

# Light field photography and videography

Marc Levoy



Computer Science Department  
Stanford University

# List of projects

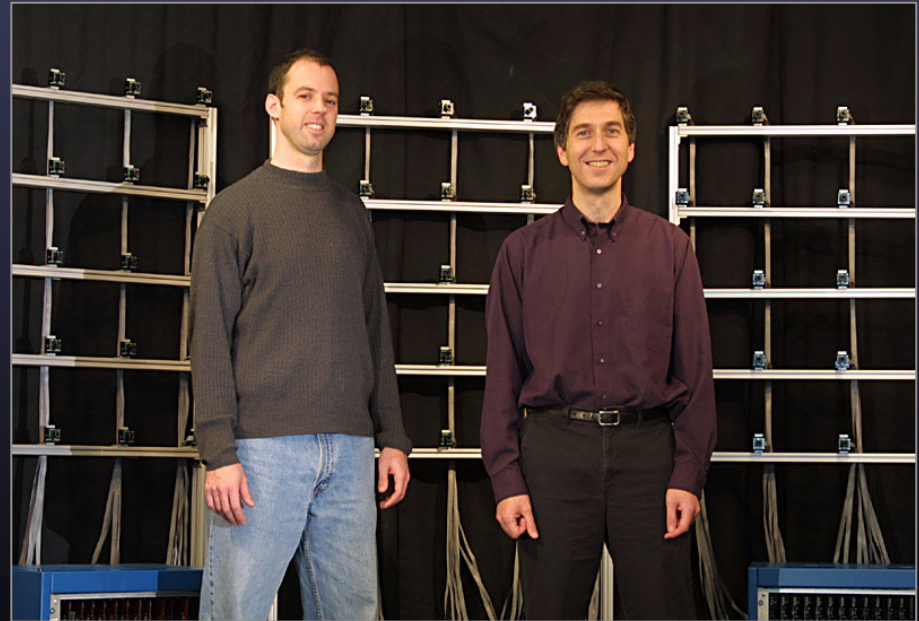
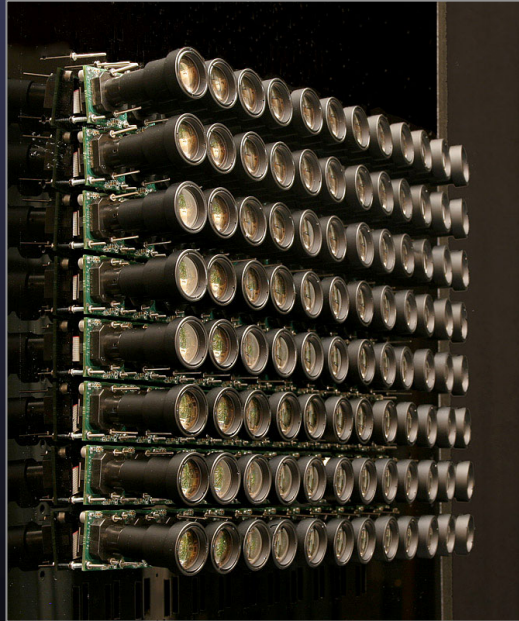
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- high performance imaging using large camera arrays
- light field photography using a handheld plenoptic camera
- dual photography

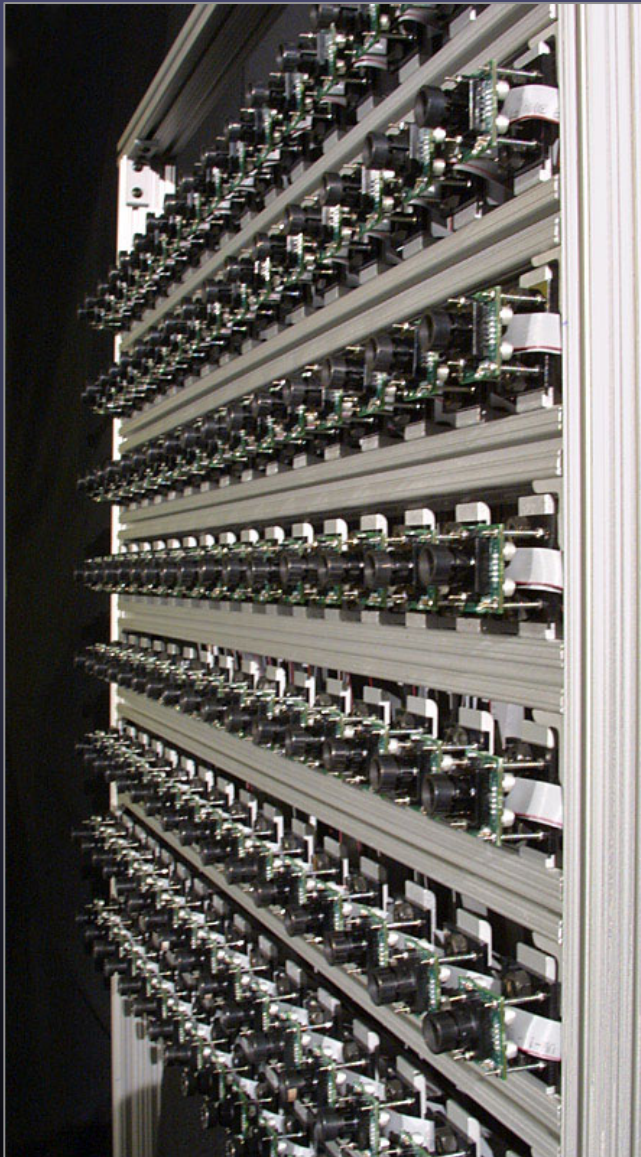
# High performance imaging using large camera arrays

*Bennett Wilburn, Neel Joshi, Vaibhav Vaish, Eino-Ville Talvala, Emilio Antunez,  
Adam Barth, Andrew Adams, Mark Horowitz, Marc Levoy*

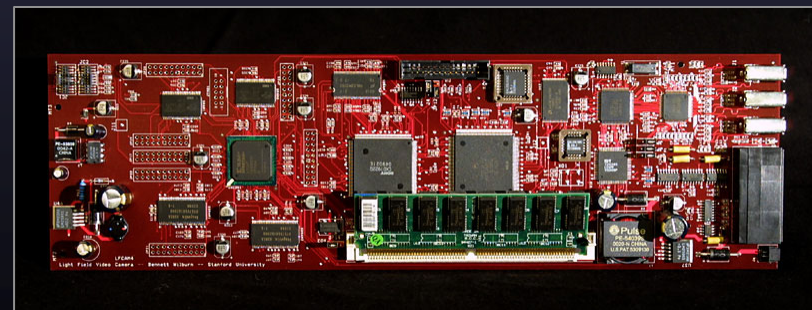
*(Proc. SIGGRAPH 2005)*



# Stanford multi-camera array



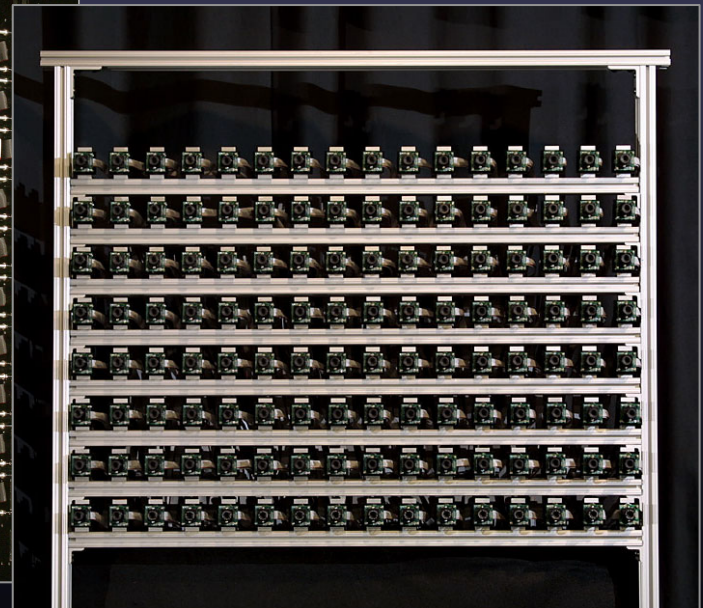
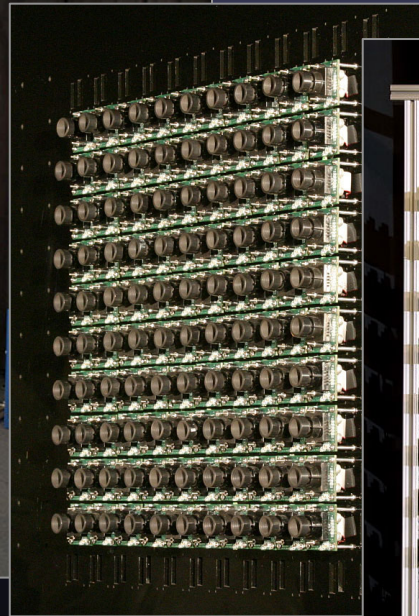
- $640 \times 480$  pixels  $\times$   
30 fps  $\times$  128 cameras
- synchronized timing
- continuous streaming
- flexible arrangement



# Ways to use large camera arrays

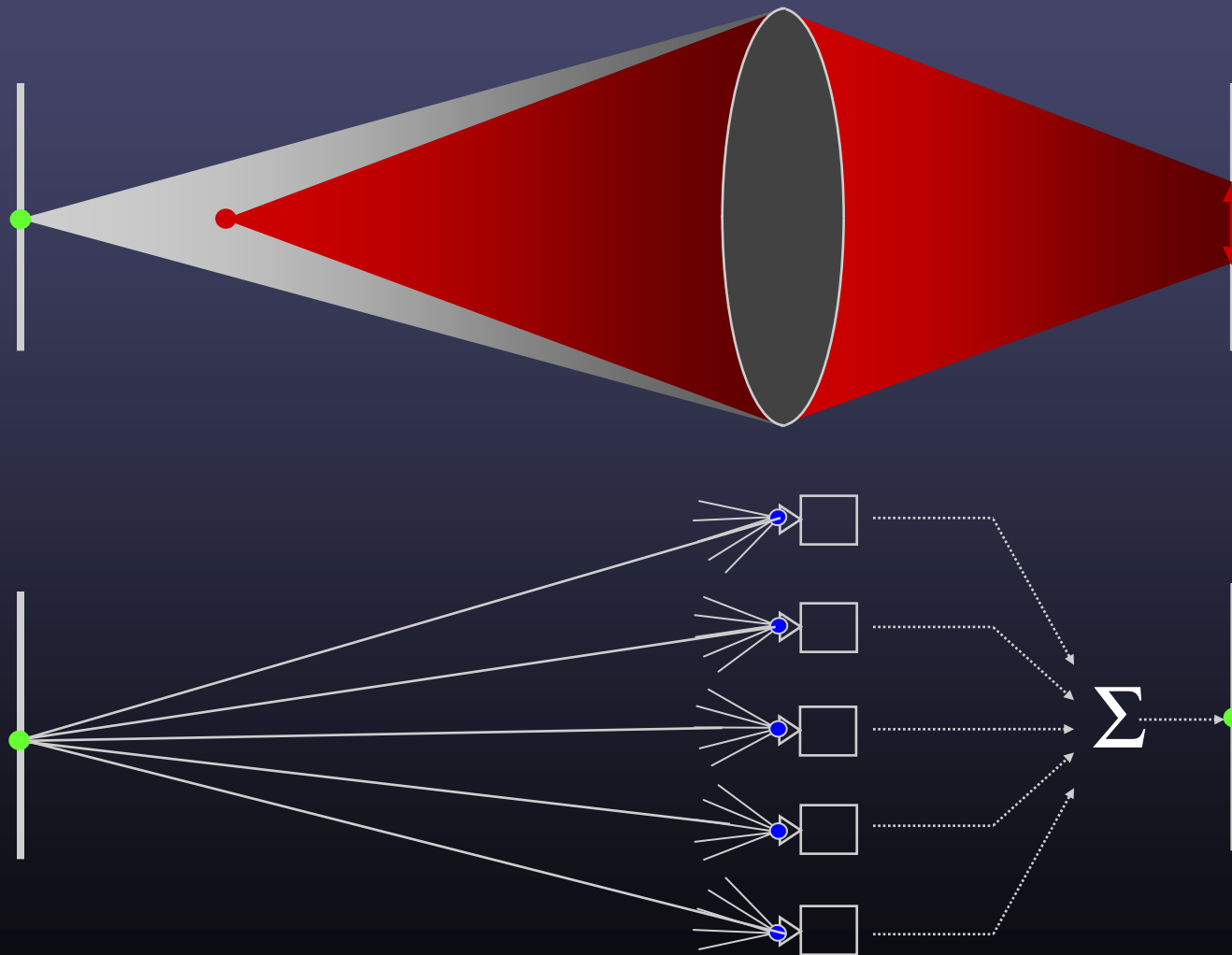
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- widely spaced → light field capture
- tightly packed → high-performance imaging
- intermediate spacing → synthetic aperture photography



# Intermediate camera spacing: synthetic aperture photography

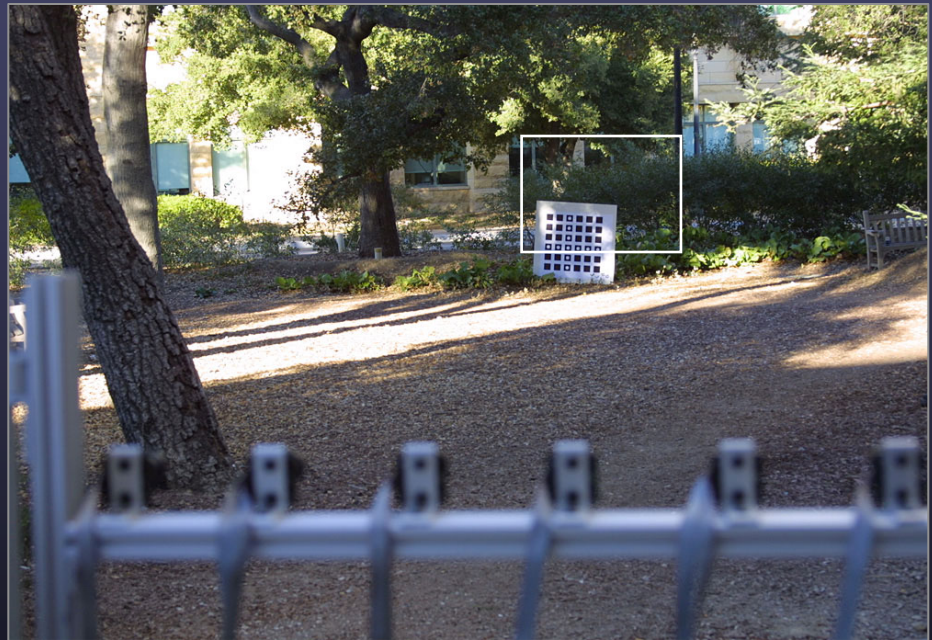
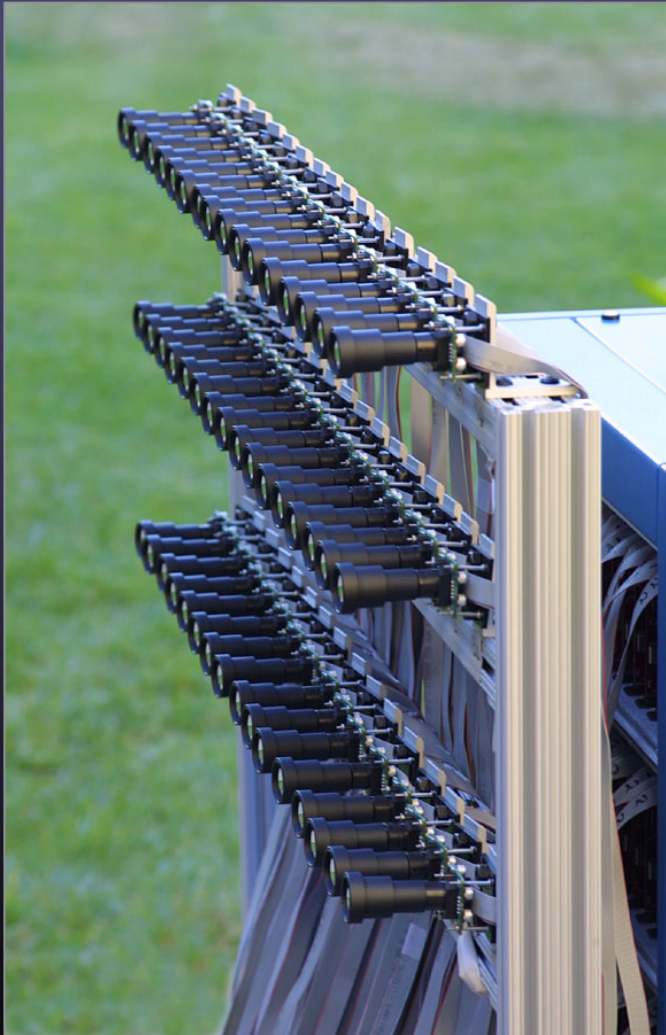
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# Example using 45 cameras

[Vaish CVPR 2004]

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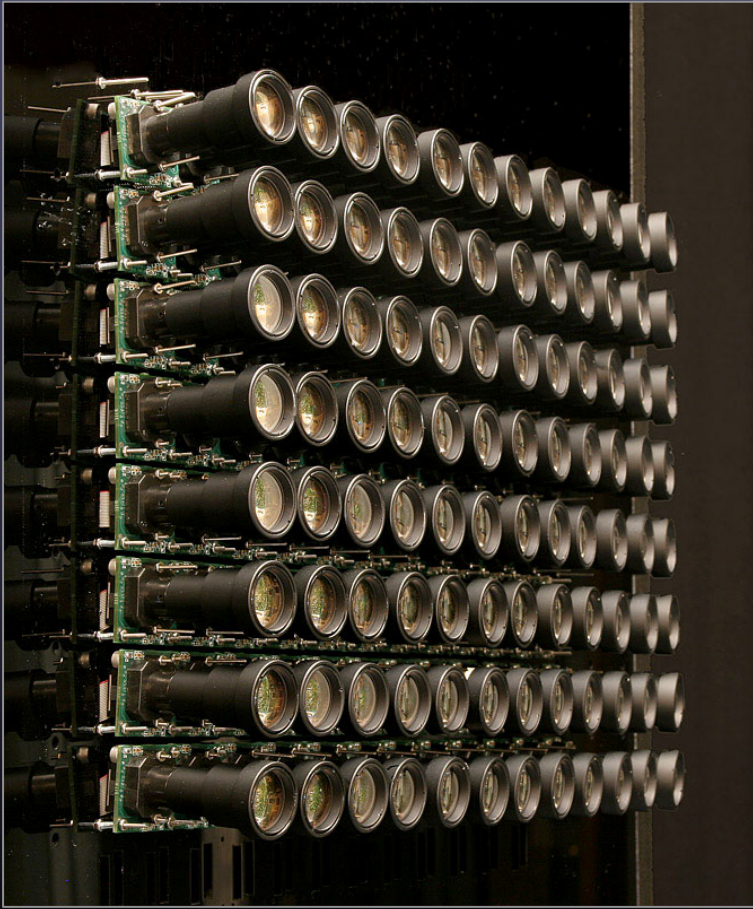






# Tiled camera array

*Can we match the image quality of a cinema camera?*



- world's largest video camera
- no parallax for distant objects
- poor lenses limit image quality
- seamless mosaicing isn't hard

# Tiled panoramic image (before geometric or color calibration)

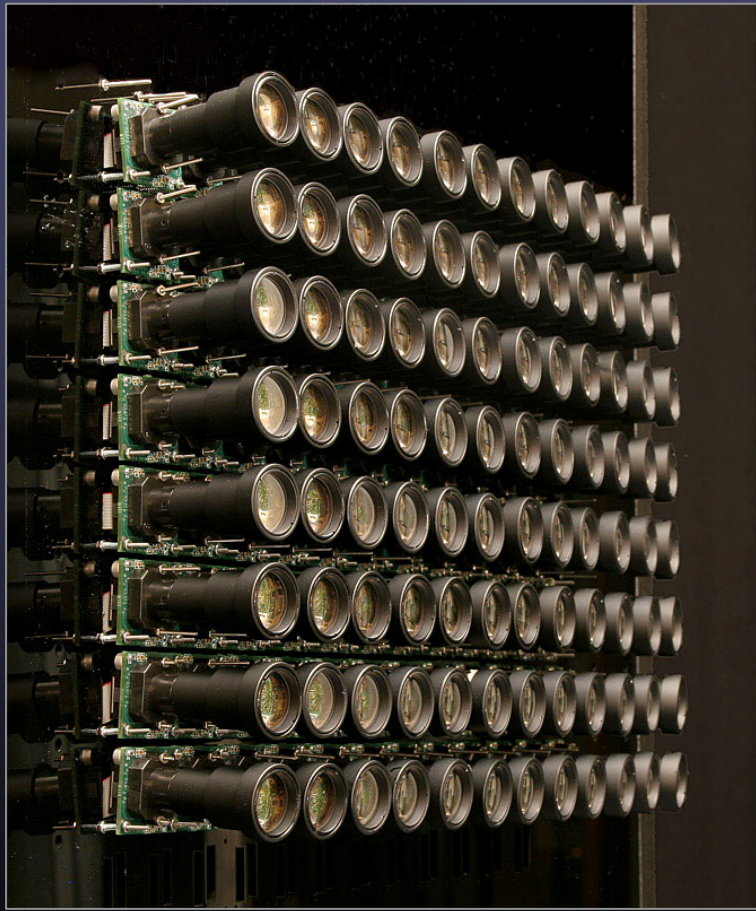


# Tiled panoramic image (after calibration and blending)



# Tiled camera array

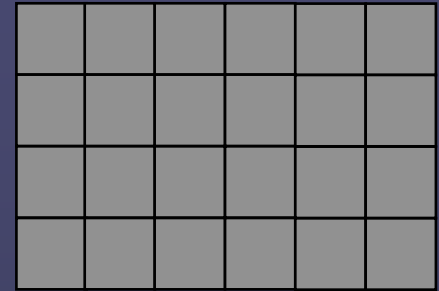
*Can we match the image quality of a cinema camera?*



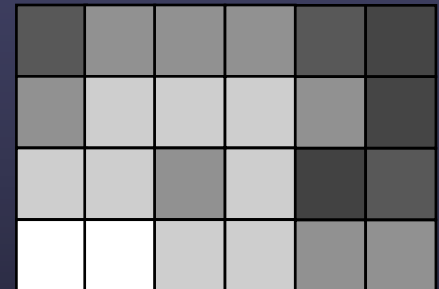
- world's largest video camera
- no parallax for distant objects
- poor lenses limit image quality
- seamless mosaicing isn't hard
- per-camera exposure metering
- HDR within and between tiles



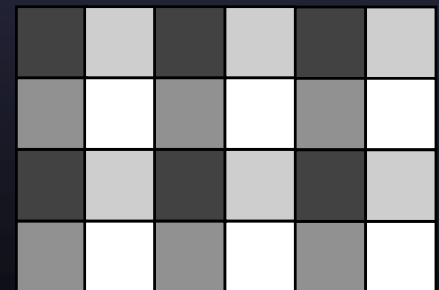
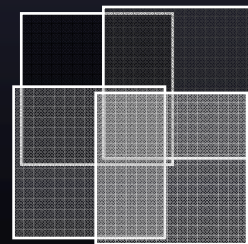
same exposure  
in all cameras



individually  
metered



checkerboard  
of exposures



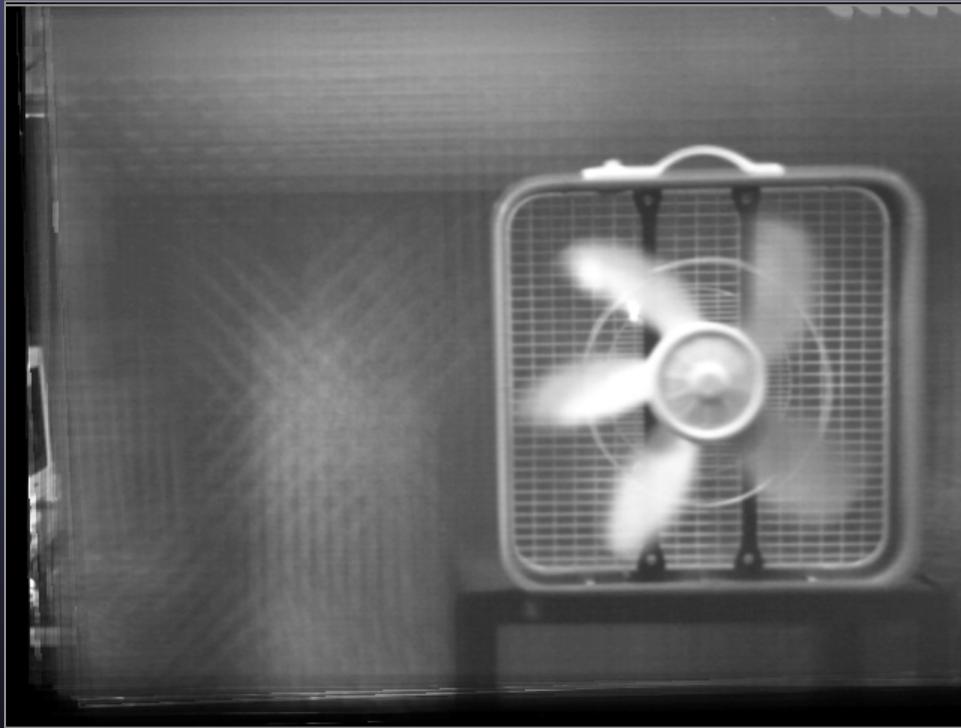
# High-performance photography as multi-dimensional sampling

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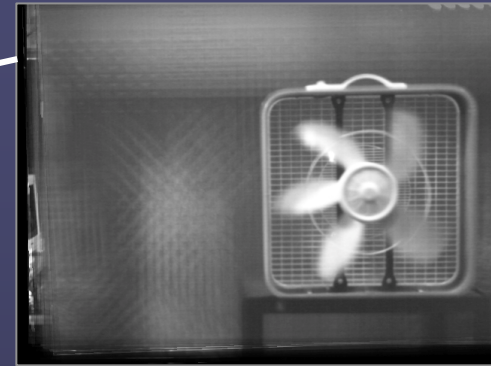
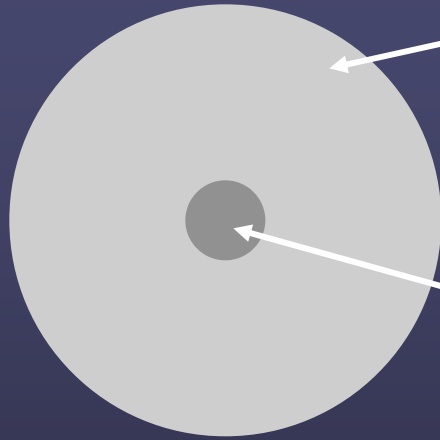
- spatial resolution
- field of view
- frame rate
- dynamic range
- bits of precision
- depth of field
- focus setting
- color sensitivity

# Spacetime aperture shaping

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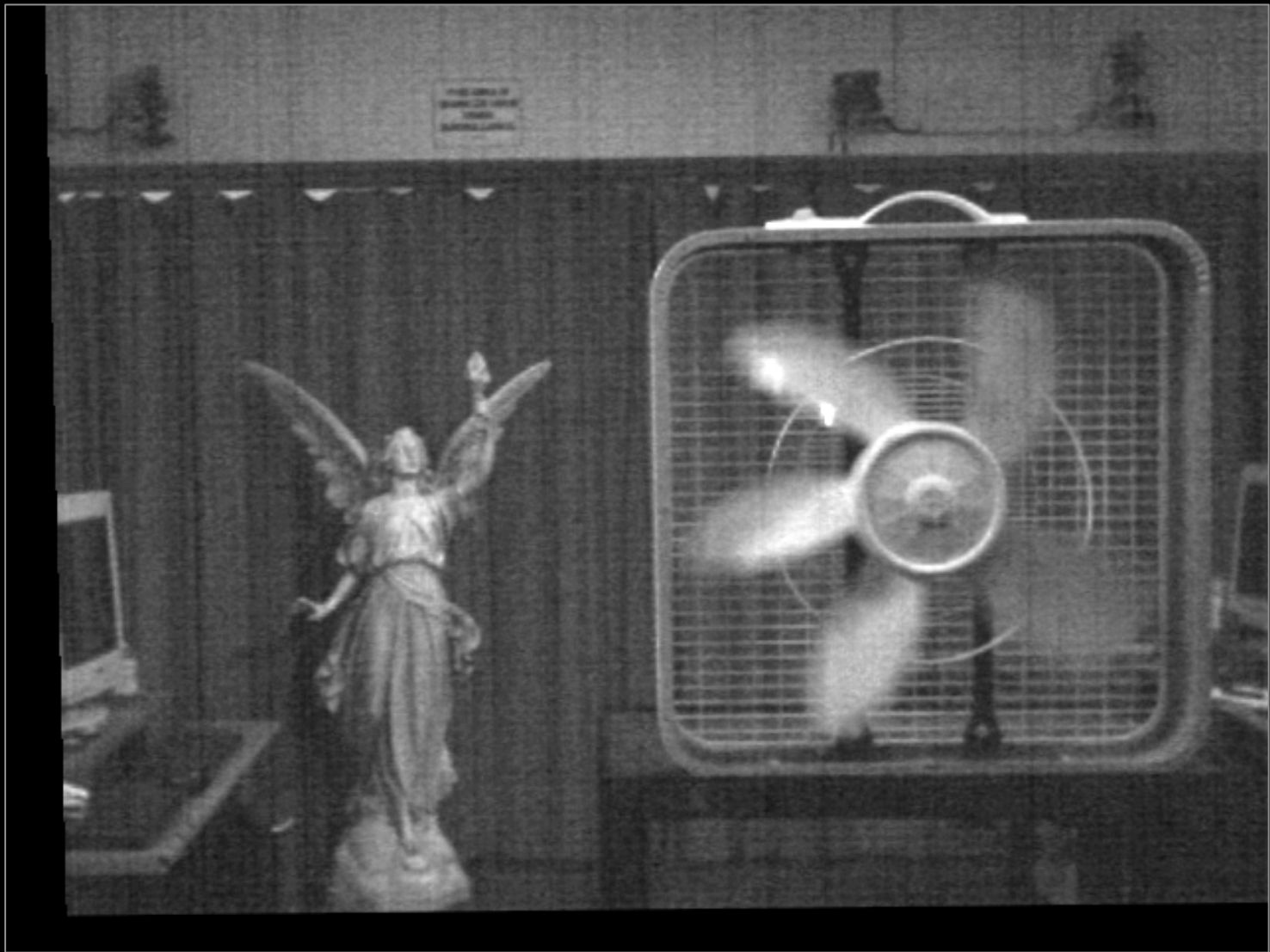
- shorten exposure time to freeze motion → dark
- stretch contrast to restore level → noisy
- increase (synthetic) aperture to capture more light → decreases depth of field



- center of aperture: few cameras, long exposure → high depth of field, low noise, but action is blurred
- periphery of aperture: many cameras, short exposure → freezes action, low noise, but low depth of field





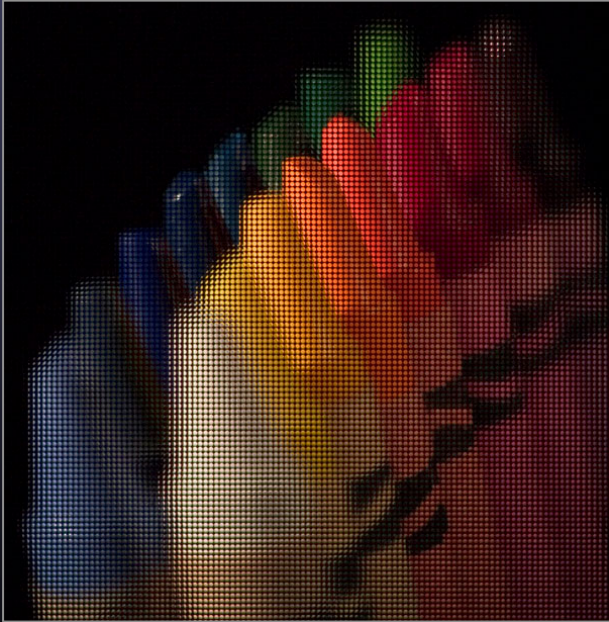


# Light field photography using a handheld plenoptic camera

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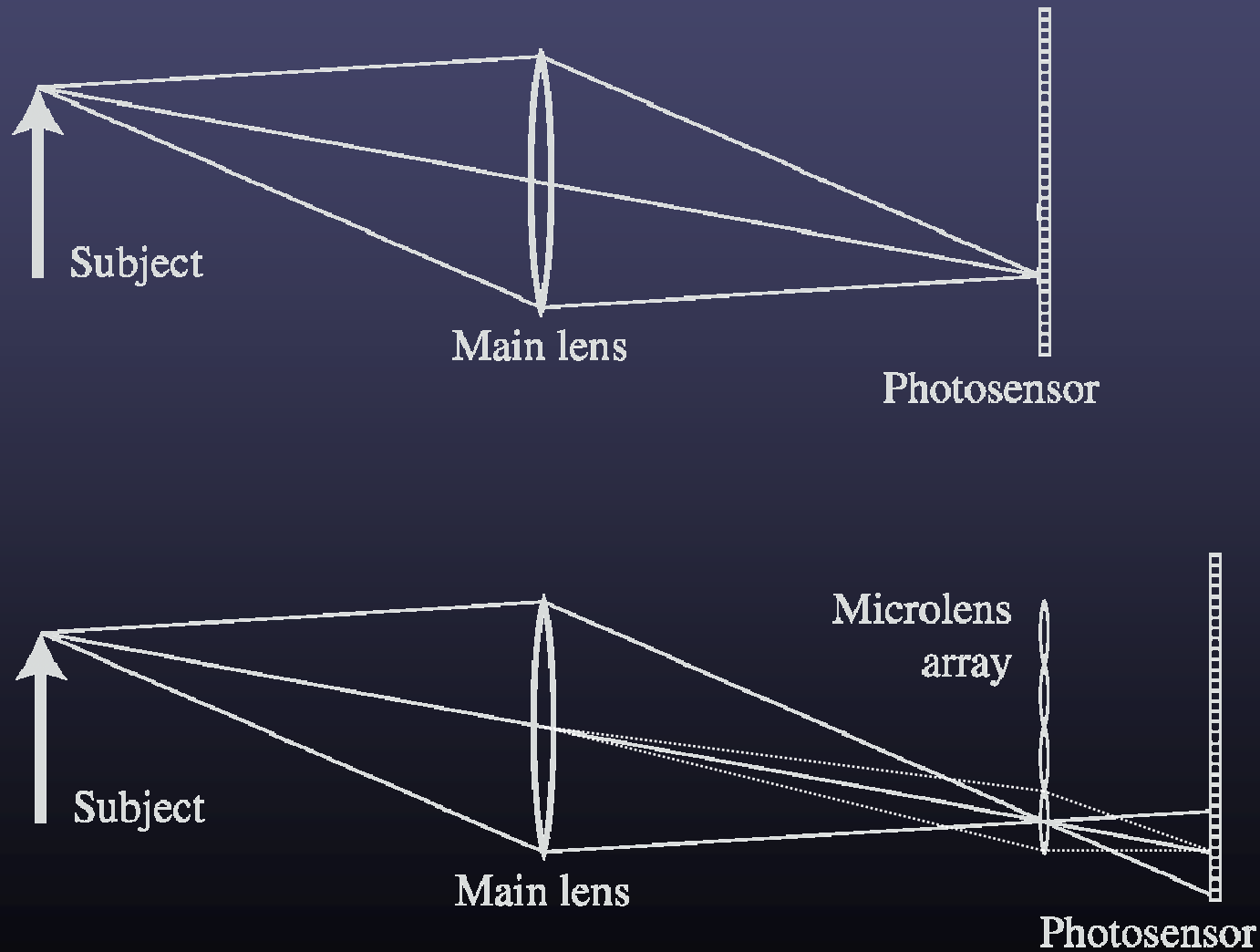
*Ren Ng, Marc Levoy, Mathieu Brédif,  
Gene Duval, Mark Horowitz and Pat Hanrahan*

*(Proc. SIGGRAPH 2005  
and TR 2005-02)*



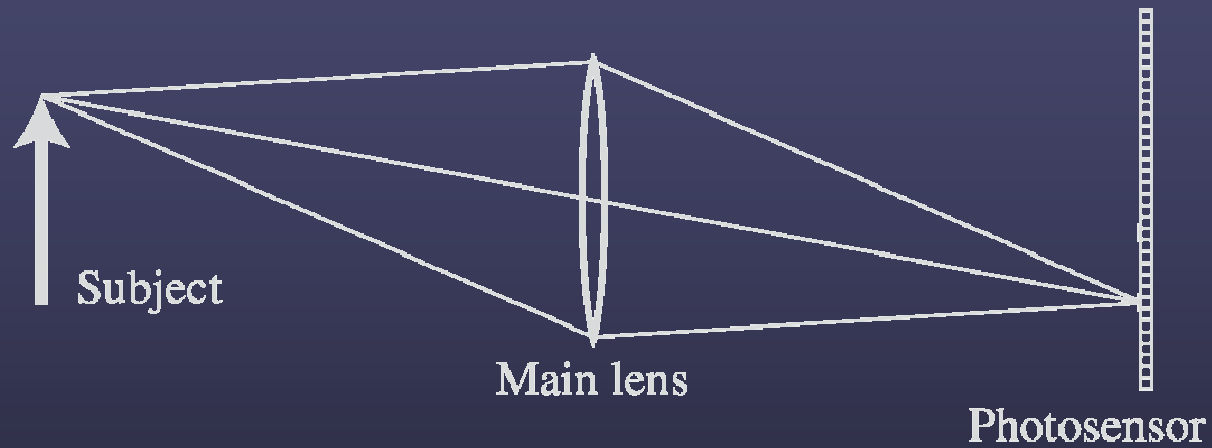
# Conventional versus light field camera

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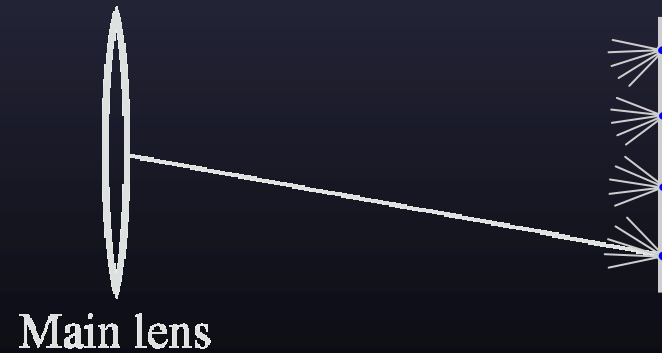
# Conventional versus light field camera

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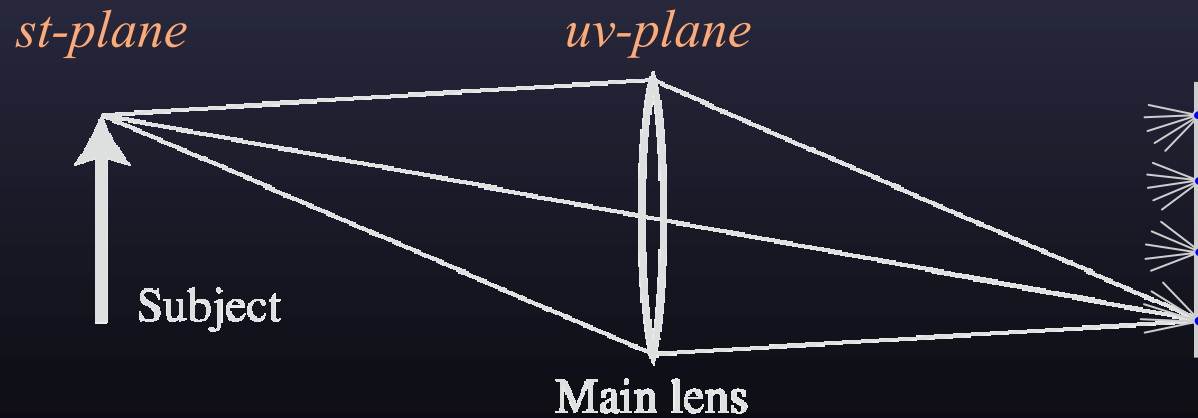
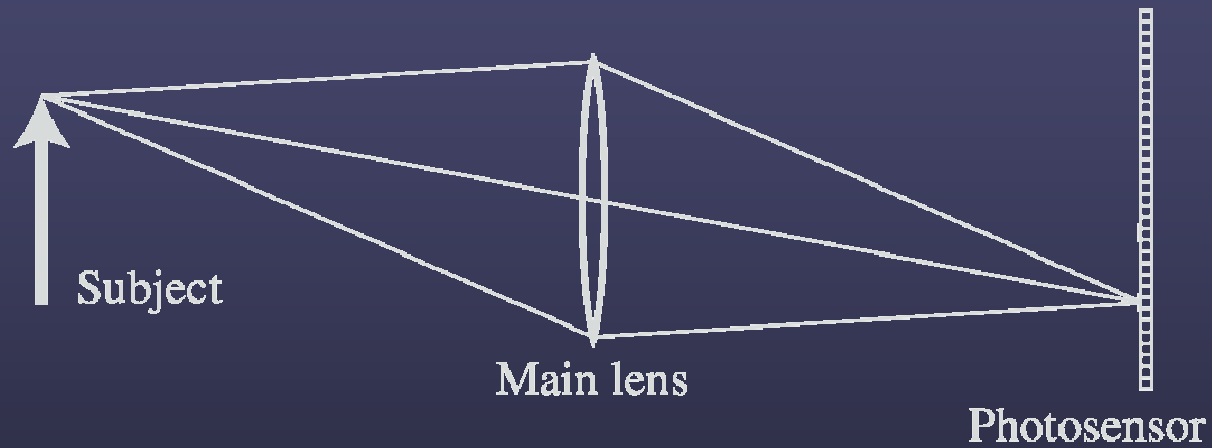
*uv-plane*

*st-plane*



# Conventional versus light field camera

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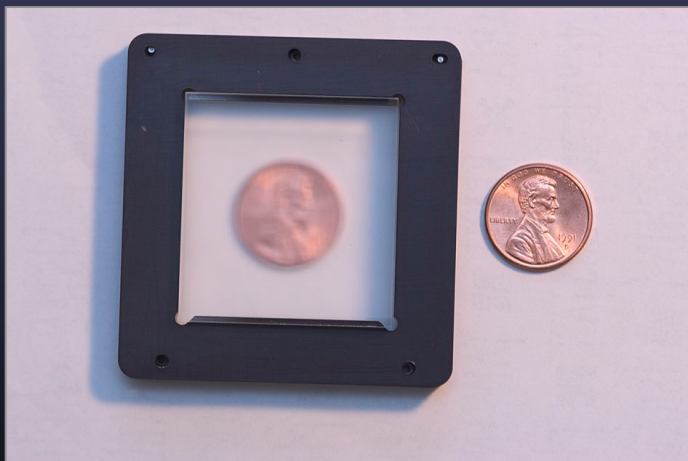
# Prototype camera



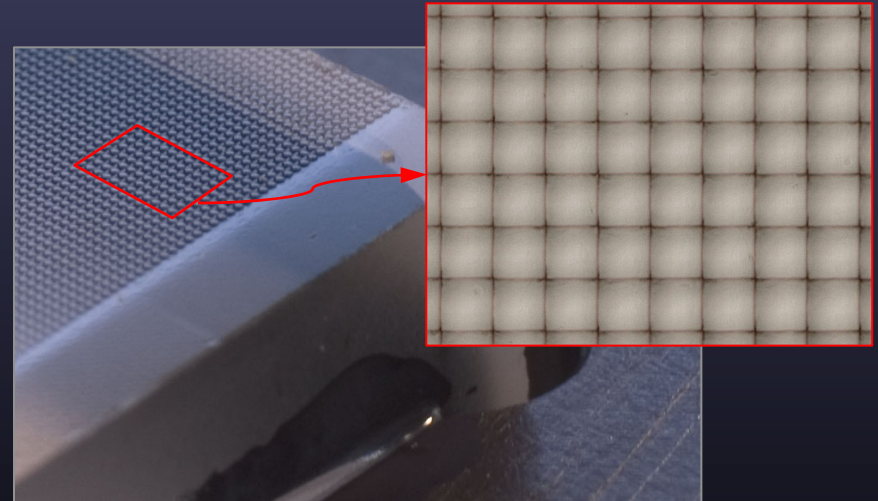
Contax medium format camera



Kodak 16-megapixel sensor



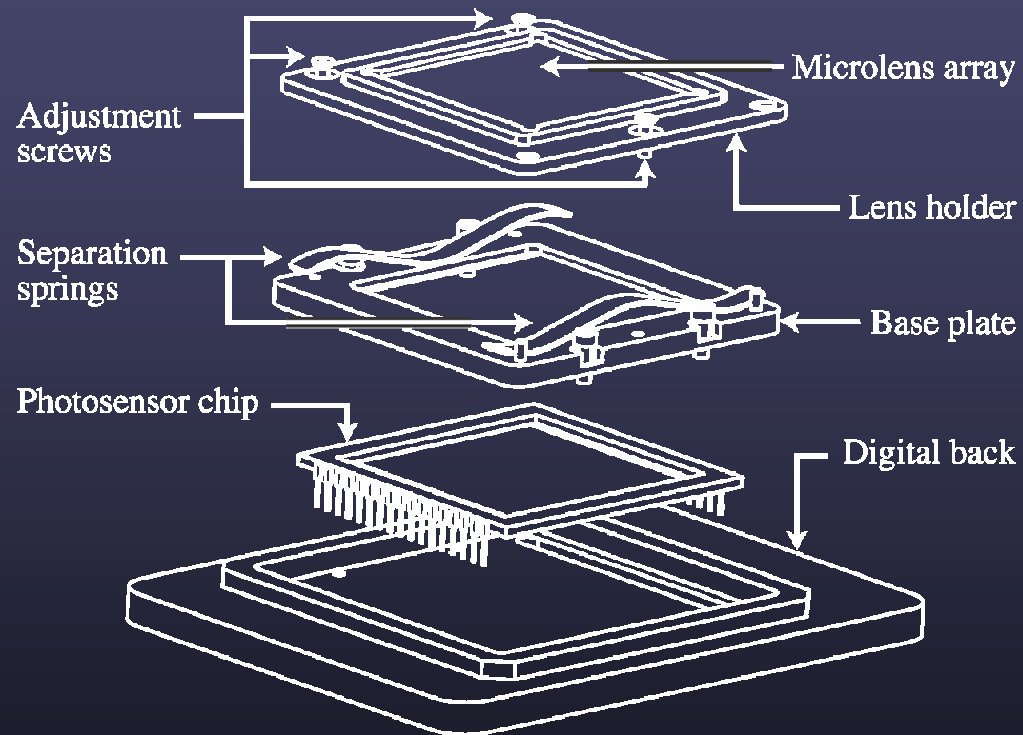
Adaptive Optics microlens array



125 $\mu$  square-sided microlenses

$$4000 \times 4000 \text{ pixels} \div 292 \times 292 \text{ lenses} = 14 \times 14 \text{ pixels per lens}$$

# Mechanical design



- microlenses float  $500\mu$  above sensor
- focused using 3 precision screws

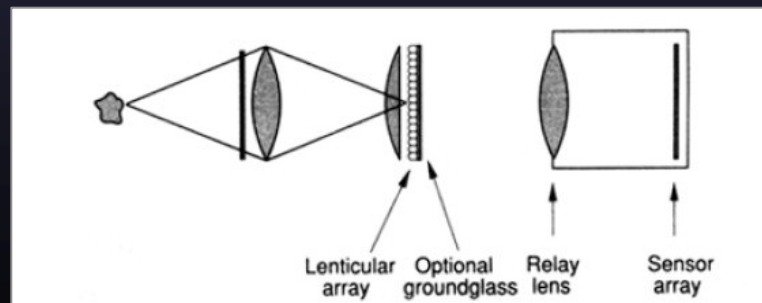




# Prior work

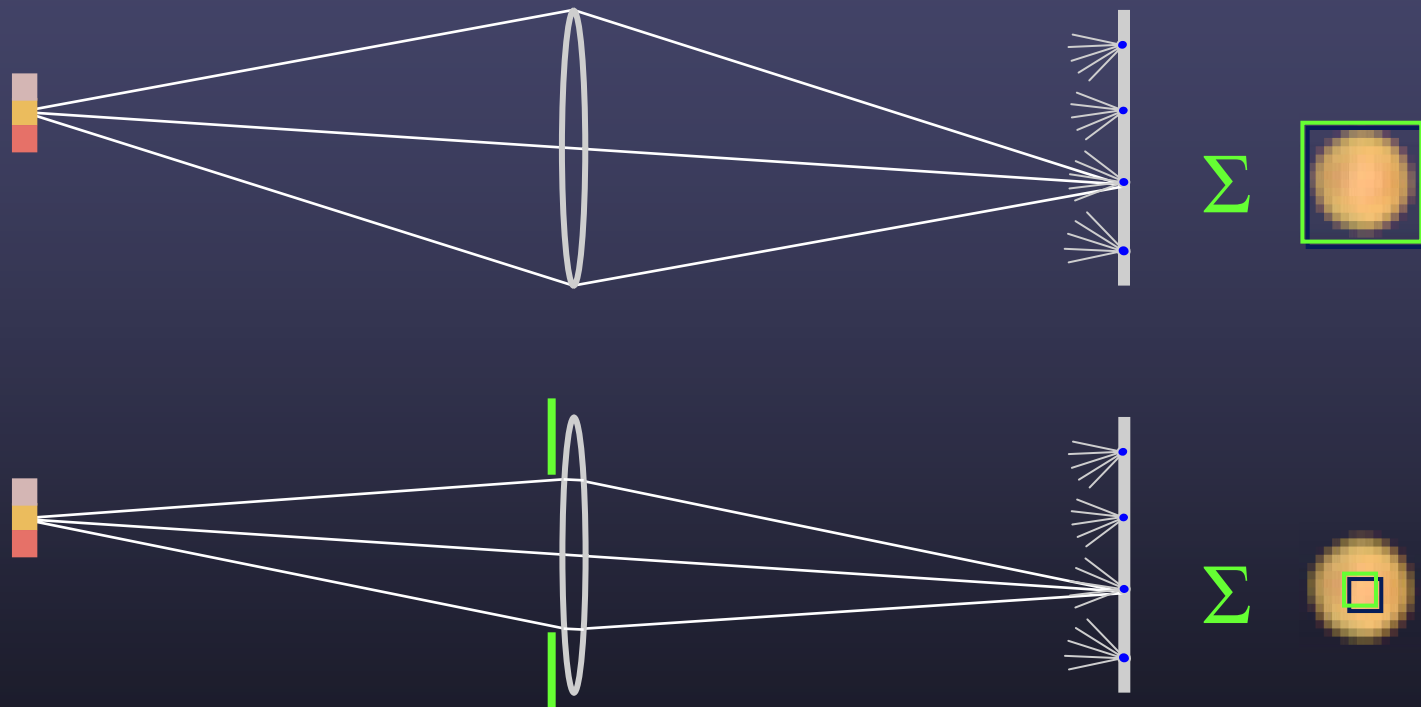
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- integral photography
  - microlens array + film
  - application is autostereoscopic effect
- [Adelson 1992]
  - proposed this camera
  - built an optical bench prototype using relay lenses
  - application was stereo vision, not photography



# Digitally stopping-down

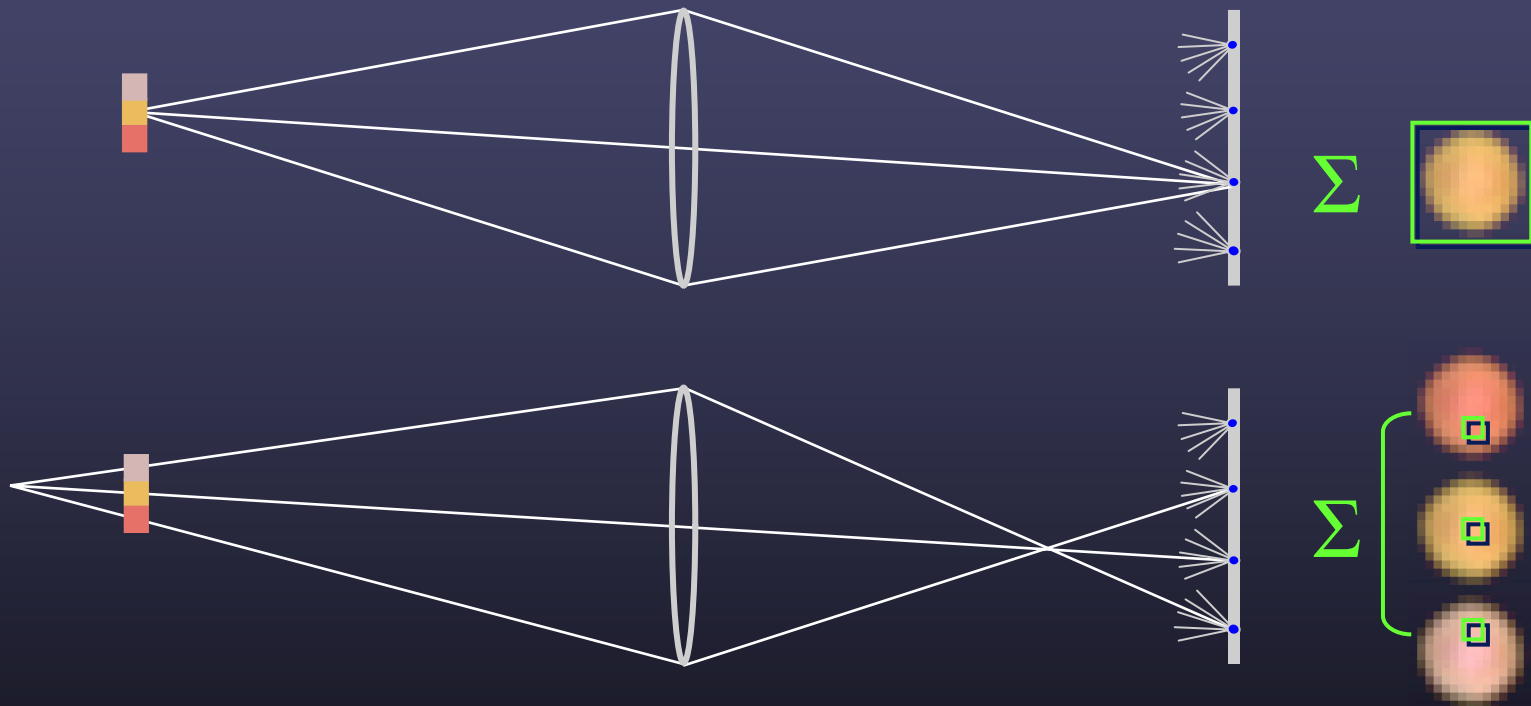
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- stopping down = summing only the central portion of each microlens

# Digital refocusing

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- refocusing = summing windows extracted from several microlenses

# A digital refocusing theorem

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- an  $f / N$  light field camera, with  $P \times P$  pixels under each microlens, can produce views as sharp as an  $f / (N \times P)$  conventional camera

— *or* —

- it can produce views with a shallow depth of field ( $f / N$ ) focused anywhere within the depth of field of an  $f / (N \times P)$  camera

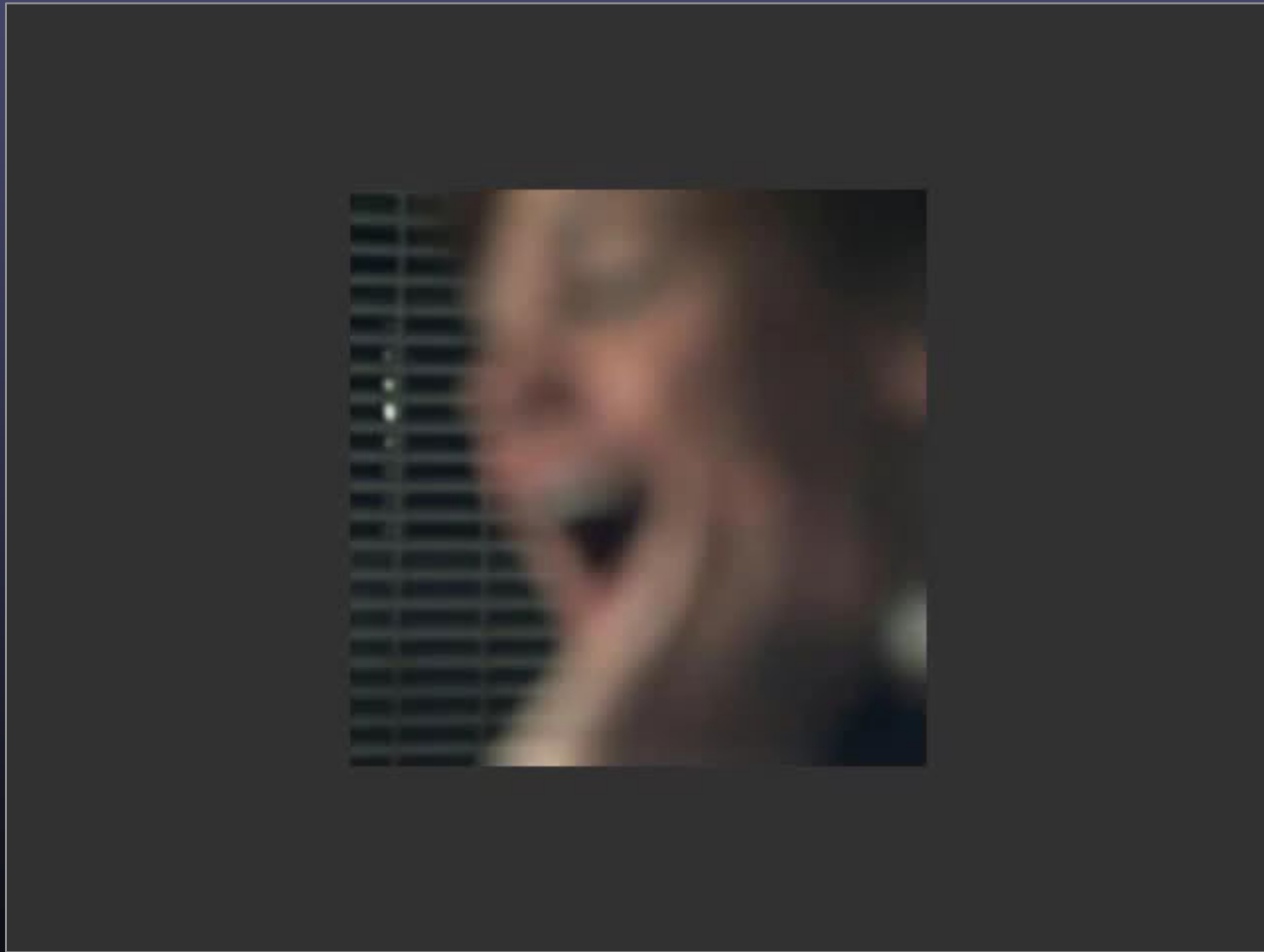
# Example of digital refocusing

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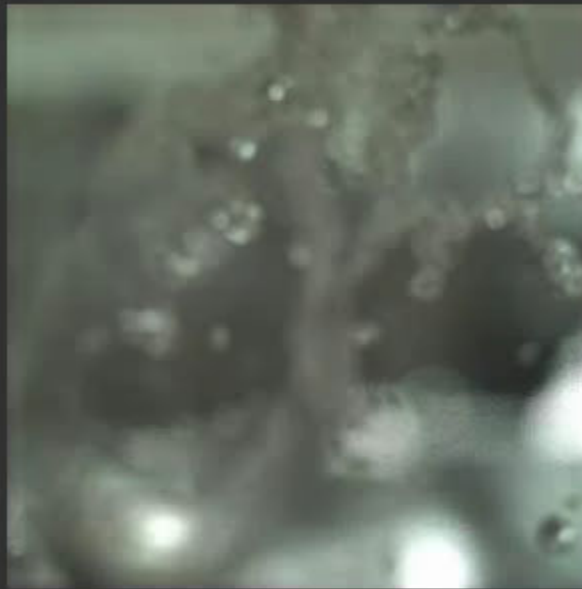
# Refocusing portraits

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# Action photography

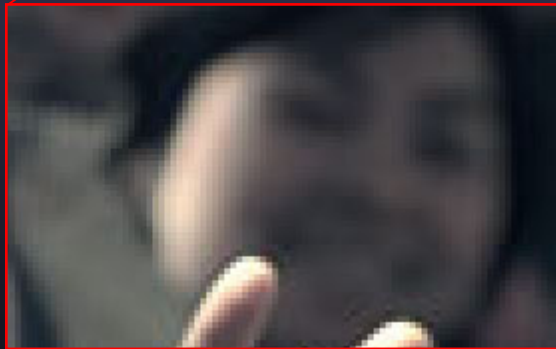
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**Focusing through a splash of water**



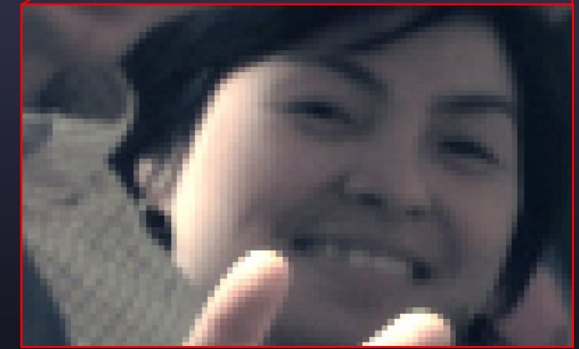
# Extending the depth of field



conventional photograph,  
main lens at  $f/4$



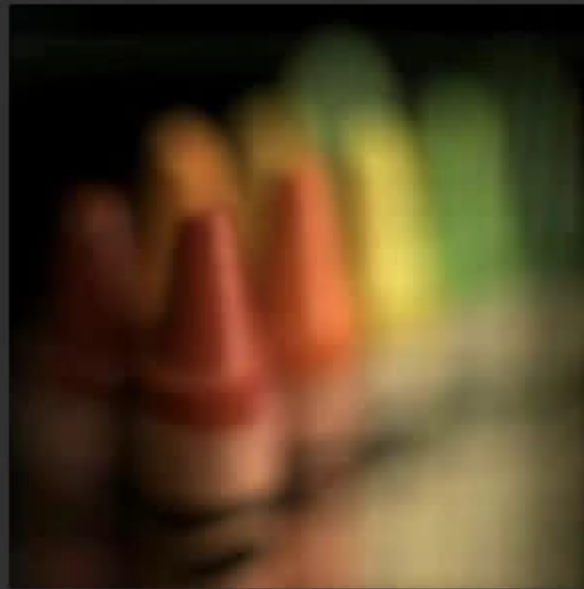
conventional photograph,  
main lens at  $f/22$



light field, main lens at  $f/4$ ,  
after all-focus algorithm  
[Agarwala 2004]

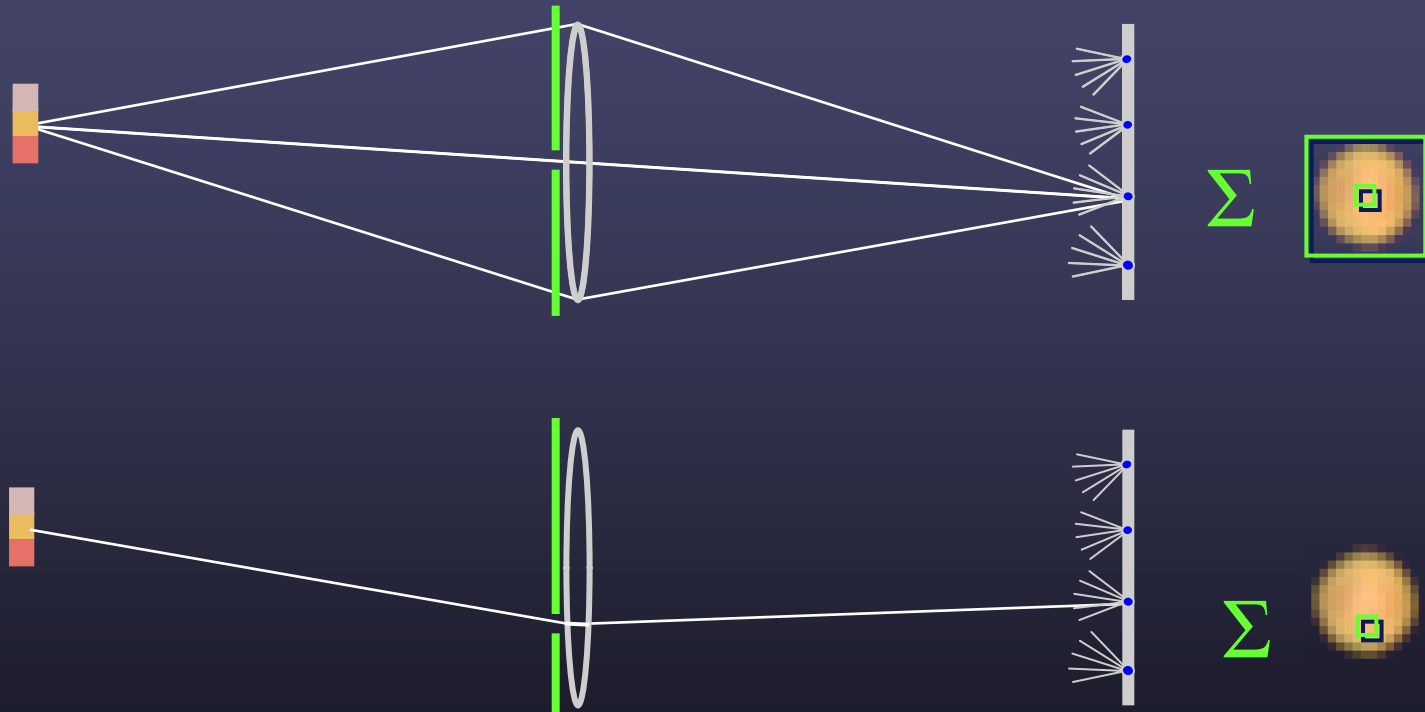
# Macrophotography

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# Digitally moving the observer

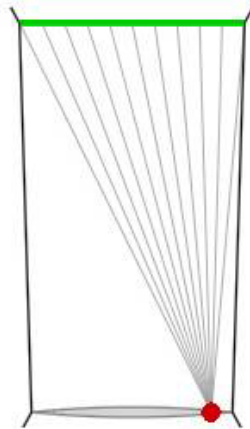
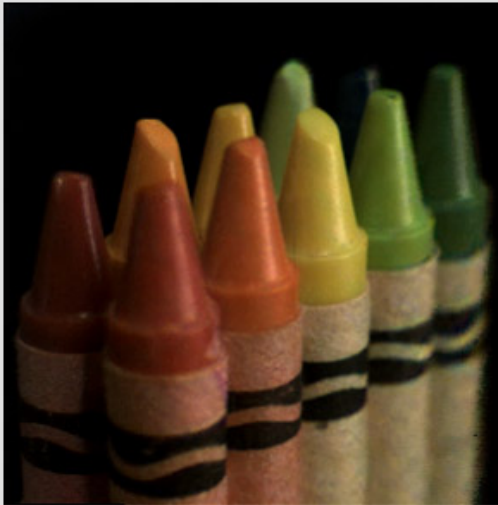
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- moving the observer = moving the window we extract from the microlenses

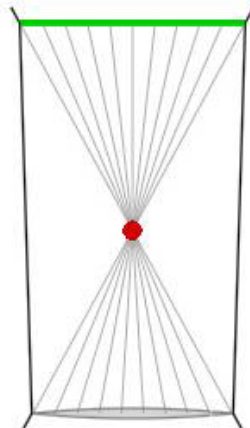
# Example of moving the observer

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# Moving backward and forward

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# Implications

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- cuts the unwanted link between exposure (due to the aperture) and depth of field
- trades off (excess) spatial resolution for ability to refocus and adjust the perspective
- sensor pixels should be made even smaller, subject to the diffraction limit

$$36\text{mm} \times 24\text{mm} \div 2.5\mu \text{ pixels} = 266 \text{ megapixels}$$

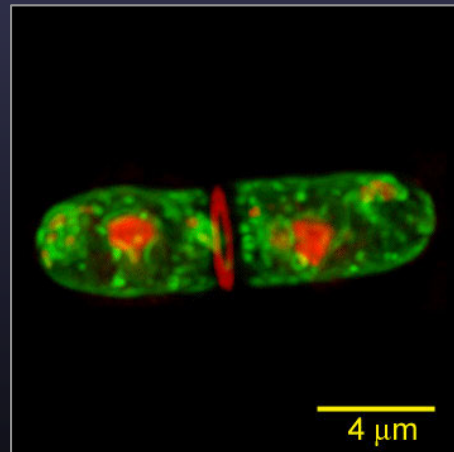
$$20\text{K} \times 13\text{K} \text{ pixels}$$

$$4000 \times 2666 \text{ pixels} \times 20 \times 20 \text{ rays per pixel}$$

# Can we build a light field microscope?

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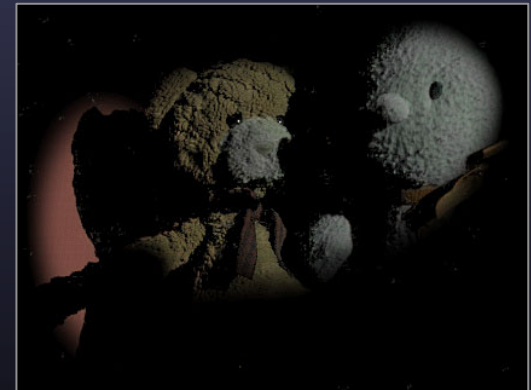
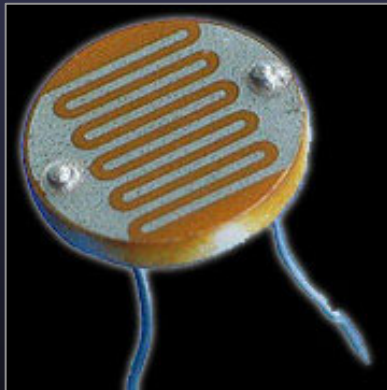
- ability to photograph moving specimens
- digital refocusing  $\rightarrow$  focal stack  $\rightarrow$  deconvolution microscopy  $\rightarrow$  volume data



# Dual Photography

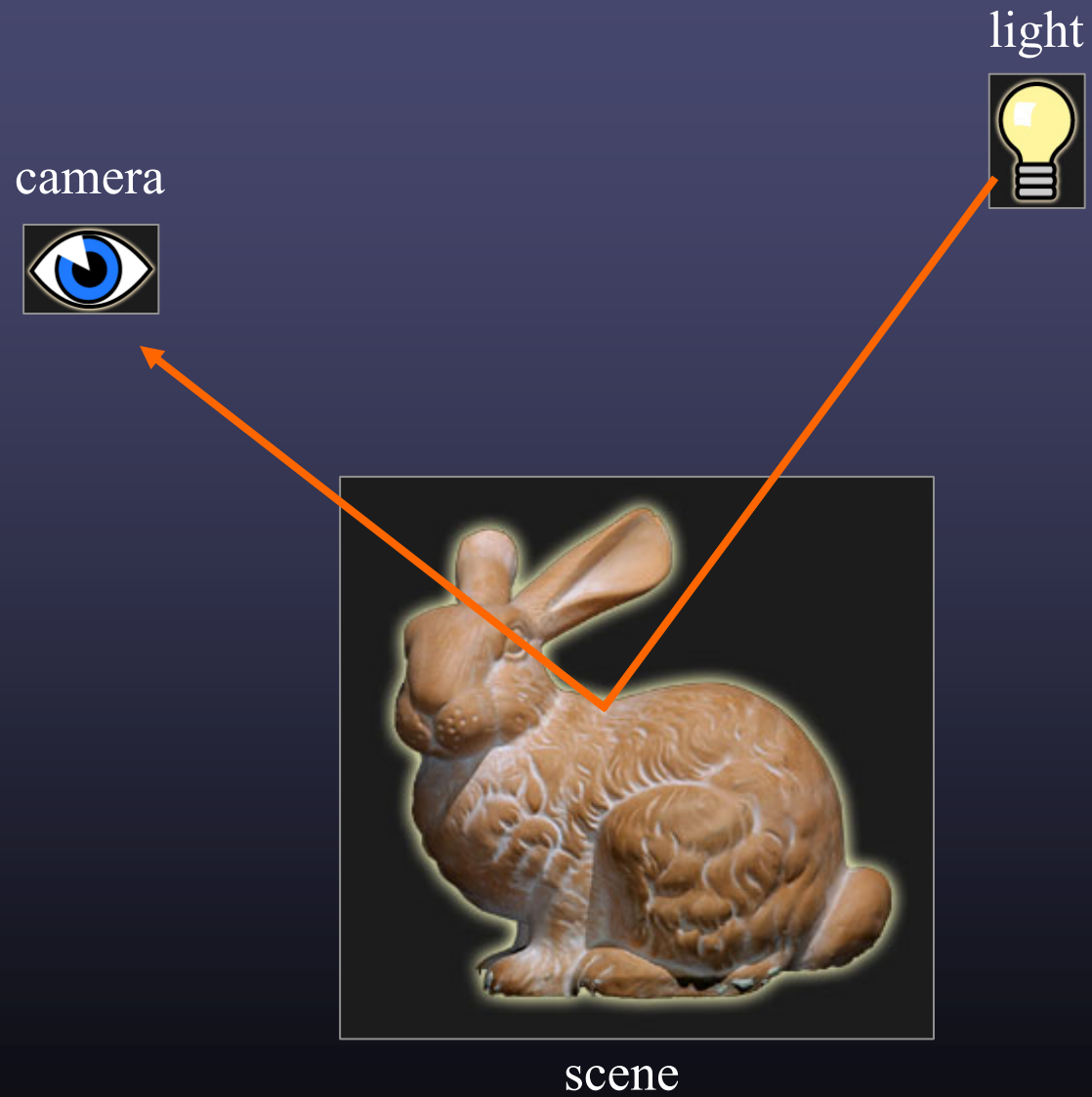
*Pradeep Sen, Billy Chen, Gaurav Garg, Steve Marschner,  
Mark Horowitz, Marc Levoy, Hendrik Lensch*

*(Proc. SIGGRAPH 2005)*

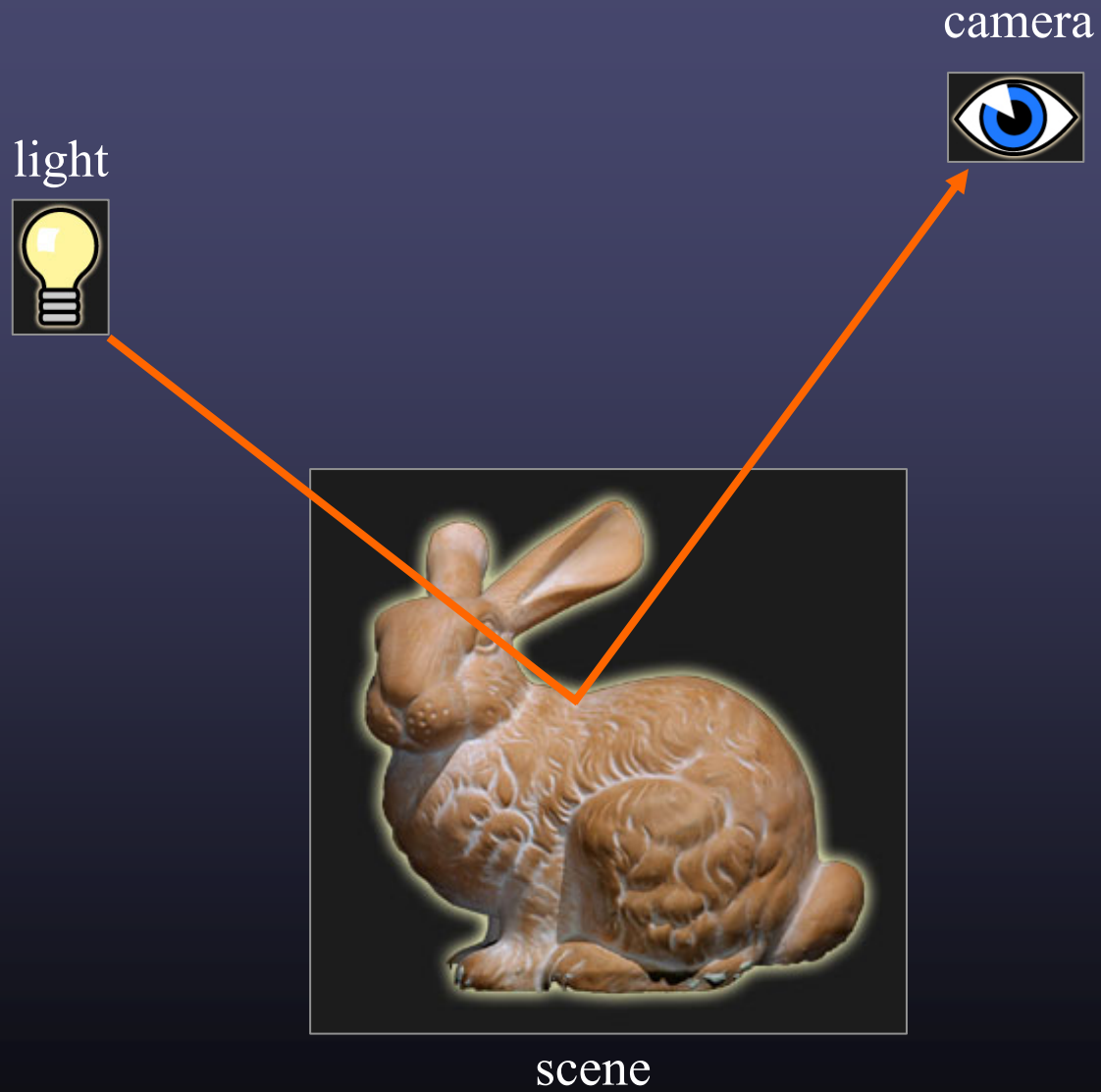




# Helmholtz reciprocity



# Helmholtz reciprocity

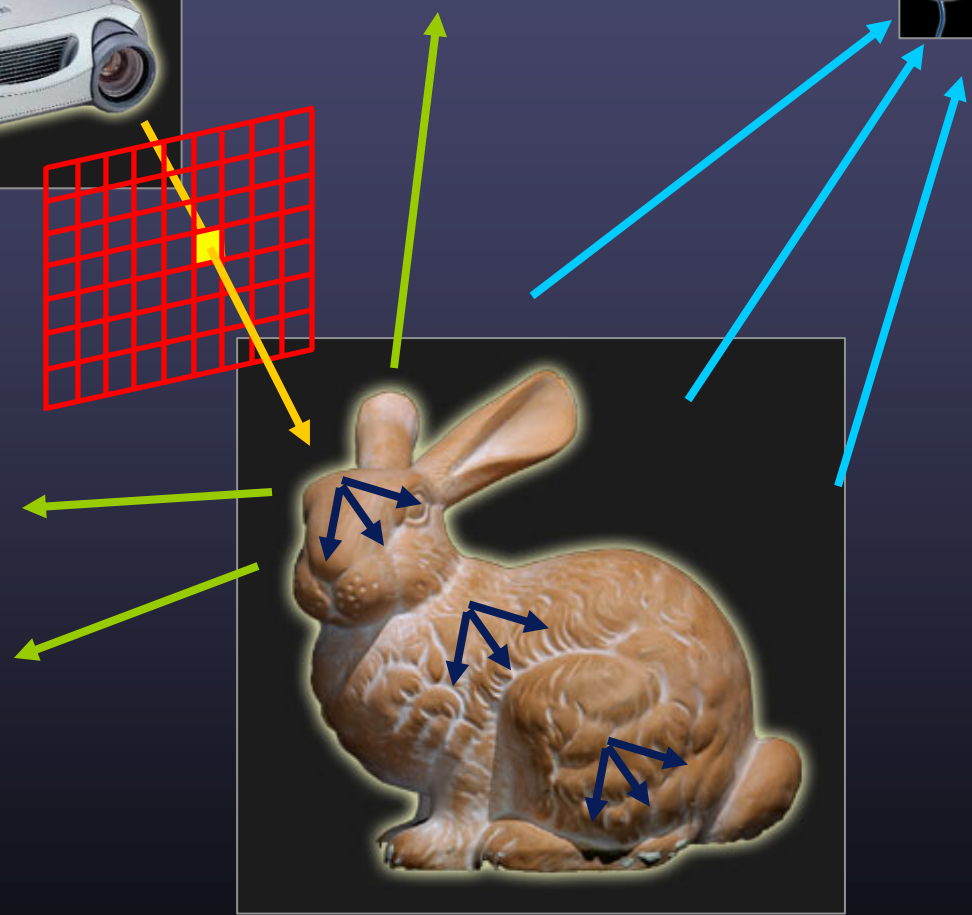
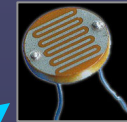


# Measuring transport along a set of paths

projector



photocell



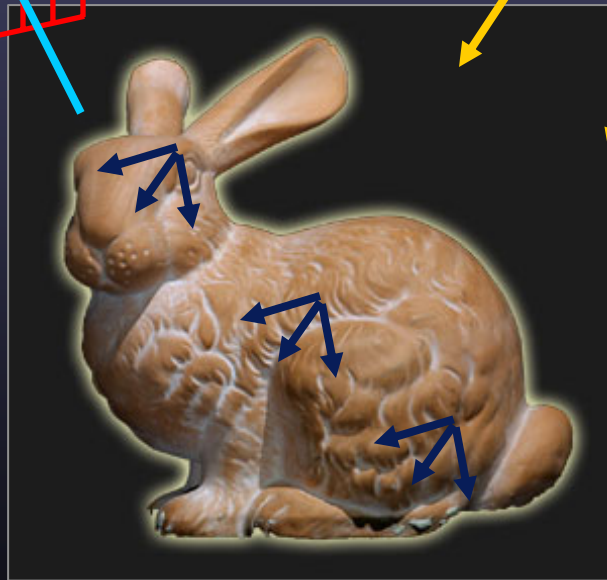
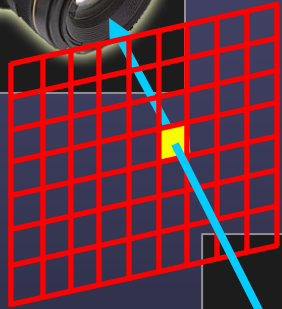
scene

# Reversing the paths

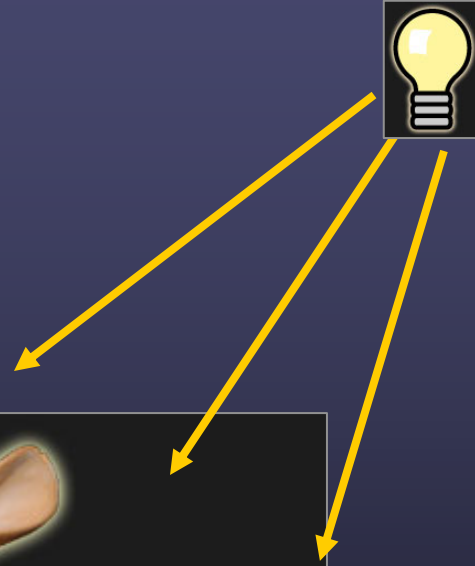
camera



point light

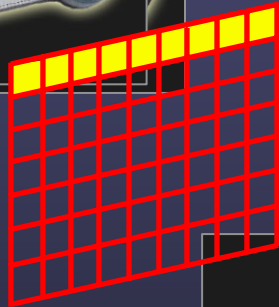


scene

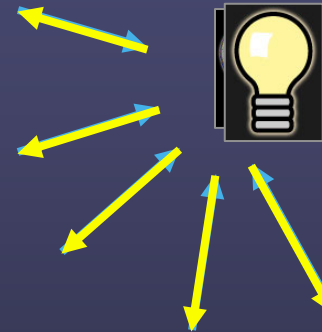


# Forming a dual photograph

“dual” camera  
projector



“dual” light  
projector



scene



# Forming a dual photograph

“dual” camera

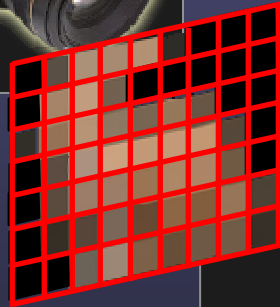
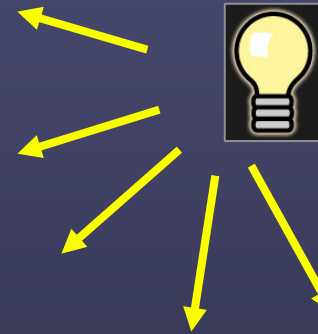


image of scene



scene

“dual” light

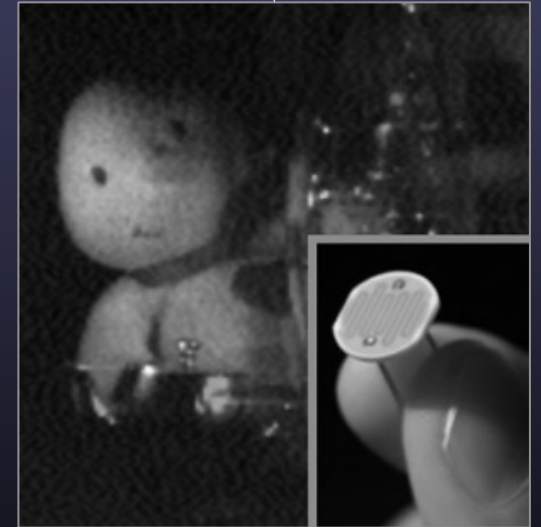


# Physical demonstration

- light replaced with projector
- camera replaced with photocell
- projector scanned across the scene



conventional photograph,  
with light coming from right



dual photograph,  
as seen from projector's position  
and as illuminated from photocell's position

# Related imaging methods

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- time-of-flight scanner
  - if they return reflectance as well as range
  - but their light source and sensor are typically coaxial
- scanning electron microscope



Velcro® at 35x magnification,  
Museum of Science, Boston

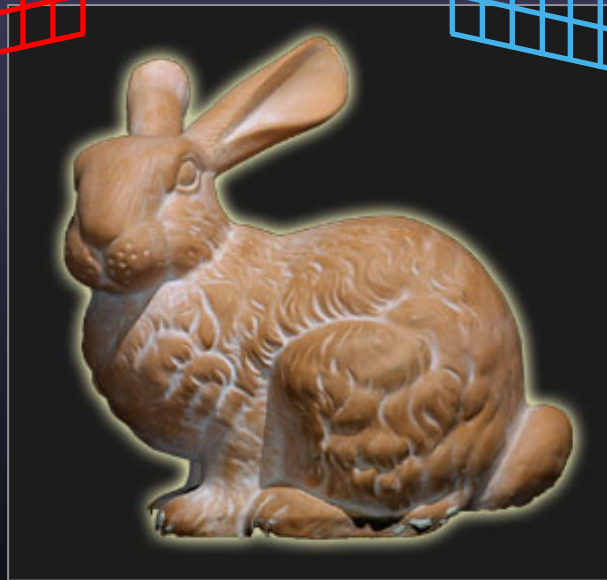
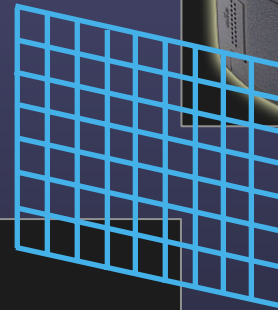
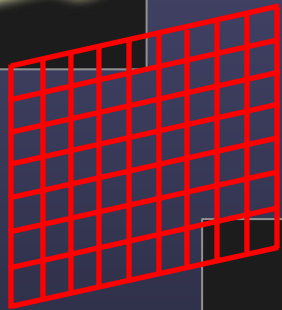


# The 4D transport matrix

projector



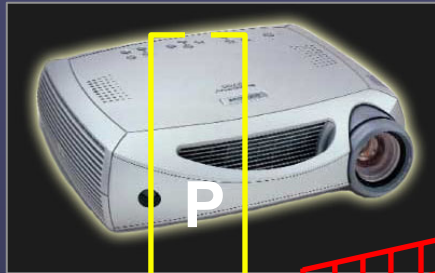
photocall



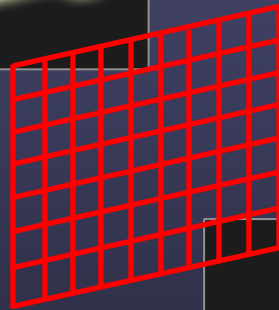
scene

# The 4D transport matrix

projector



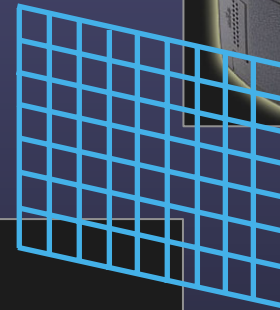
$pq \times 1$



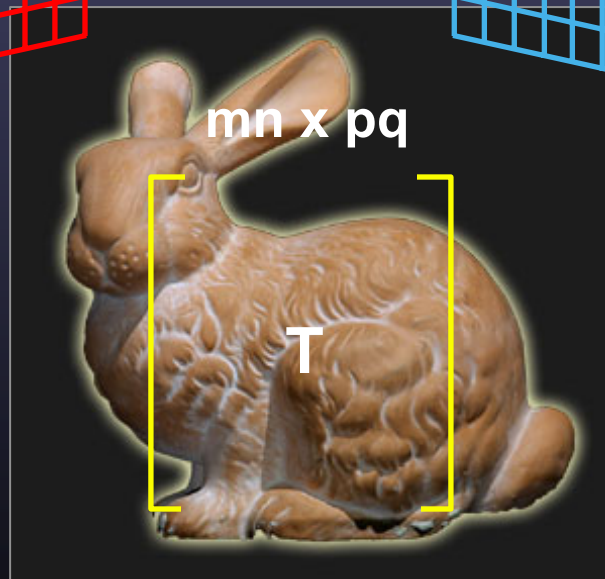
camera



$mn \times 1$



$mn \times pq$



scene

# The 4D transport matrix

$$\begin{array}{c} \left[ \begin{array}{c} \mathbf{C} \end{array} \right] \\ mn \times 1 \end{array} = \begin{array}{c} mn \times pq \\ \left[ \begin{array}{c} \mathbf{T} \end{array} \right] \end{array} \begin{array}{c} \left[ \begin{array}{c} \mathbf{P} \end{array} \right] \\ pq \times 1 \end{array}$$

# The 4D transport matrix

$$\begin{array}{c} \left[ \begin{array}{c} \\ \\ \\ \\ \end{array} \right] \\ \text{C} \\ \text{mn} \times 1 \end{array} = \begin{array}{c} \text{mn} \times \text{pq} \\ \left[ \begin{array}{c} \\ \\ \\ \\ \end{array} \right] \\ \text{T} \end{array} \begin{array}{c} \left[ \begin{array}{c} 1 \\ 0 \\ 0 \\ 0 \\ 0 \end{array} \right] \\ \text{pq} \times 1 \end{array}$$

# The 4D transport matrix

$$\begin{array}{c} \boxed{C} \\ mn \times 1 \end{array} = \begin{array}{c} mn \times pq \\ \boxed{\begin{array}{c} \text{dotted} \\ \text{orange} \end{array}} \\ \end{array} \begin{array}{c} T \\ pq \times 1 \end{array} \begin{array}{c} \boxed{\begin{array}{c} 0 \\ 1 \\ 0 \\ 0 \\ 0 \end{array}} \\ pq \times 1 \end{array}$$

The diagram illustrates the equation  $C = T \cdot v$ . On the left, a vertical yellow bracket labeled  $C$  is associated with the dimensions  $mn \times 1$ . This is followed by an equals sign. In the middle, a vertical yellow bracket labeled  $T$  is associated with the dimensions  $mn \times pq$ . The matrix  $T$  is visually represented as a vertical column containing a dotted orange bar and a solid orange bar. To the right of  $T$  is another vertical yellow bracket labeled  $v$  with dimensions  $pq \times 1$ . This vector  $v$  is shown as a column of five elements: 0, 1, 0, 0, and 0.

# The 4D transport matrix

$$\begin{array}{c} \left[ \begin{array}{c} \text{C} \end{array} \right] \\ \text{mn} \times 1 \end{array} = \begin{array}{c} \text{mn} \times \text{pq} \\ \left[ \begin{array}{c} \text{T} \end{array} \right] \end{array} \begin{array}{c} \left[ \begin{array}{c} 0 \\ 0 \\ 1 \\ 0 \\ 0 \end{array} \right] \\ \text{pq} \times 1 \end{array}$$

# The 4D transport matrix

$$\begin{array}{c} \left[ \begin{array}{c} \mathbf{C} \end{array} \right] \\ mn \times 1 \end{array} = \begin{array}{c} mn \times pq \\ \left[ \begin{array}{c} \mathbf{T} \end{array} \right] \end{array} \begin{array}{c} \left[ \begin{array}{c} \mathbf{P} \end{array} \right] \\ pq \times 1 \end{array}$$

# The 4D transport matrix

$$\begin{array}{c} \left[ \begin{array}{c} \mathbf{C} \\ \hline \end{array} \right] \\ mn \times 1 \end{array} = \begin{array}{c} mn \times pq \\ \left[ \begin{array}{c} \mathbf{T} \\ \hline \end{array} \right] \end{array} \begin{array}{c} \left[ \begin{array}{c} \mathbf{P} \\ \hline \end{array} \right] \\ pq \times 1 \end{array}$$

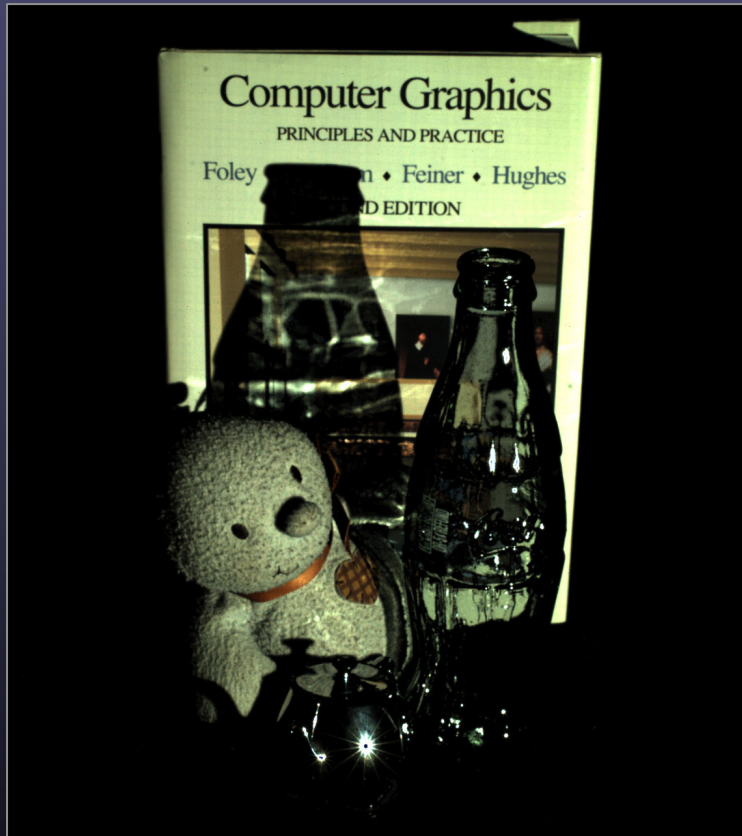
applying Helmholtz reciprocity...

$$\begin{array}{c} \left[ \begin{array}{c} \mathbf{C}' \\ \hline \end{array} \right] \\ pq \times 1 \end{array} = \begin{array}{c} pq \times mn \\ \left[ \begin{array}{c} \mathbf{T}^T \\ \hline \end{array} \right] \end{array} \begin{array}{c} \left[ \begin{array}{c} \mathbf{P}' \\ \hline \end{array} \right] \\ mn \times 1 \end{array}$$

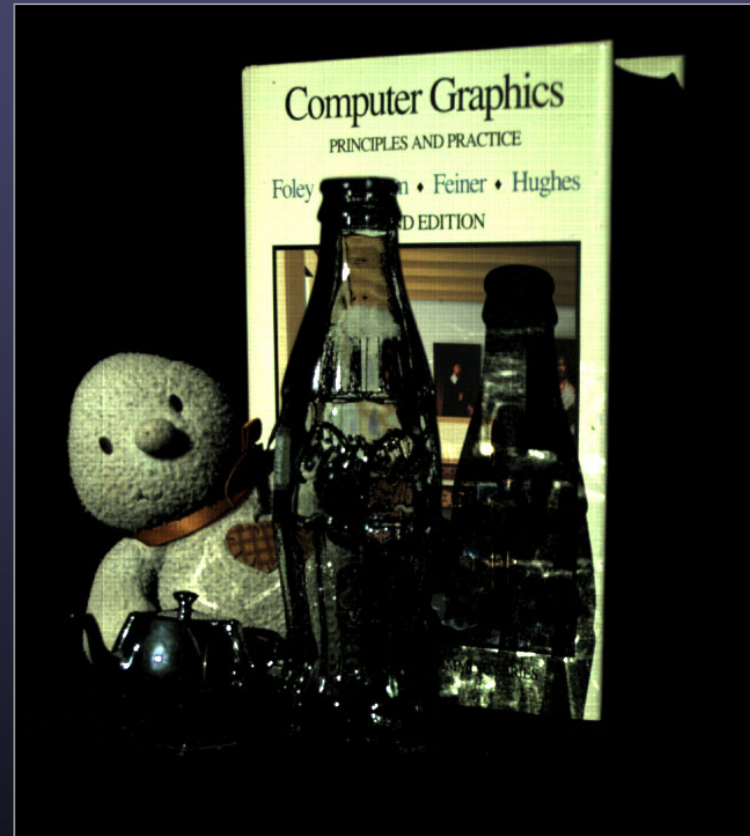


# Example

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conventional photograph  
with light coming from right



dual photograph  
as seen from projector's position

# Properties of the transport matrix

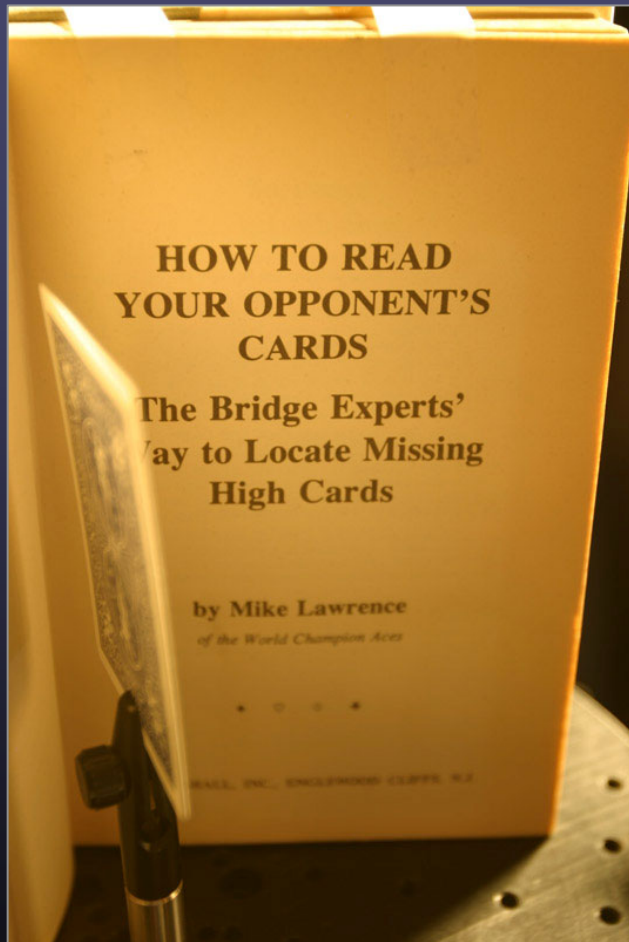
---

- little interreflection  $\rightarrow$  sparse matrix
- many interreflections  $\rightarrow$  dense matrix
- convex object  $\rightarrow$  diagonal matrix
- concave object  $\rightarrow$  full matrix

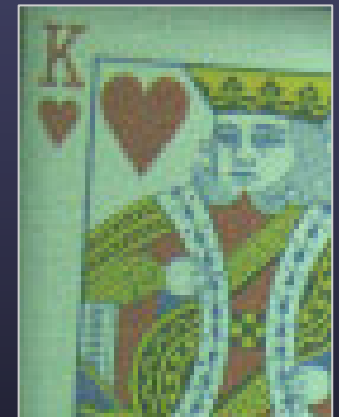
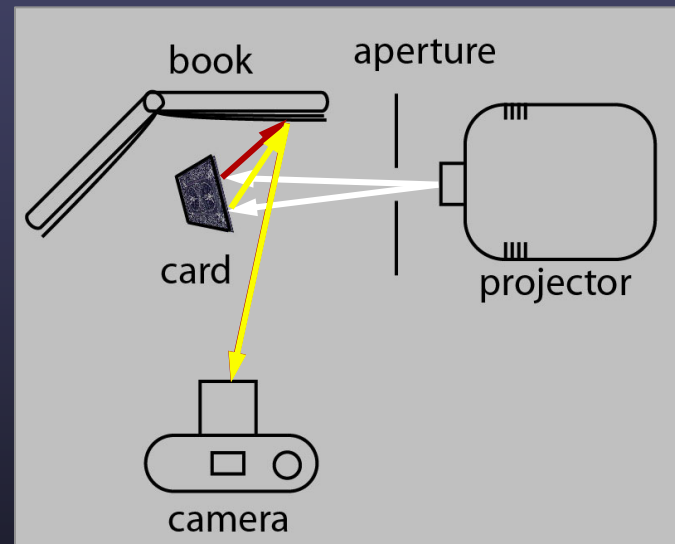
*Can we create a dual photograph entirely from diffuse reflections?*

# Dual photography from diffuse reflections

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the camera's view



# The relighting problem

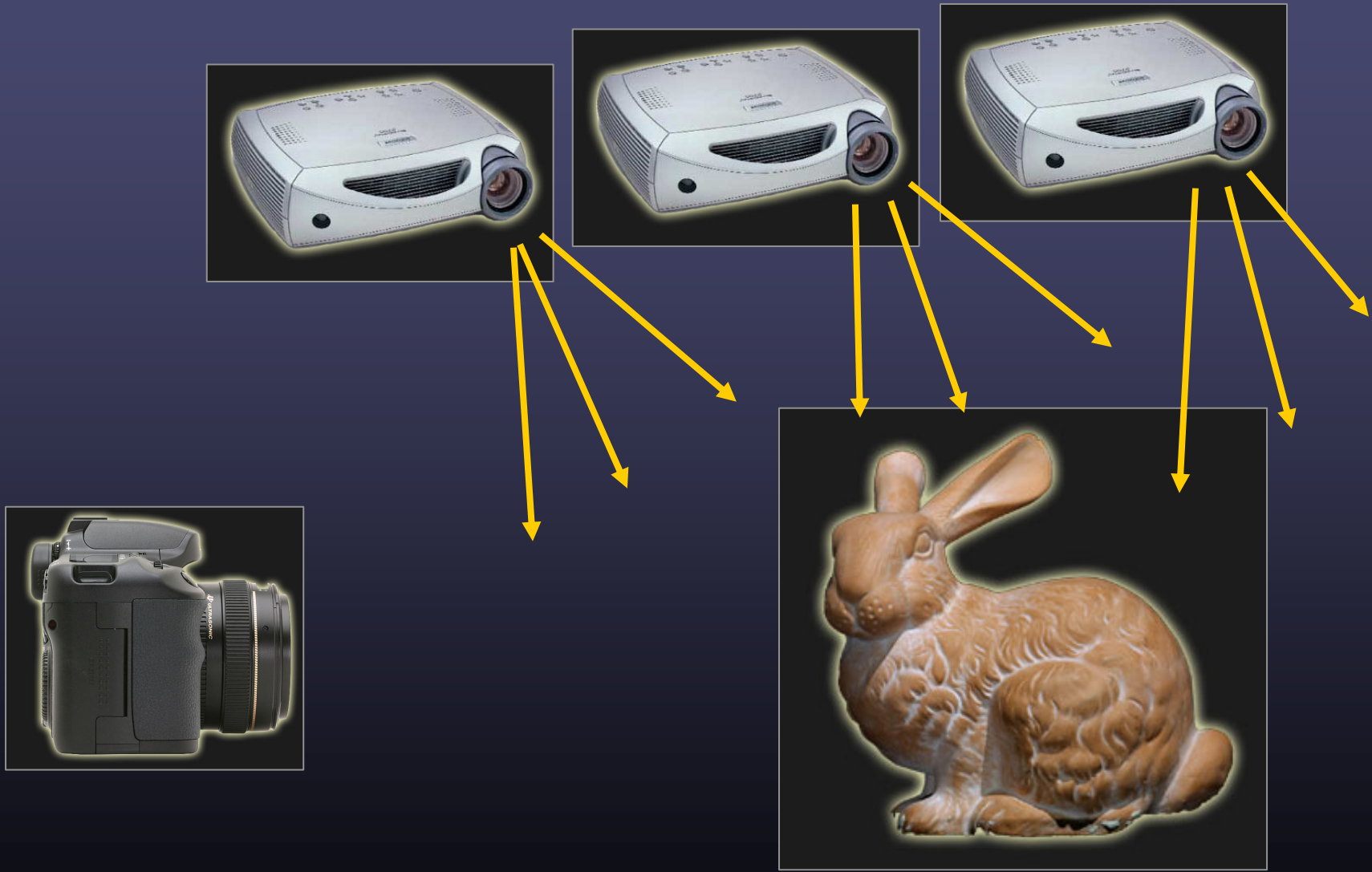
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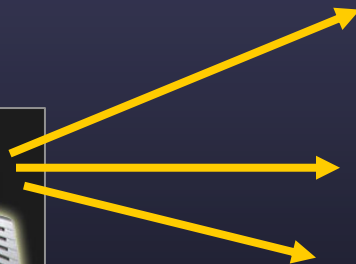
Paul Debevec's  
Light Stage 3

- subject captured under multiple lights
- one light at a time, so subject must hold still
- point lights are used, so can't relight with cast shadows

# The 6D transport matrix



# The 6D transport matrix



# The advantage of dual photography

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- capture of a scene as illuminated by different lights cannot be parallelized
- capture of a scene as viewed by different cameras can be parallelized

# Measuring the 6D transport matrix

projector



cameraarray



scene



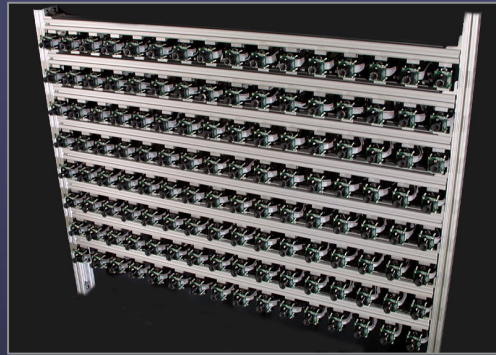


# Relighting with complex illumination

projector



camera array



scene

$$\begin{matrix} & & pq \times mn \times uv \\ \left[ \begin{matrix} C' \end{matrix} \right] & = & \left[ \begin{matrix} T^T \end{matrix} \right] \left[ \begin{matrix} P' \end{matrix} \right] \\ pq \times 1 & & mn \times uv \times 1 \end{matrix}$$

- step 1: measure 6D transport matrix  $T$
- step 2: capture a 4D light field
- step 3: relight scene using captured light field

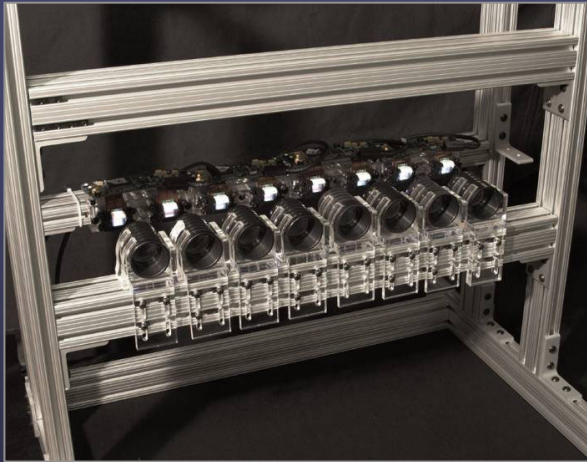
# Running time

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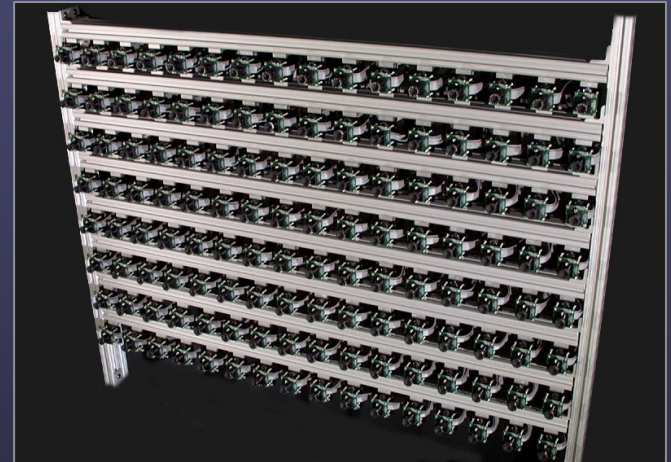
- the different rays within a projector can in fact be parallelized to some extent
- this parallelism can be discovered using a coarse-to-fine adaptive scan
- can measure a 6D transport matrix in 5 minutes

# Can we measure an 8D transport matrix?

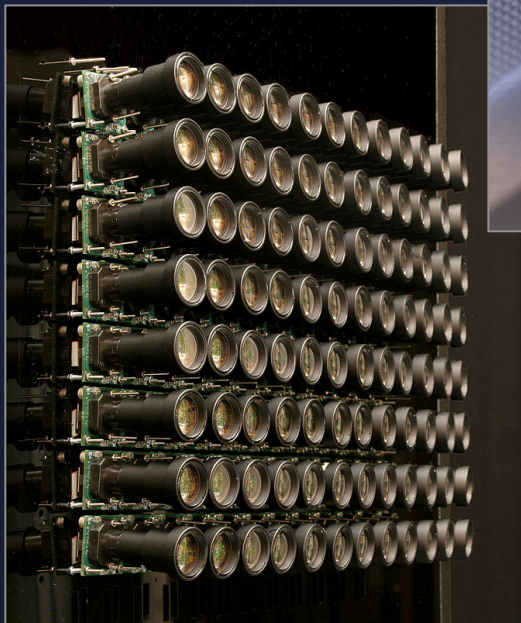
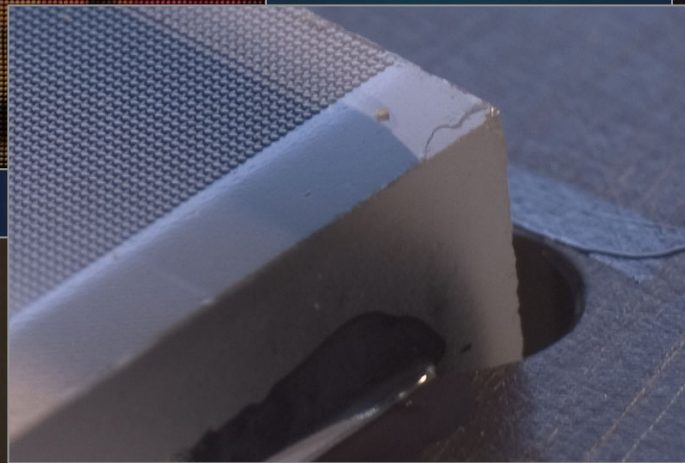
projector array



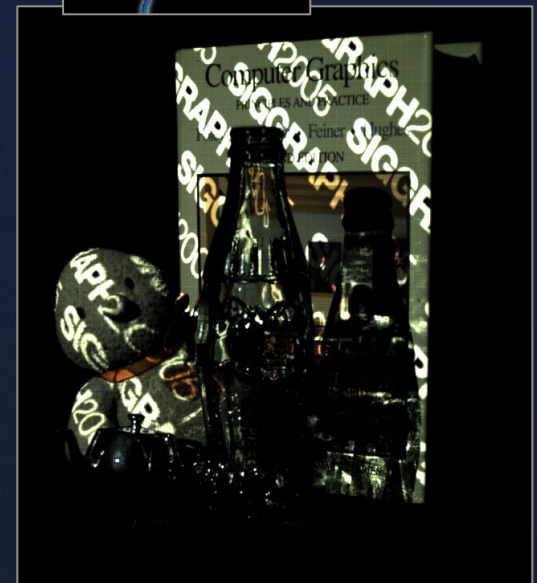
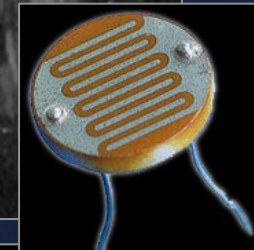
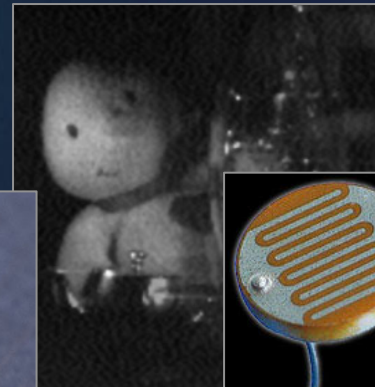
camera array



scene



$$\begin{bmatrix} C \\ mn \times 1 \end{bmatrix} = \begin{bmatrix} T \\ mn \times pq \end{bmatrix} \begin{bmatrix} P \\ pq \times 1 \end{bmatrix}$$



<http://graphics.stanford.edu>