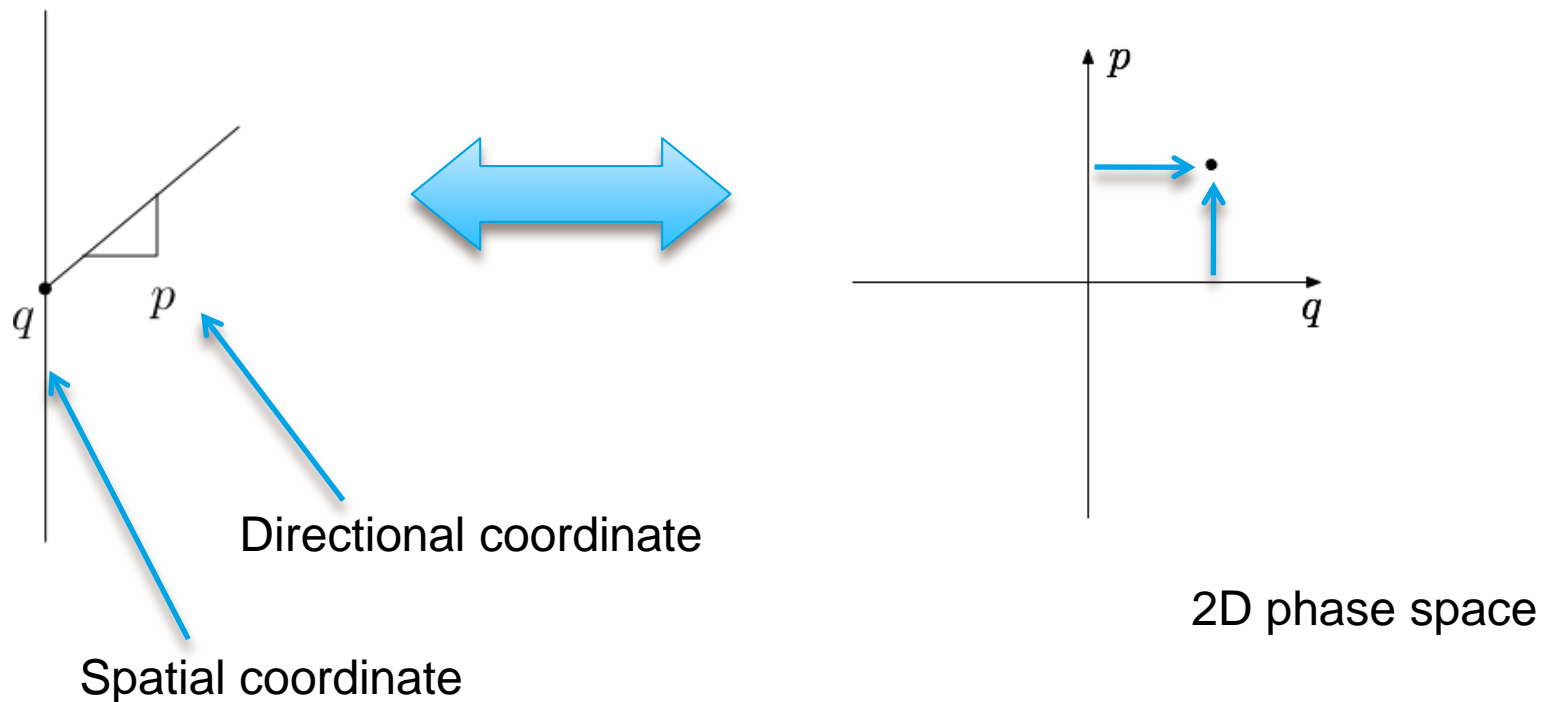
# Computational Photography – The Basic Idea

- Using radiance, we can “take the picture” computationally
- Choose and apply optical elements computationally
- Render computationally
- Explore the “full variety” computationally and interactively



# Radiance (and Transformations)

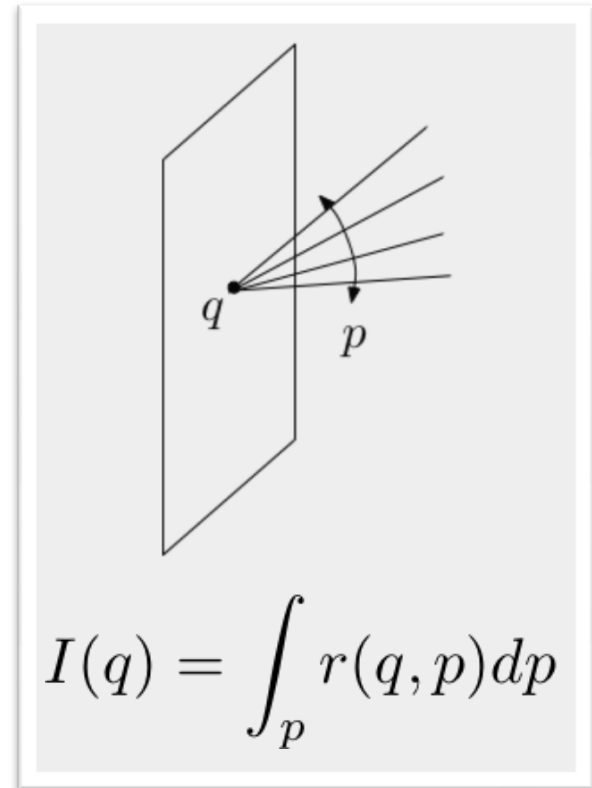
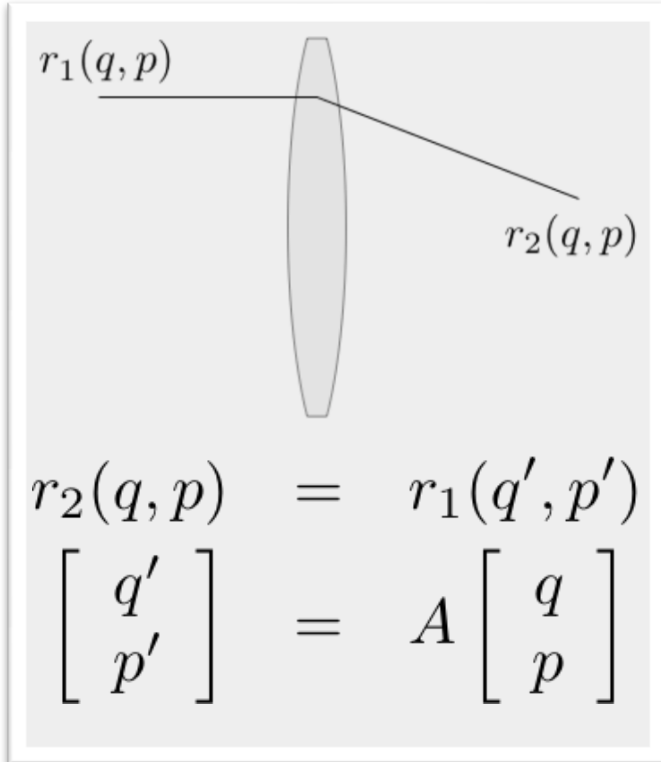
- The radiance  $r(q, p)$  is a density function over 4D ray space
- Each ray is a point in 4D ray space



(2D diagrams shown because they are easier to draw.)

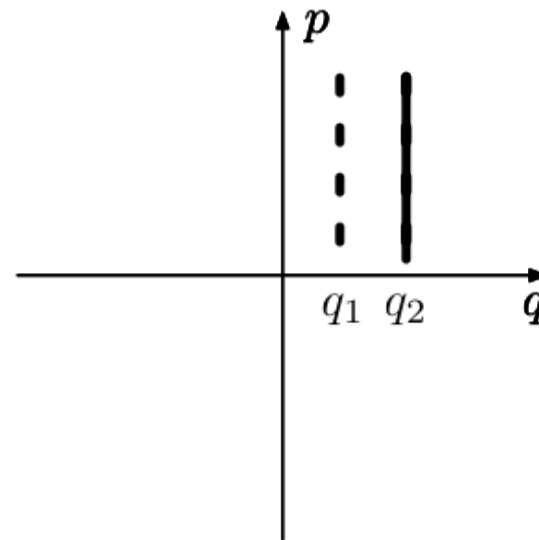
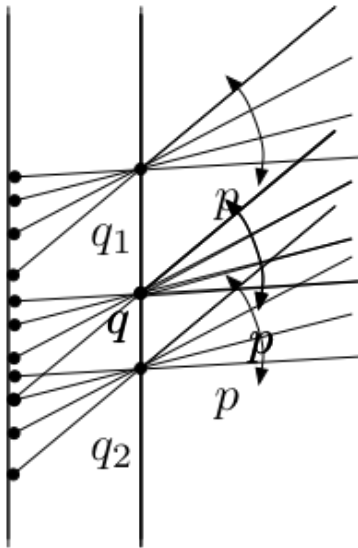
# Radiance (and Transformations)

- The radiance  $r(q, p)$  is a density function over 4D ray space
- Effects of optical elements (lenses, free space) are linear transformations
- Rendering (taking a picture) is integration over all  $p$  at a given  $q$



# Capturing the 4D radiance with a 2D sensor

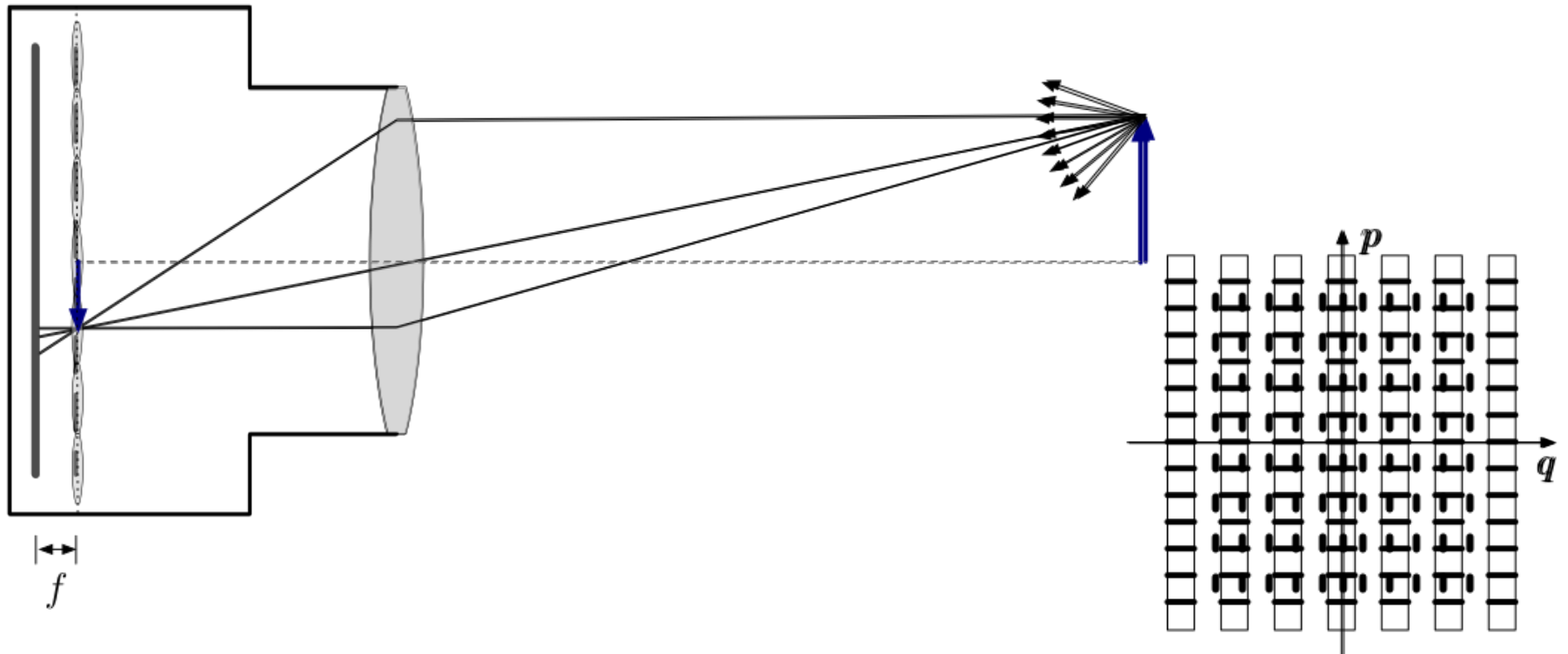
- To capture individual rays, first we have to separate them
- At a particular spatial point, we have a set of rays at all directions
- If we let those rays travel through a pinhole, they will separate into distinguishable individual rays
- Two pinholes will sample two positions





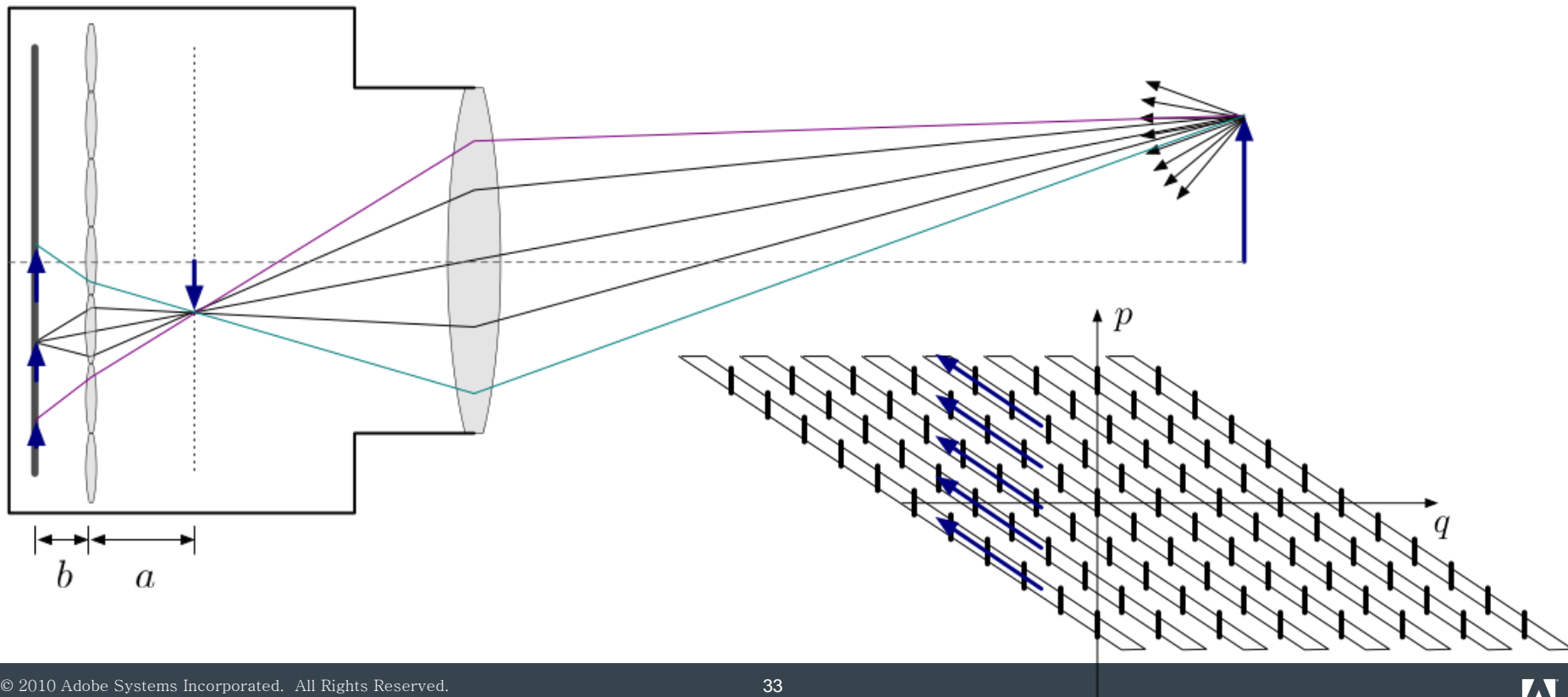
# A plenoptic camera

- A camera with an array of pinholes will capture an image that represents the 4D radiance
- In practice, one might use a microlens array to capture more light
  - (cf Ng et al “Handheld Plenoptic Camera”)



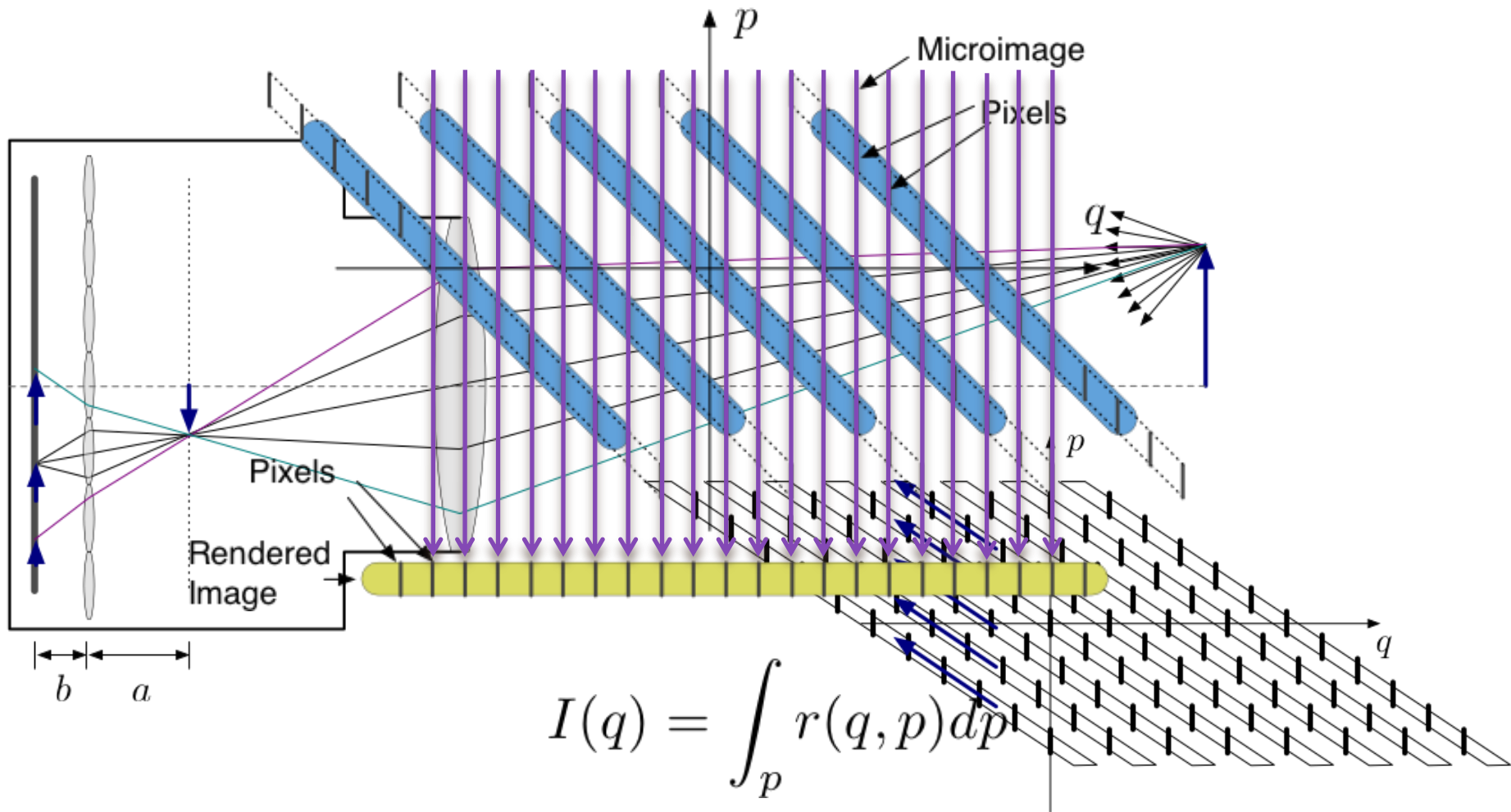
# The focused plenoptic camera

- With the Adobe camera, we make one important modification
- We use the microlenses to create an array of relay cameras to sample the plenoptic function with higher spatial resolution
  - Note that image plane can also be behind the sensor (virtual image is captured)



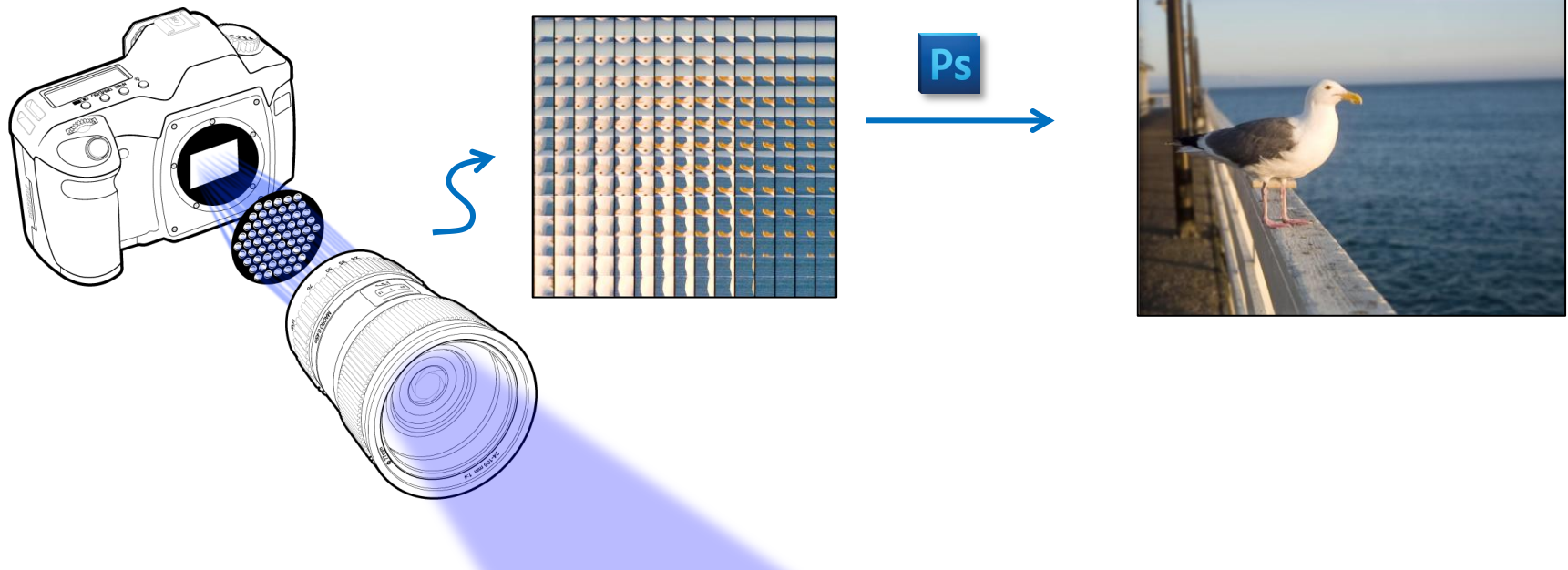
# Rendering: Taking a Computational Picture

- To take a picture (render) we integrate over all directions  $p$



# The Story So Far

- A plenoptic camera takes a 2D picture – radiance image (or “flat”)
- The pixels are samples of the radiance in the 4D ray space
- Optical elements (lenses, space) transform the ray space
- We take a picture by rendering (computationally)
- We adjust the picture by transforming the ray space (computationally)

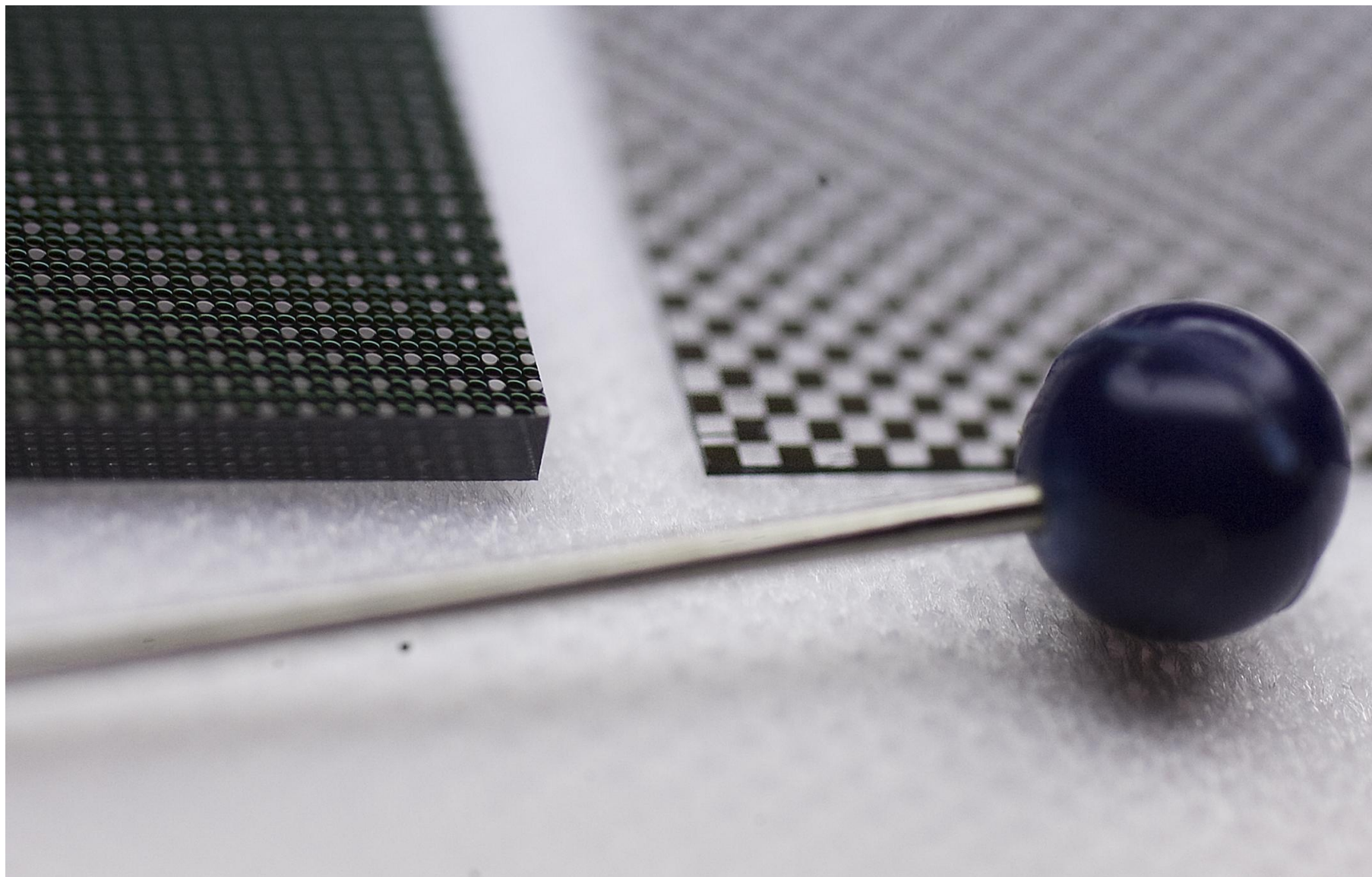




# The Part of the Talk Where we Reveal the Magic

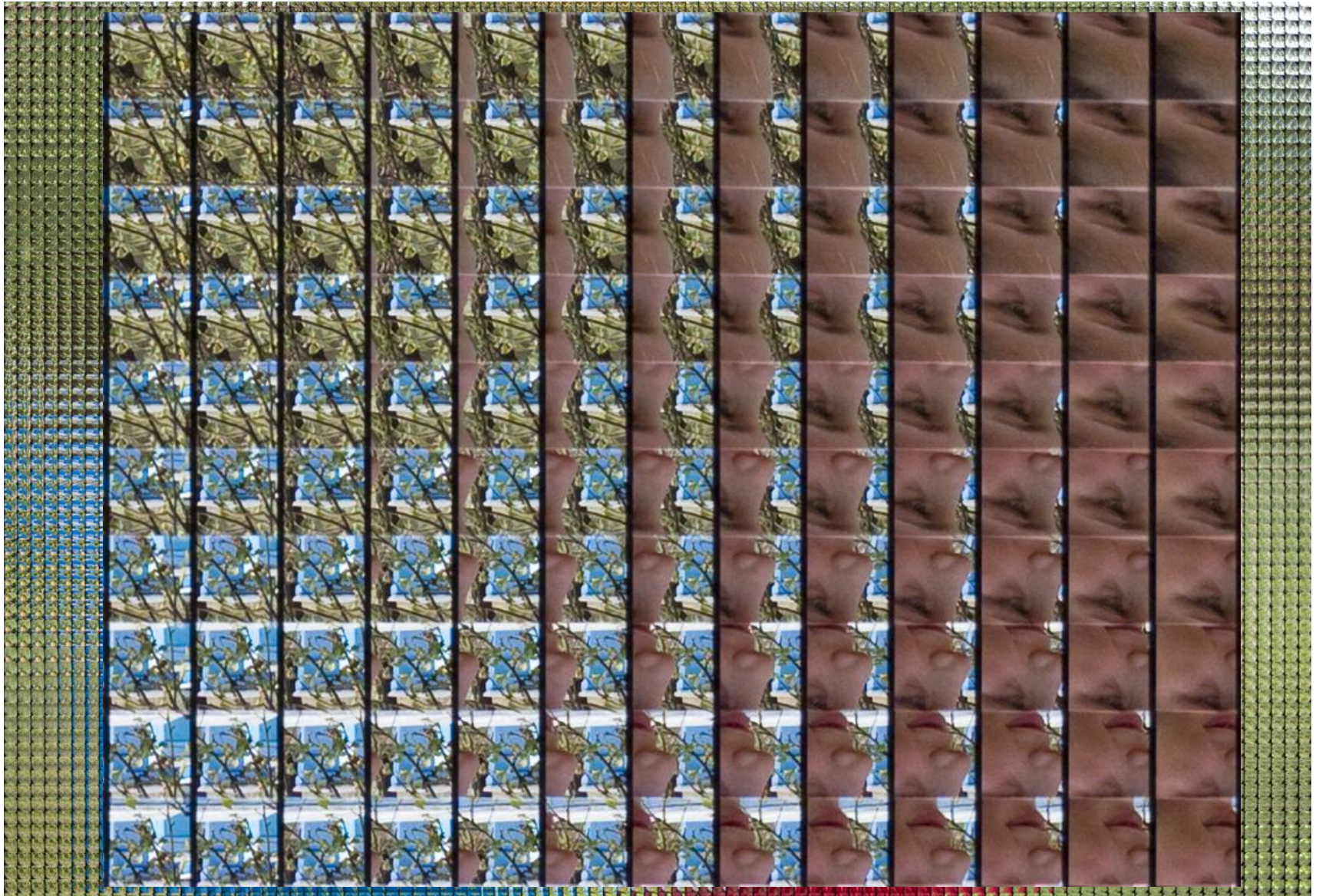


# First, the Camera



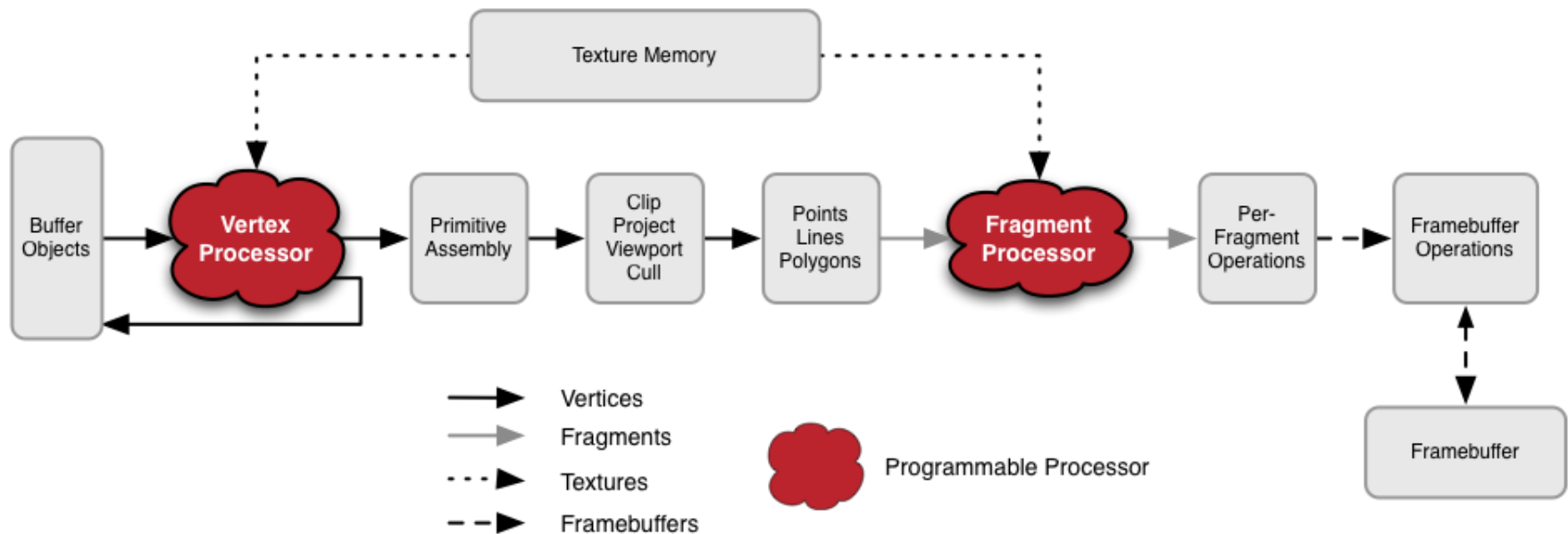


# Plenoptic Image (Flat)



# GPU Programming

- Basic alternatives for programming GPU: General purpose (CUDA) or graphics-based (GLSL)
- Open GL Shader Language (GLSL) a natural fit
  - Texture mapping





# Rendering with GPU using Open GL

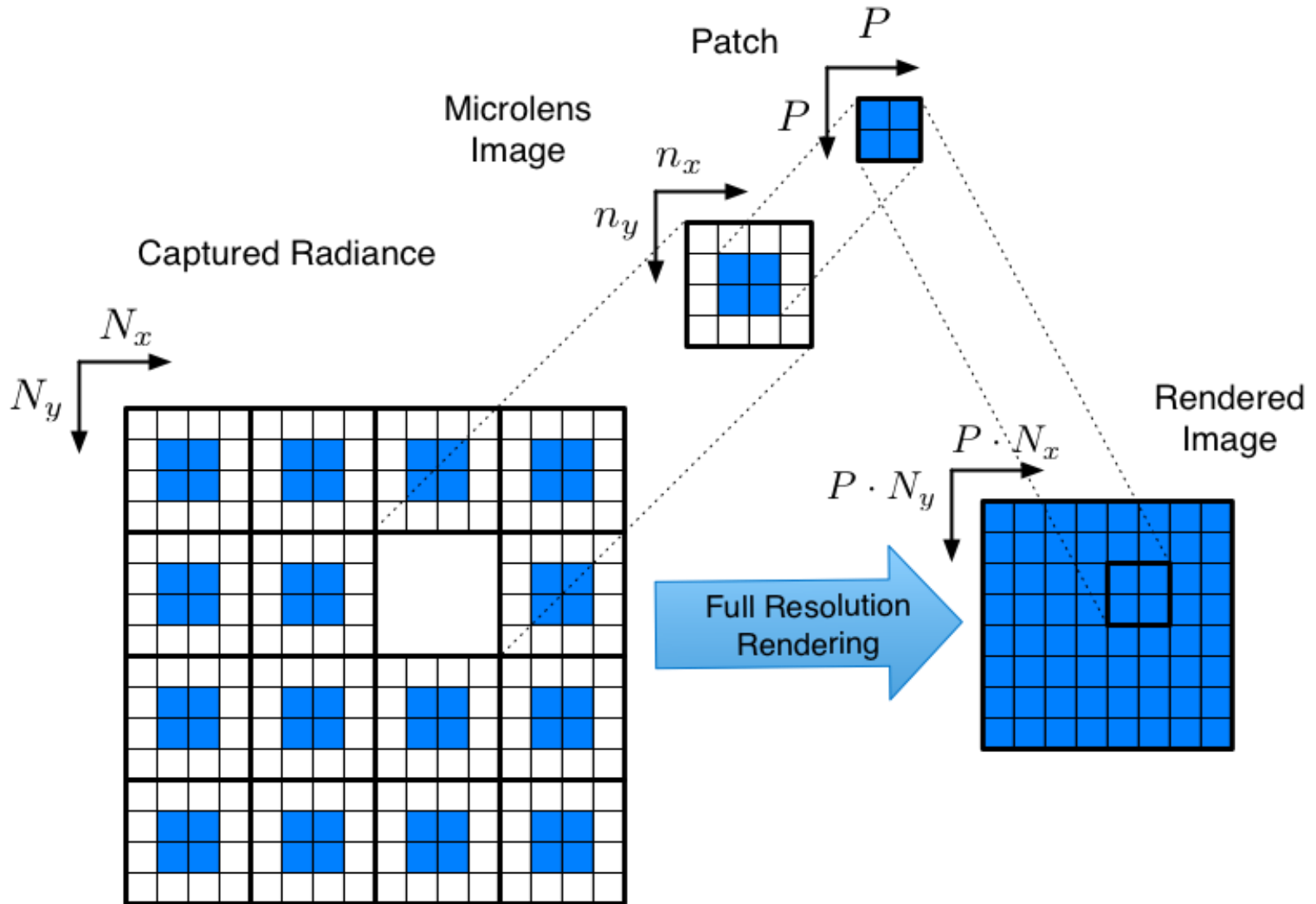
- Read in plenoptic radiance image
- Create 2D texture object for radiance
- Serialize image data to Open GL compatible format
- Define the texture to OpenGL

```
image = Image.open("lightfield.png")

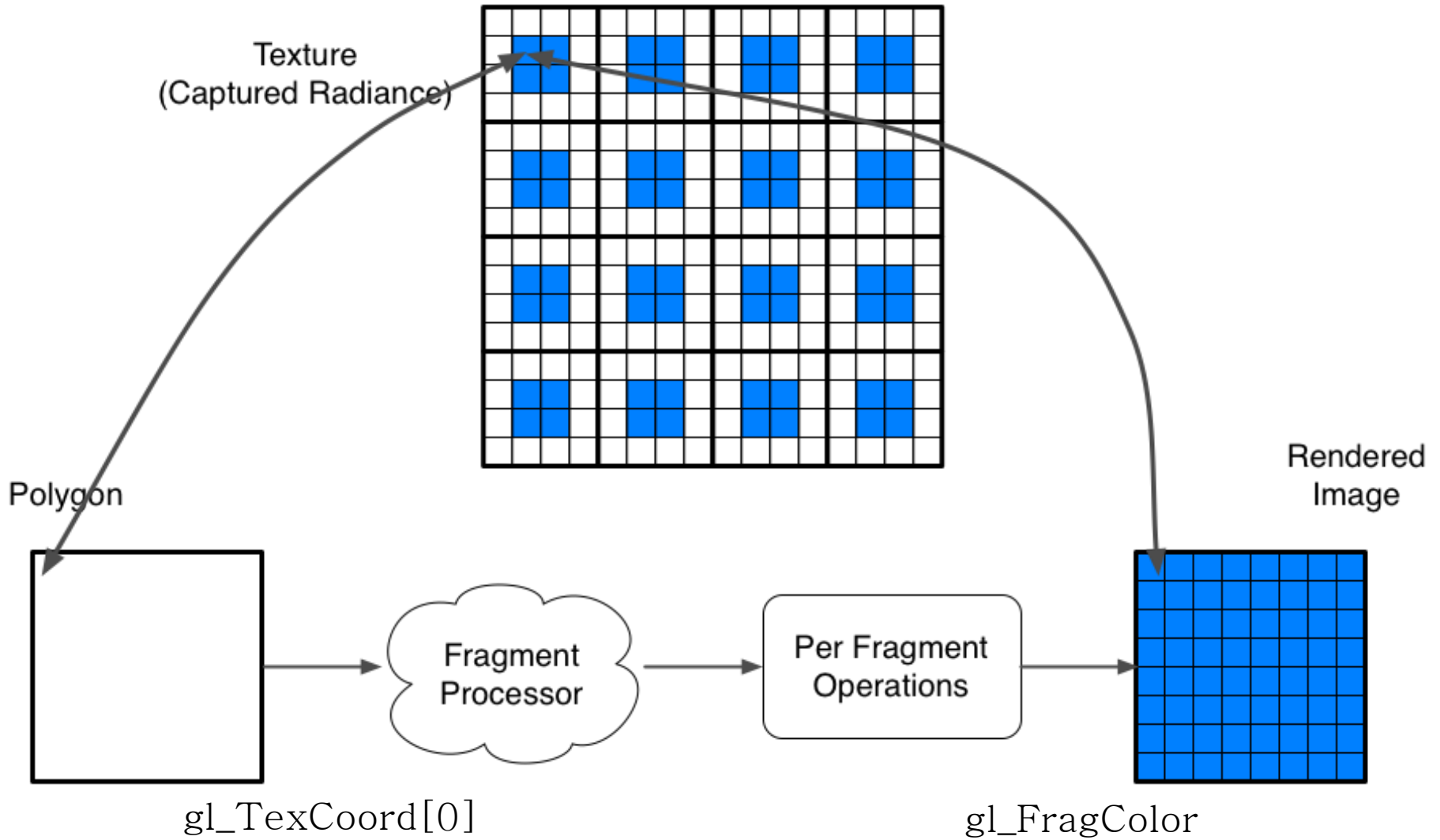
str_image = image.tostring("raw", "RGBX", 0, 1)

glActiveTexture(GL_TEXTURE0)
lfTexture = glGenTextures(1)
glBindTexture(GL_TEXTURE_RECTANGLE_ARB, lfTexture)
glTexImage2D(GL_TEXTURE_RECTANGLE_ARB, 0, 3,
             image.size[0], image.size[1], 0,
             GL_RGBA, GL_UNSIGNED_BYTE, str_image)
```

# GLSL Implementation of Rendering



# GLSL Implementation of Rendering



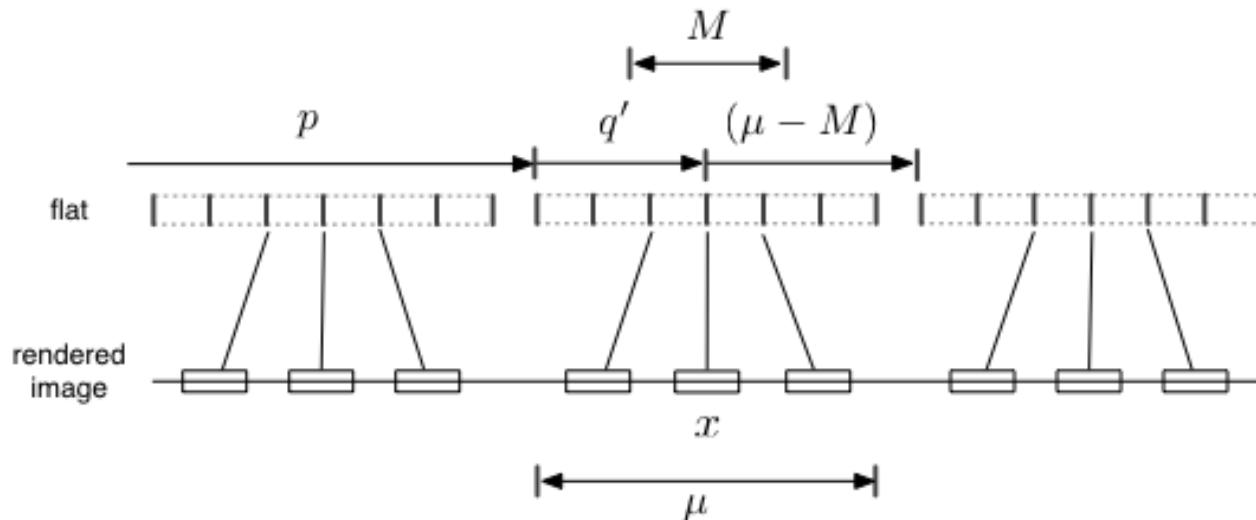
# GLSL Implementation of Rendering

- Given output pixel coordinate `gl_TexCoord[0].st`

- Find relevant microimage  $p = \lfloor \frac{x}{\mu} \rfloor$

- Find offset within  $q = \left( x - \lfloor \frac{x}{\mu} \rfloor \mu \right) \frac{M}{\mu} = \left( \frac{x}{\mu} - p \right) M$

- Center  $q' = q + \frac{\mu - M}{2} = \left( \frac{x}{\mu} - p \right) M + \frac{\mu - M}{2}$





# GLSL Rendering

```
uniform sampler2DRect flat;
```

```
uniform float M, mu;
```

```
void main()
```

```
{
```

```
    vec2 x_mu = gl_TexCoord[0].st/mu; // x/μ
    vec2 p = floor(x_mu);           // p = ⌊x/μ⌋
    vec2 q = (x_mu - p) * M;       // (x/μ - p)M
    vec2 qp = q + 0.5*(mu - M);   // q' = q + (μ - M)/2
```

```
    vec4 colXY = vec4(0.0);
```

```
    for (int i = -1; i <= 1; ++i) {
        for (int j = -1; j <= 1; ++j) {
```

```
            vec2 ij = vec2(float(i), float(j));
```

```
            vec2 dq = qp - ij * M;
```

```
            vec2 fx = (p + ij)*mu + dq;
```

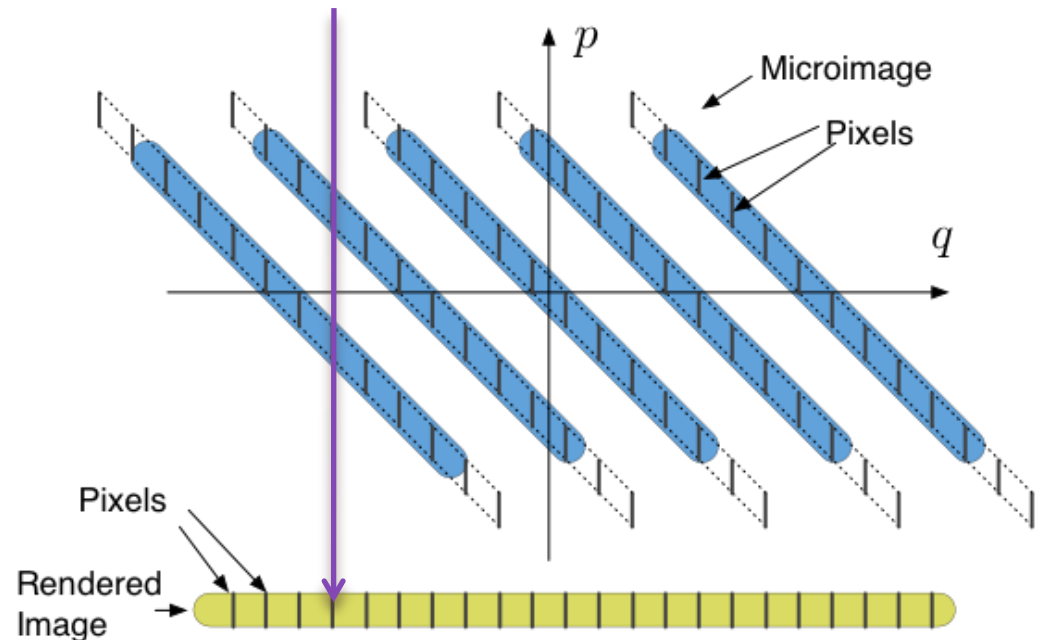
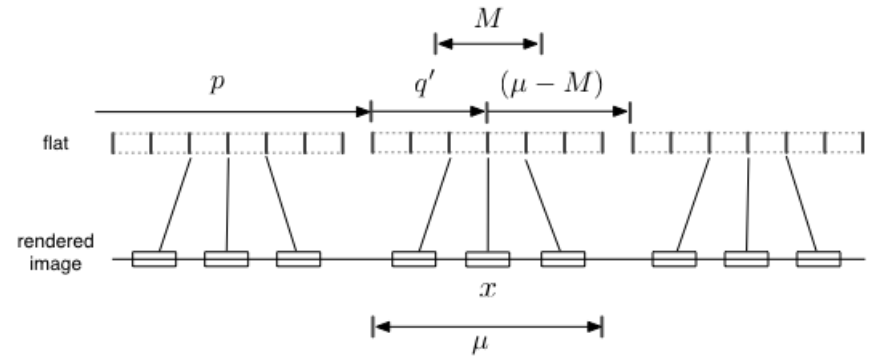
```
            colXY += texture2DRect(flat, fx);
```

```
        }
```

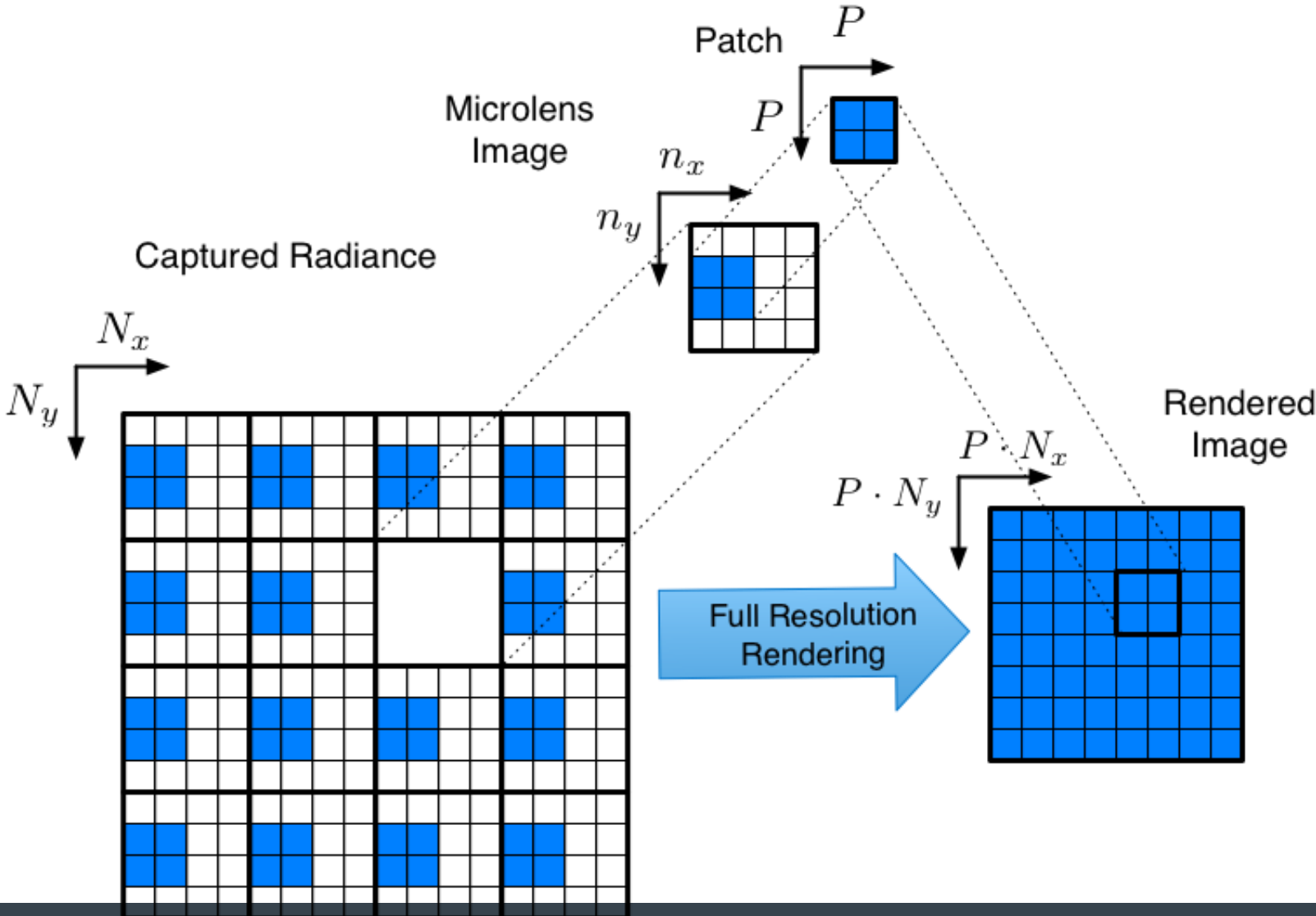
```
    }
```

```
    gl_FragColor = colXY / 5.0;
```

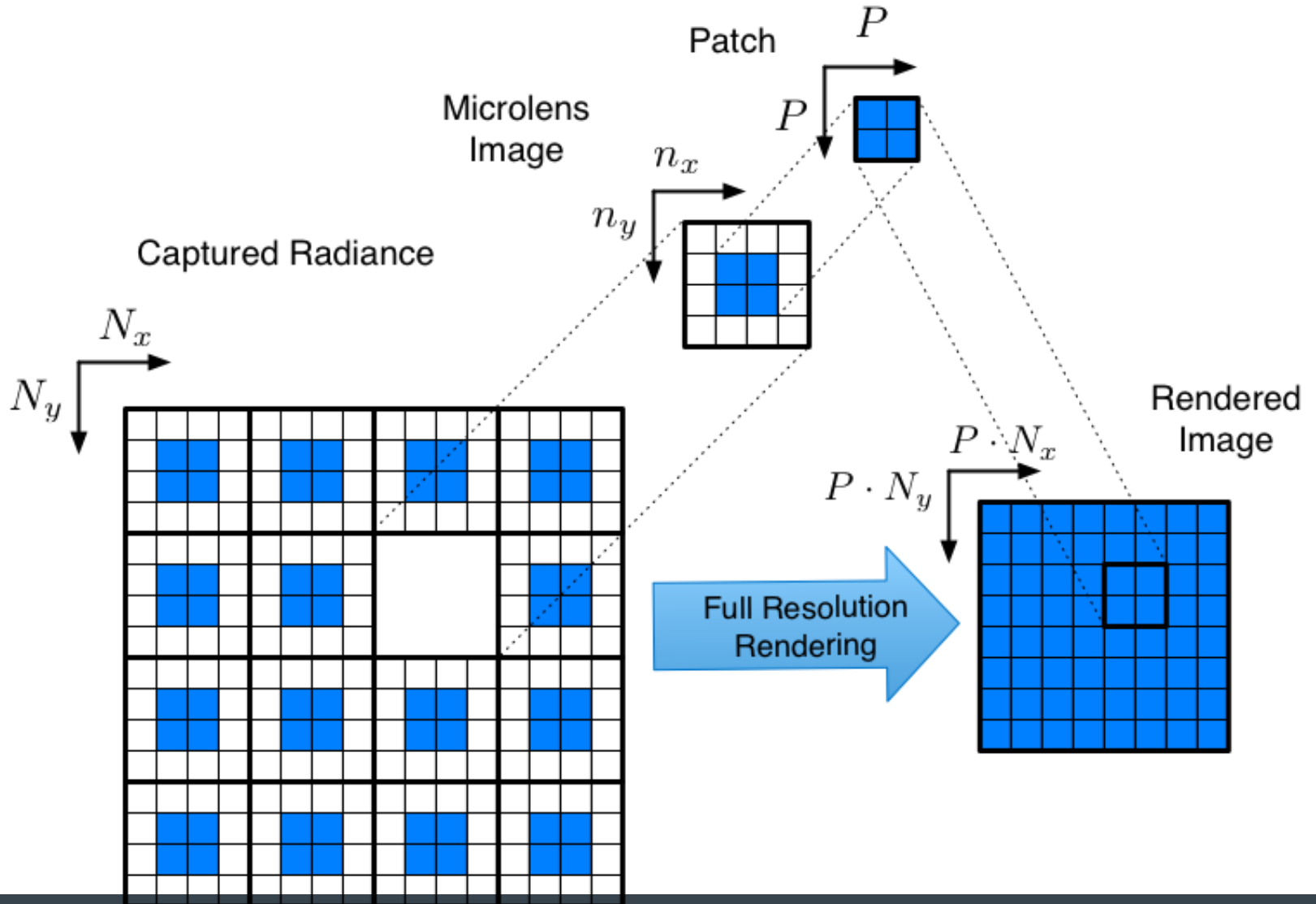
```
}
```



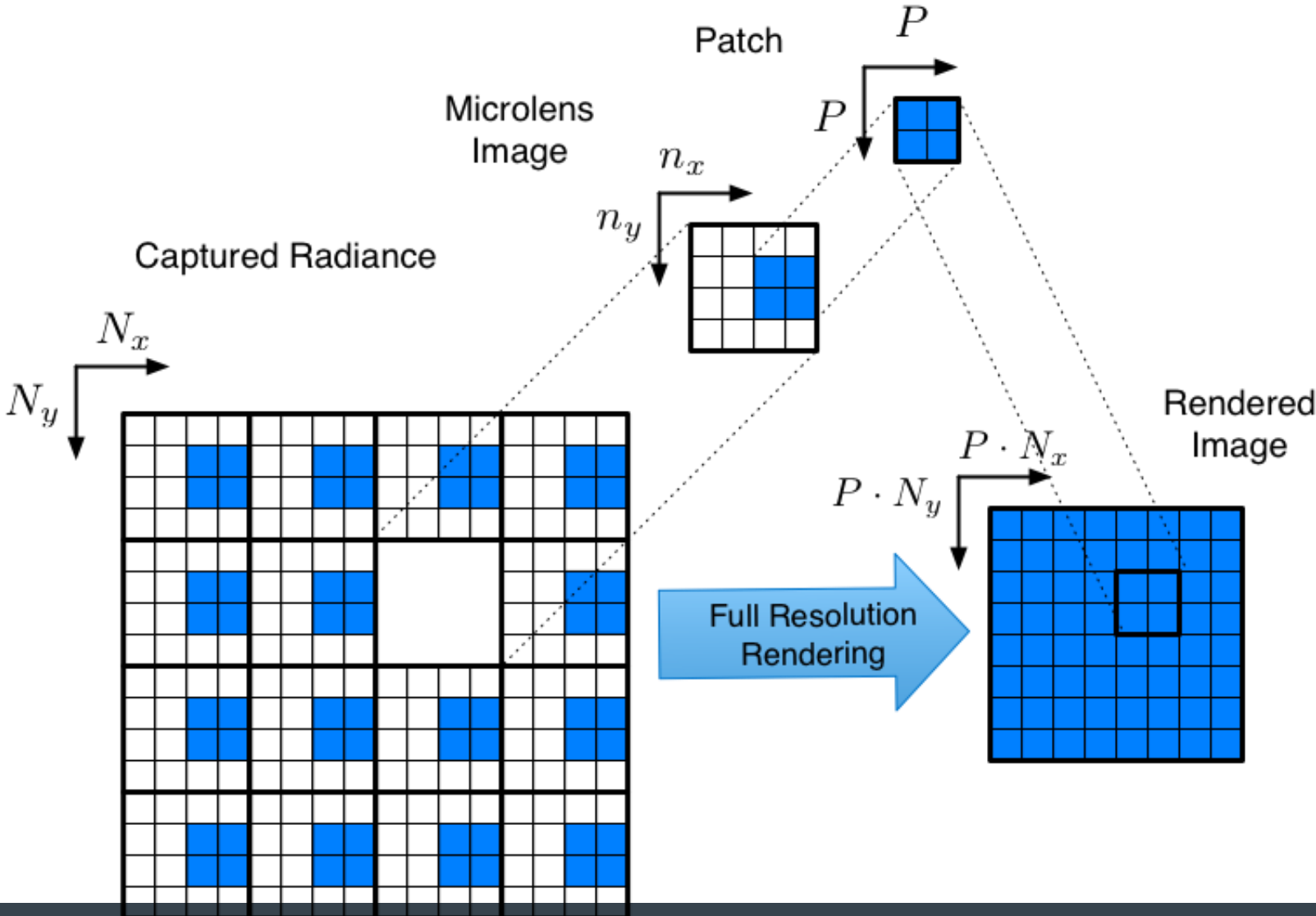
# Choosing View



# Choosing View



# Choosing View



# GLSL Rendering

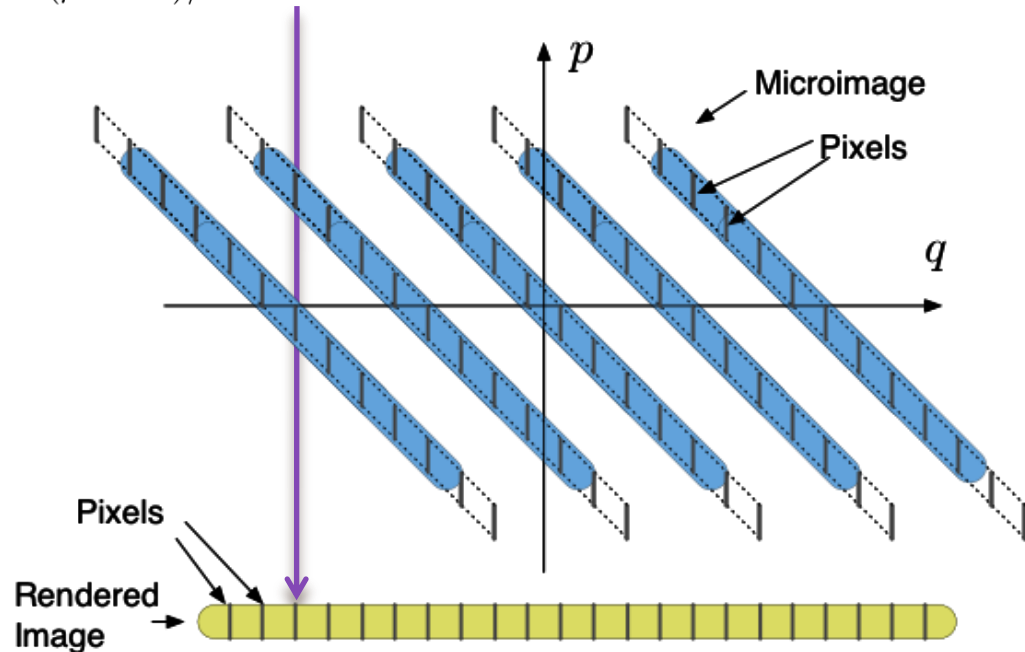
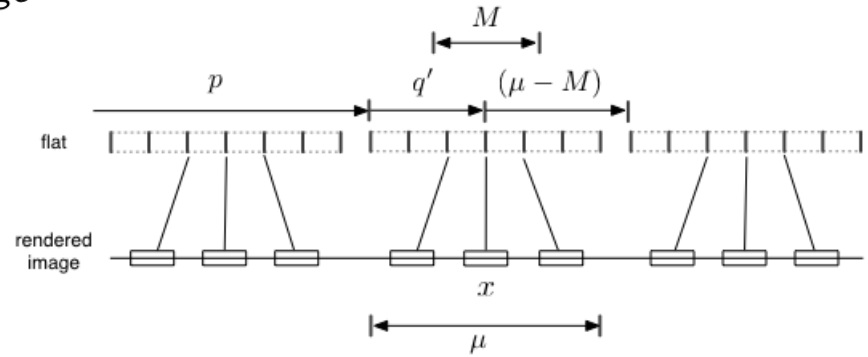
```
uniform sampler2DRect flat; // Plenoptic image
uniform sampler2DRect flat;
```

```
uniform float M, mu;
uniform float offset;
```

```
void main()
{
    vec2 x_mu = gl_TexCoord[0].st/mu; // x/μ
    vec2 p = floor(x_mu); // p = floor(x/μ)
    vec2 q = (x_mu - p) * M; // q = (x/μ - p)M
    vec2 qp = q + 0.5*(mu - M); // q' = q + (μ - M)/2
}
```

```
vec4 colXY = vec4(0.0);
for (int i = -1; i <= 1; ++i) {
    for (int j = -1; j <= 1; ++j) {
        vec2 ij = vec2(float(i), float(j));
        vec2 dq = qp - ij * M;
        vec2 fx = (p + ij)*mu + dq + offset;

        colXY += texture2DRect(flat, fx);
    }
}
gl_FragColor = colXY / 5.0;
```





# Choosing View



# Choosing View

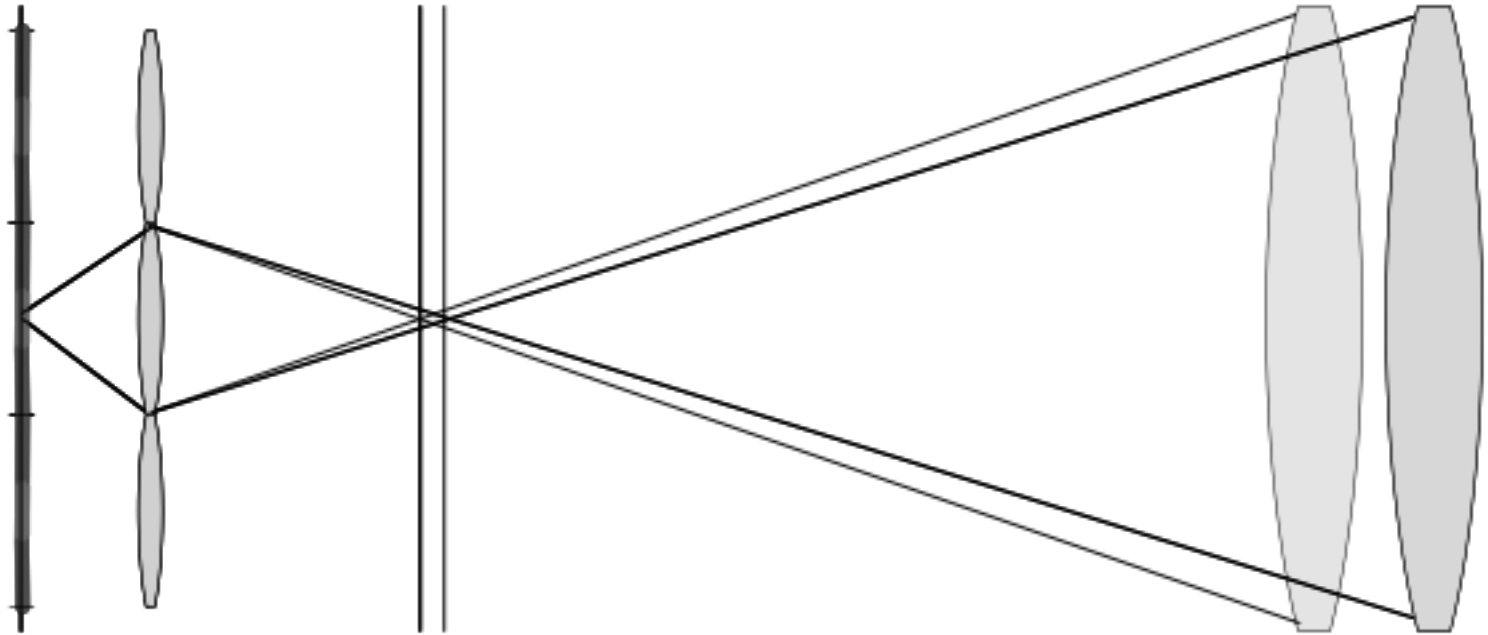




# Choosing View



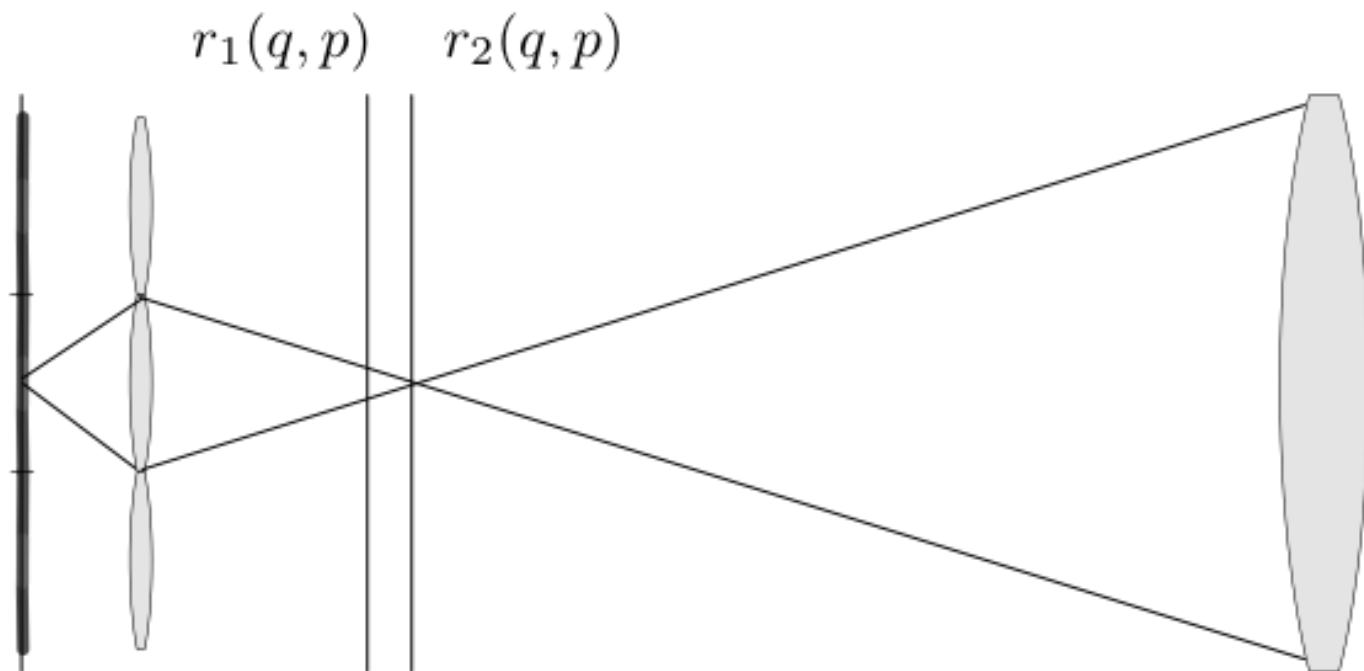
# Computational Refocusing



- What does the sensor capture with different focal planes?
- What is this in terms of phase space?

# Computational Refocusing

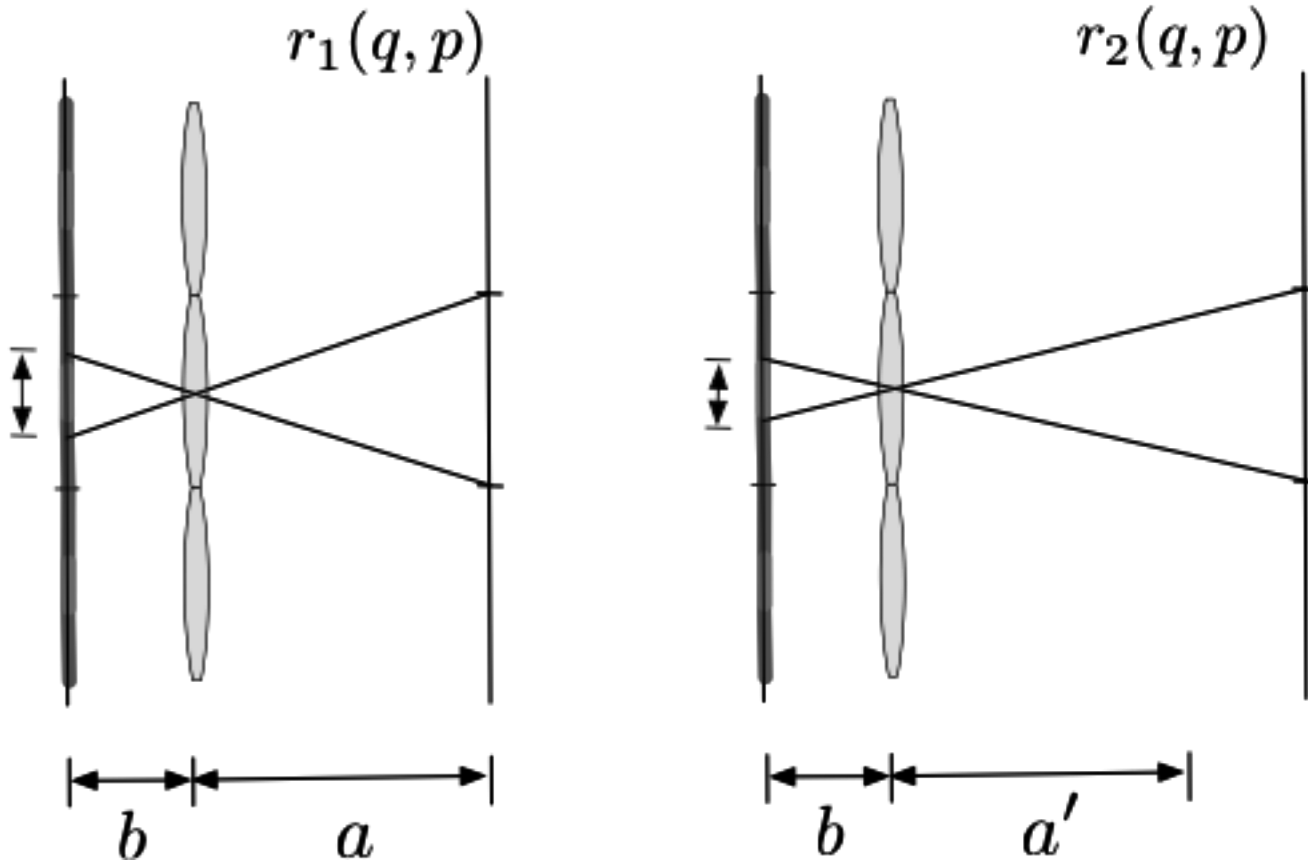
- We capture radiance  $r_1$ . How can we compute  $r_2$ ?
- Apply translation transform of the radiance and render from transformed  $r$ 
  - Very expensive





# Plenoptic 2.0 Refocusing Principle

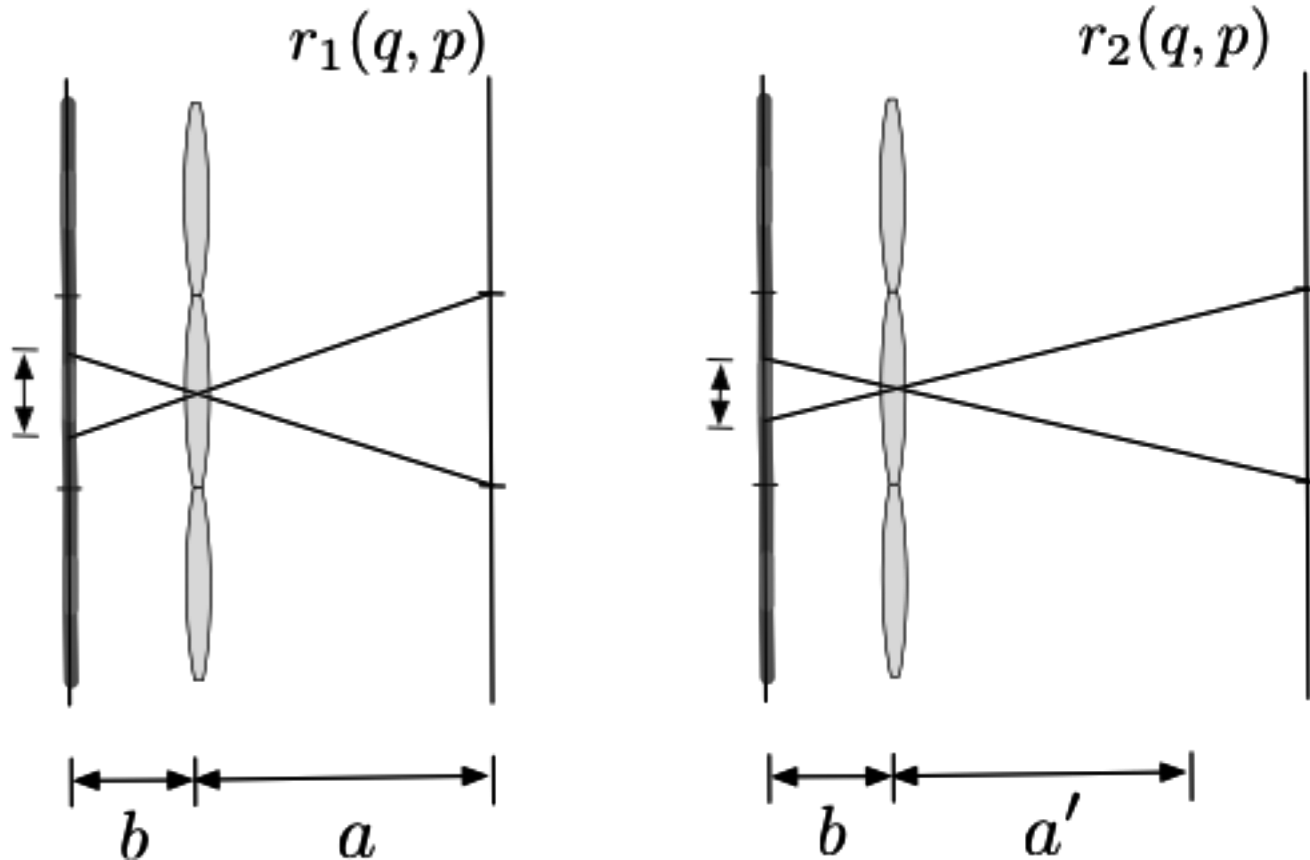
- Rendering for two different focal planes
- Comments?



# Plenoptic 2.0 Refocusing Principle

- A new focal plane can be rendered directly from original radiance

$$I_2(q) = \int_p r_2(q, p) dp = \int_p r_1(q', p') dp$$



# GLSL Rendering

```
uniform sampler2DRect flat;
```

```
uniform float M, mu;
```

```
void main()
```

```
{
    vec2 x_mu = gl_TexCoord[0].st/mu; // x/μ
    vec2 p = floor(x_mu); // p = ⌊x/μ⌋
    vec2 q = (x_mu - p) * M; // (x/μ - p)M
    vec2 qp = q + 0.5*(mu - M); // q' = q + (μ - M)/2
```

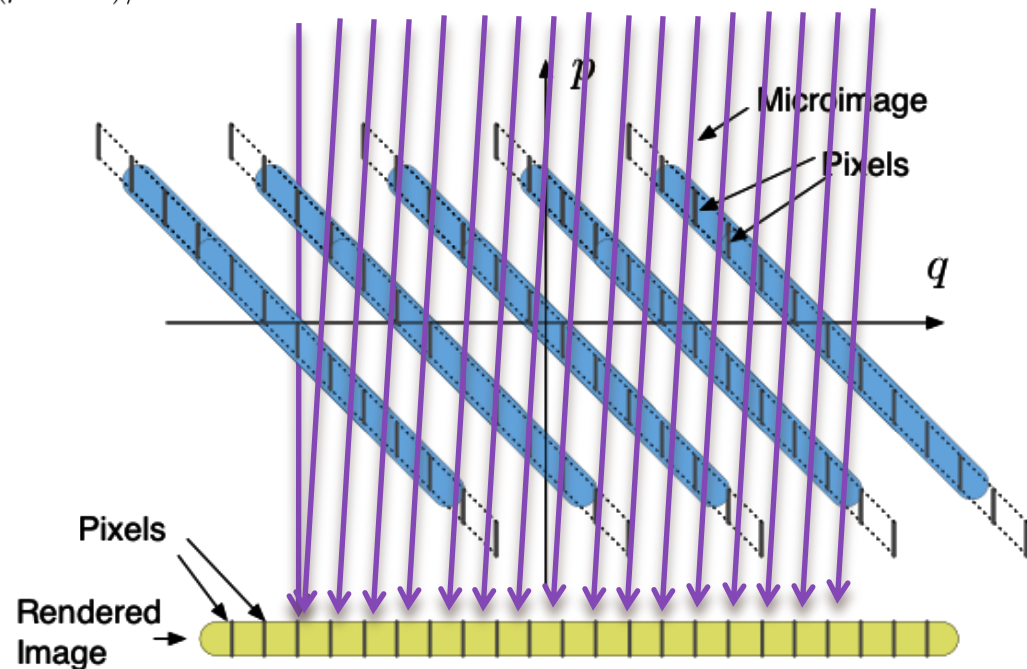
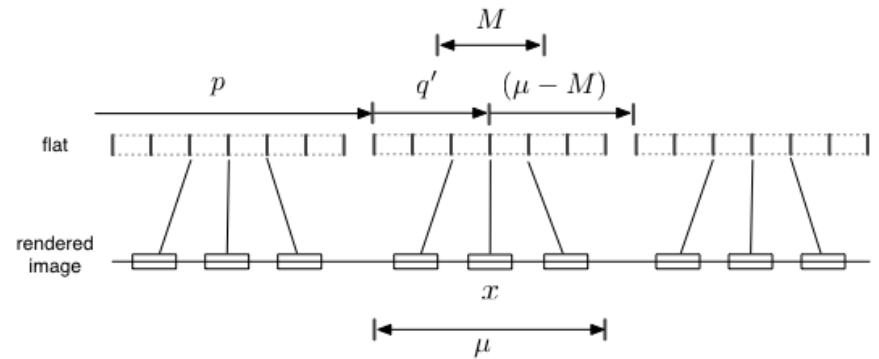
```
    vec4 colXY = vec4(0.0);
    for (int i = -1; i <= 1; ++i) {
        for (int j = -1; j <= 1; ++j) {
```

```
            vec2 ij = vec2(float(i), float(j));
            vec2 dq = qp - ij * M;
            vec2 fx = (p + ij)*mu + dq;
```

```
            colXY += texture2DRect(flat, fx);
```

```
        }
    }
    gl_FragColor = colXY / 5.0;
```

```
}
```



# Computational Focusing





# Computational Focusing





# Computational Focusing



## To Find Out More

- Georgiev, T., Lumsdaine, A., “Focused Plenoptic Camera and Rendering,” *Journal of Electronic Imaging*, Volume 19, Issue 2, 2010
- <http://www.tgeorgiev.net/CVPR2010/>



# Live Demonstrations



**Adobe**

# GLSL Implementation (Basic Rendering)

```
uniform sampler2DRect flat;           // Plenoptic image

uniform float M, mu;

void main()
{
    vec2 x_mu = gl_TexCoord[0].st/mu; //  $x/\mu$ 
    vec2 p = floor(x_mu);             //  $p = \lfloor x/\mu \rfloor$ 
    vec2 q = (x_mu - p) * M;         //  $(x/\mu - p)M$ 
    vec2 qp = q + 0.5*(mu - M);      //  $q' = q + (\mu - M)/2$ 

    vec2 fx = p * mu + qp;          //  $f(x) = p\mu + q'$ 

    gl_FragColor = texture2DRect(flat, fx);
}
```