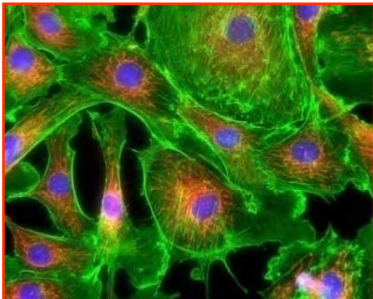


# Computational Photography

--- La photographie computationnelle ---

Frank NIELSEN



 Ecole Polytechnique   
Sony Computer Science Laboratories, Inc  
Jeudi 13 Mars 2008



# Copyrights

## Disclaimer:

In the following slides, **all trademarks and copyrights** are held by **respective owners**.

In particular,

IEEE copyright rules apply (ICCV, CVPR, etc.)

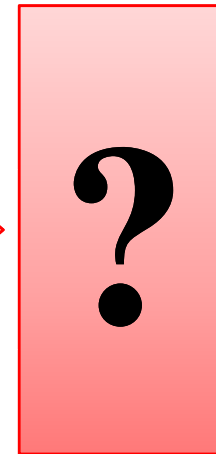
ACM copyright rules apply (SIGGRAPH, etc.)

# Introduction

Let's start with *concrete* examples of “Computational Photography” before defining its *scope* and *methodologies*.



Photography



Computational Photography

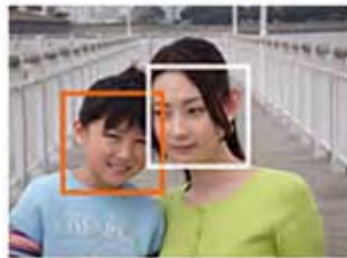
# Introduction: Digital Still Cameras (DSCs)

But first, let's review today's  
DSC Consumer market (March 2008)



Novelties

Expected



# Introduction: What's computational photography?

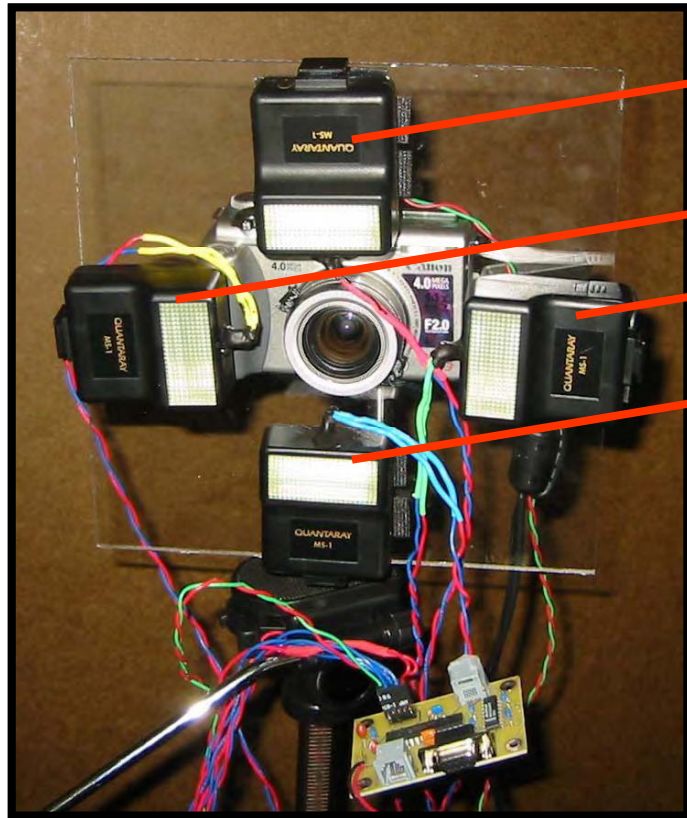
## Example 1

### Non Photo Realistic Camera

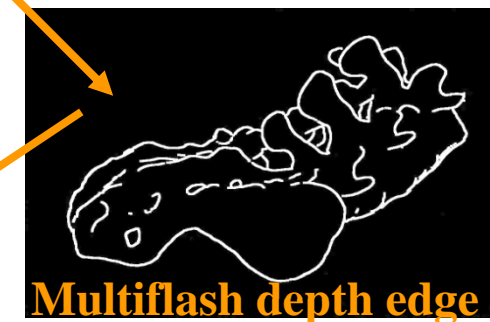
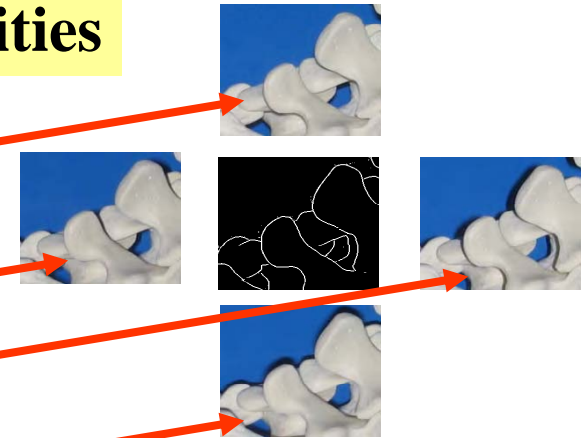
*NPR*

# Warm up: Nonphotorealistic camera (NPR camera)

Multiple flashes to easily get depth discontinuities



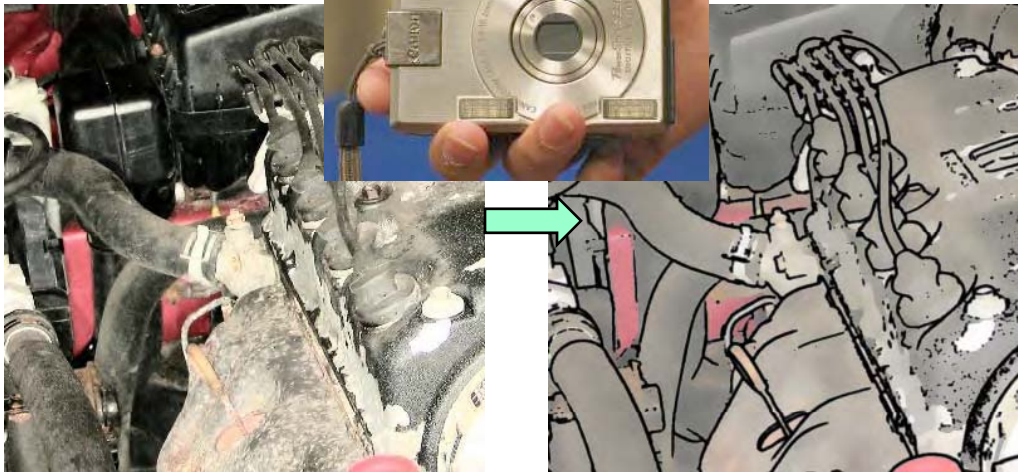
Baseline 50mm (depth 5mm at 2 meters)



# Warm up: Nonphotorealistic (NPR) camera



**Nonphotorealistic filter**



Intensity edge  $\neq$  depth edge

## Drawbacks:

- *textured background* required
- does not work for *highly specular objects*
- *baseline*

# Warm up: Nonphotorealistic (NPR) camera

Laparoscope camera with two fiber optics lighting



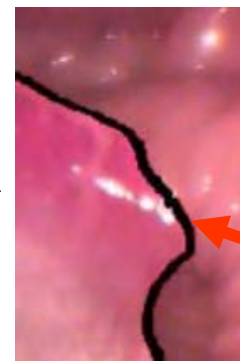
Shadow to the right



Shadow to the left



Difficult to analyze using traditional image processing techniques



Remove shadows, **show lesion** from depth discontinuity analysis



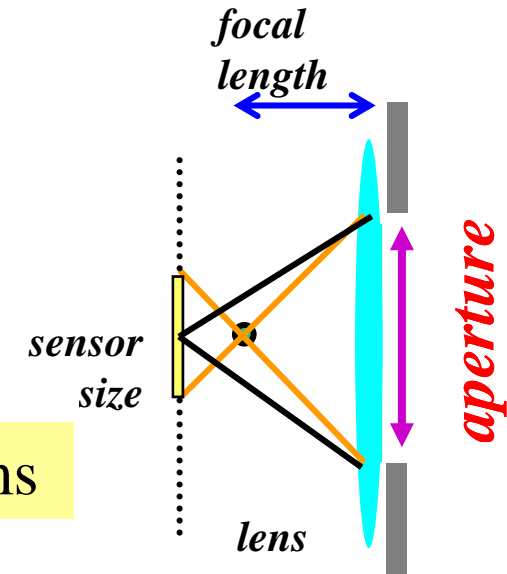
**Introduction: What's computational photography?**

# Example 2

Synthetic Aperture Focusing Camera

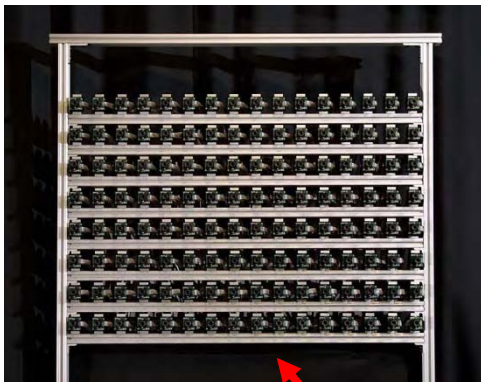
*SAF*

# Warm up: Synthetic aperture focusing camera (SAF)



Aperture means *beyond* pinhole camera algorithms

(💡 SAF camera: *1-shot many images!*)



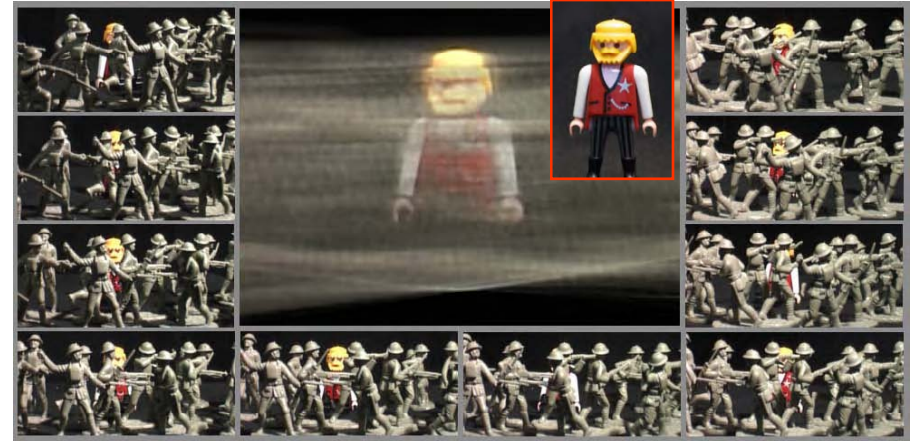
Camera array provides many individual apertures → **synthetic aperture focusing**

# Warm up: Synthetic aperture focusing

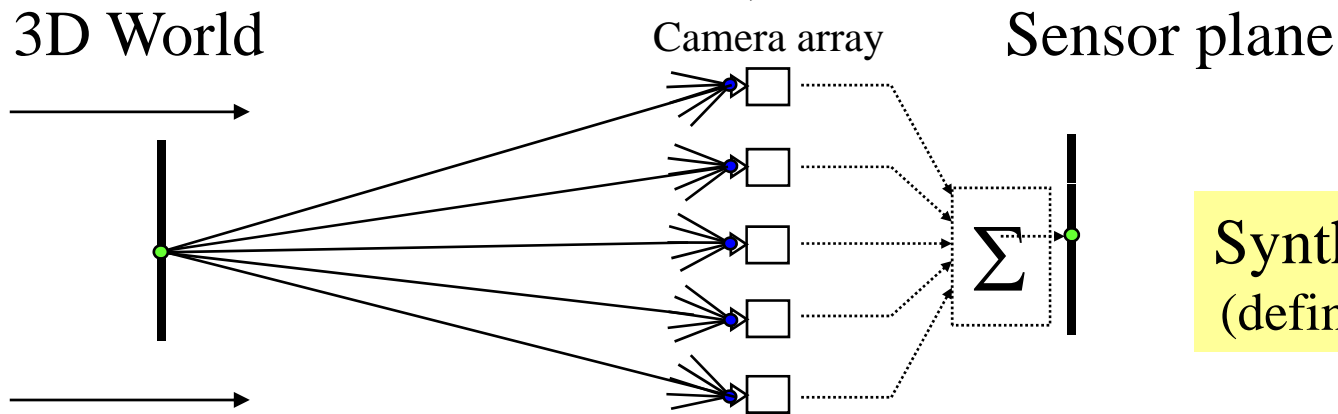
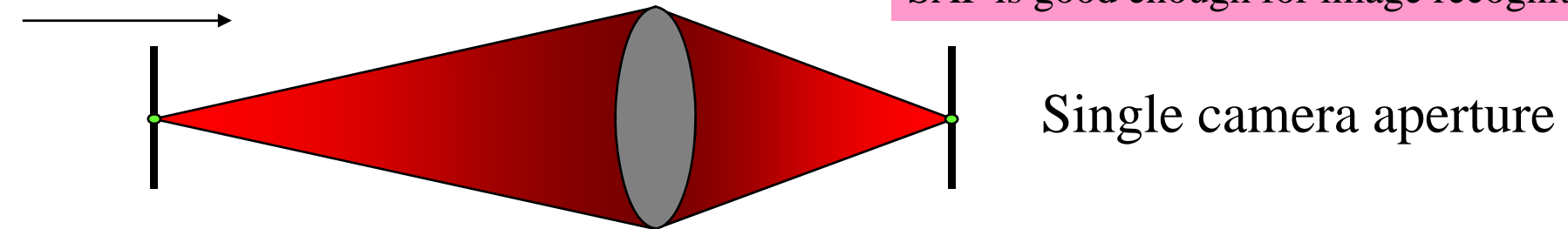
camera (SAF)



Synthetic aperture focusing



SAF is good enough for image recognition



Synthetic aperture  
(define a focal plane)

+Bonus: Averaging multiple images **also improve** Signal-to-Noise ratio (SNR)

# **Introduction: What's computational photography?**

## **Example 3** **(De)weathering Camera**

# Warm up: (De)weathering



(a) A scene with rain



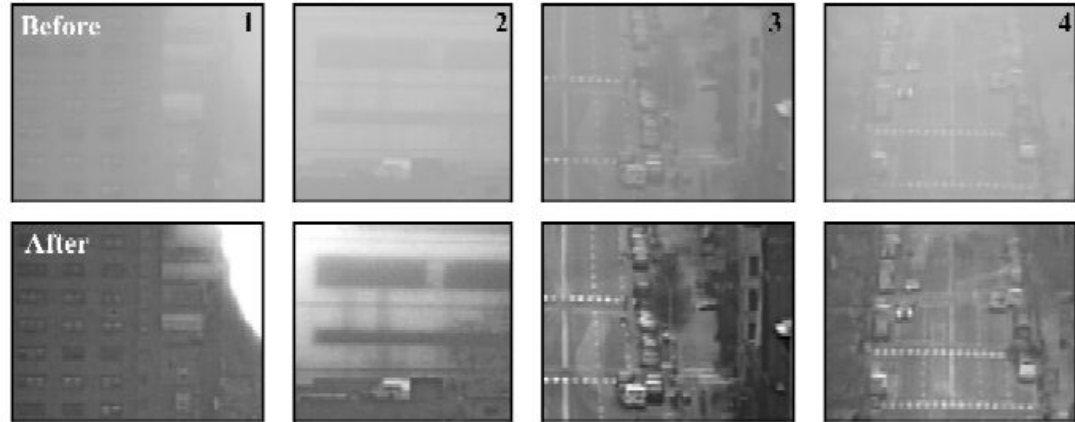
(b) Reducing rain



(c) A scene with rain



(d) Enhancing rain



Removing or adding **weather artifacts** (like fog or rain) in images  
→ **Image enhancer** with many applications (tele-surveillance, etc)

# Introduction: What's computational photography?

## Example 4 Sur-realistic Camera (Gradient camera)

*NPR*

# Warm up: Reilluminating by image fusion



Surrealistic image  
→Easier to understand



**Context enhancement** by image processing.  
Fusion of a scene under different illuminations  
(←Gradient image manipulation)



Empire of light (Magritte)

# Warm up: Reilluminating by image fusion

---

**Algorithm 1** Basic algorithm

---

```
for each input image  $I_i$  do
  Find gradient field  $G_i = \nabla I_i$ 
  Compute importance image  $W_i$  from  $|G_i|$ 
end for
for each pixel (x,y) do
  Compute mixed gradient field  $G(x,y) =$ 
   $\sum_i W_i(x,y)G_i(x,y) / \sum_i W_i(x,y)$ 
end for
Reconstruct image  $I'$  from gradient field  $G$ 
Normalize pixel intensities in  $I'$  to closely match  $\sum_i W_i I_i$ 
```

---

Basic idea is to build  
a mixed gradient image  
from which we reconstruct  
the merged image.

Day

Day+Night

Night



# **Introduction: What's computational photography?**

## **Example 5**

### **Shape-Time Camera**

**(Depict the world)**

# Warm up: Depicting the world



(a)



(b)



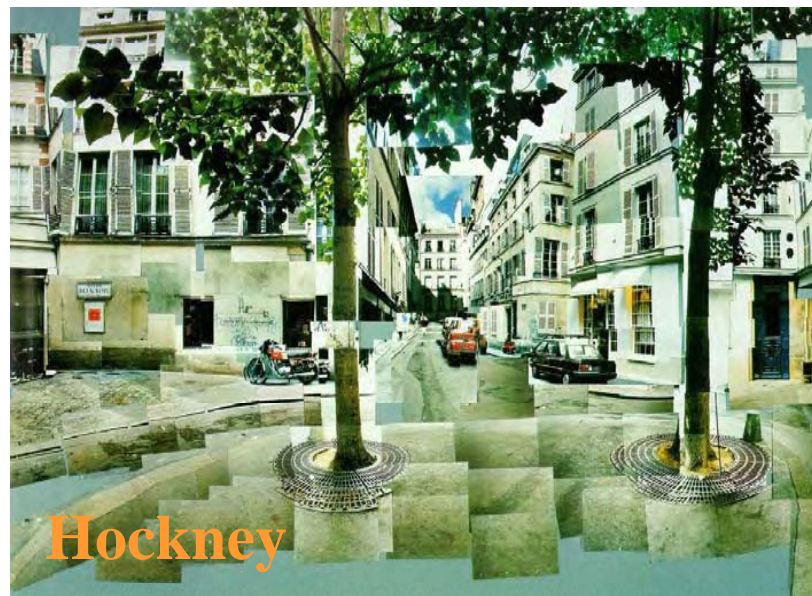
(c)



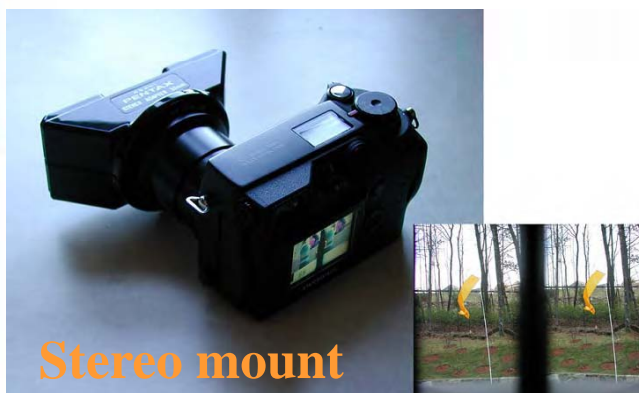
(d)



Picasso



Hockney



Stereo mount

**Depict world in new ways:**  
Shape-time photography

(burst-mode on stereo adaptor)

**Depiction**

# Warm up: Shape-Time photography



(a)



←Based on a probabilistic framework computed via **belief propagations** (BP)

# Introduction

So... what's **C**omputational **P**hotography ?

# Wrapping-up: Multifacets of Comp. Photography



Recap of our 5 examples:

1. NPR Flash (H/W+S/W)
2. Synthetic Aperture Focusing (H/W+S/W)
3. (De)weathering (S/W)
4. NPR Reillumination (S/W)
5. Shape-time photography (H/W+S/W)

**Computational Photography is:**

*A rich variety of techniques:*

- **Novel hardware/software camera combinations.**
- **New generation of image processing techniques**

→ **Creativity is key to success!**



# Computational Photography: Flash back.

History of photography is *fascinating* but would take too long here...



Joseph Niepce (1825)  
8 hours exposure

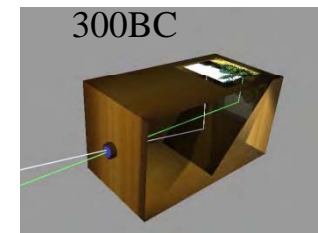


Louis Ducos du Hauron (1872)



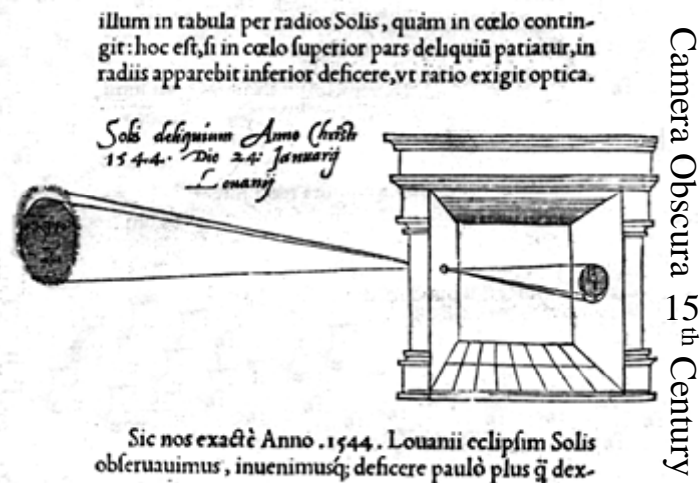
Sony Mavica (1981)  
First Electronic still camera

From *camera obscura* to nowadays' digital camera, the process of taking pictures has improved but ...remains **essentially the same**...

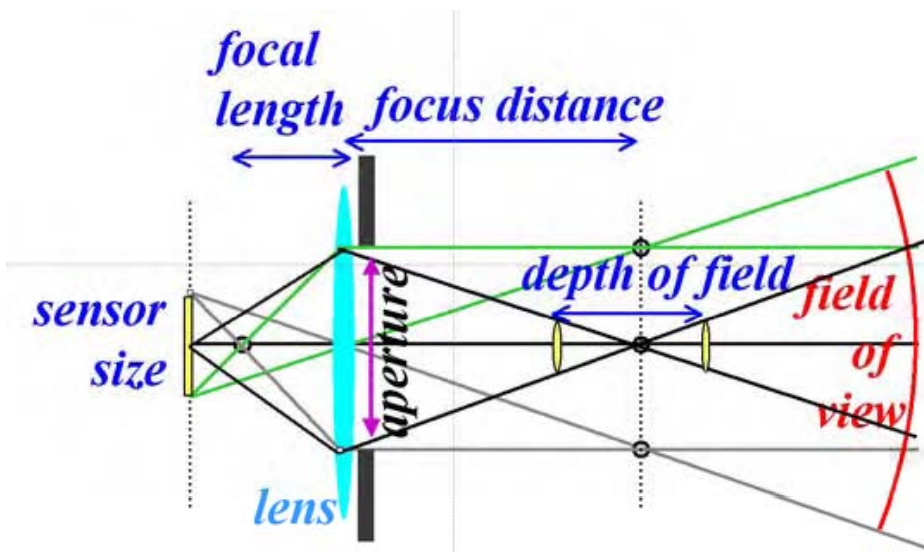


→ **Photography HAS BEEN full of trade-offs !!!**

# Computational Photography: Photo parameters



Camera obscura



Nowadays' cameras

- **Focal length** (in mm)
  - Determines the field of view.  
wide angle (<30mm) to  
telephoto(>100mm)
- **Focusing distance**
  - Which distance in the scene is sharp
- **Depth of field**
  - zone around the focus distance that is sharp
- **Aperture** (in f number)
  - Ratio of used diameter and focal lens.  
Number under the divider
  - → small number = large aperture  
(e.g. f/2.8 is a large aperture,  
f/16 is a small aperture)
- **Shutter speed** (in % second)
  - Reciprocity relates shutter speed and aperture
- **Sensitivity** (in ISO)
  - Linear effect on exposure
  - 100 ISO is for bright scenes,
  - 1600 ISO is for dark scenes

# Computational Photography

1<sup>st</sup> goal of computational photography is to *remove* camera limitations:

## Current DSC

- Focal length
- Focusing distance
- Depth of field
- Aperture
- Shutter speed
- Sensitivity



## Ideal DSC

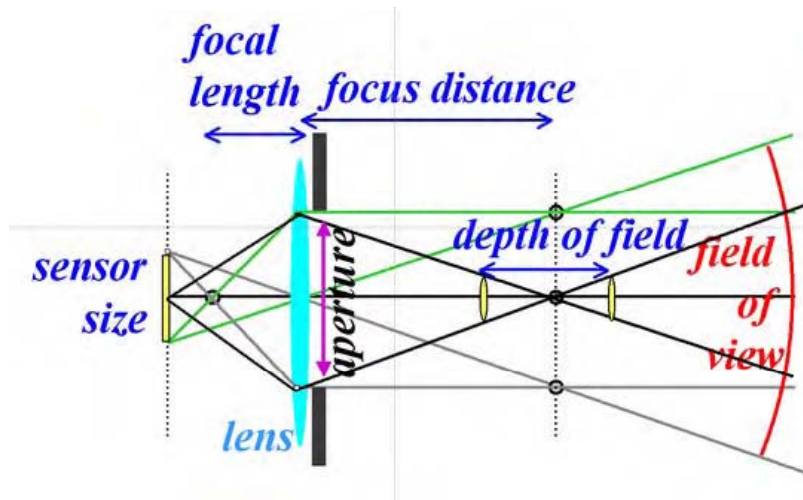
- Complete field of view (fov)
- Sharp image everywhere (dof)
- Noiseless image (iso)
- Bright image never saturated (dr)

→ Lets see how to override trade-offs!



## Removing Trade-off Field of View (fov)

# Overriding Trade-offs... field of views



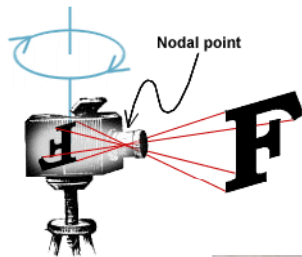
24mm  
(wide angle)



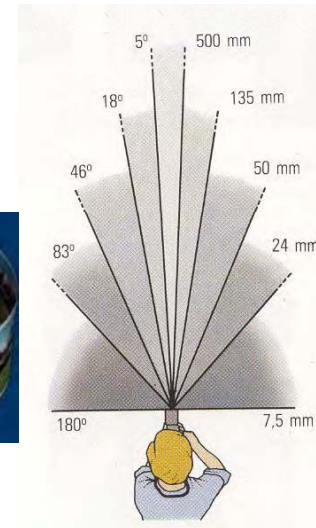
50 mm  
(standard)



135 mm  
(telephoto)



We override field of view limits by **stitching** several pictures

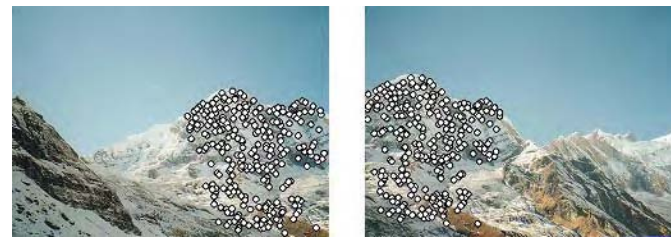


Quicktime VR - an image-based approach to virtual environment navigation. SIGGRAPH 1995  
Surround Video: A Multi-Head Camera Approach. Visual Computer Journal 2005

# Overriding field of views: **Recognizing** panoramas

Stitching should be painless → Recognize automatically panoramas!

- SIFT feature extractor
- RANSAC
- Bundle adjustment
- Multiband blending



(b) All 80 images registered

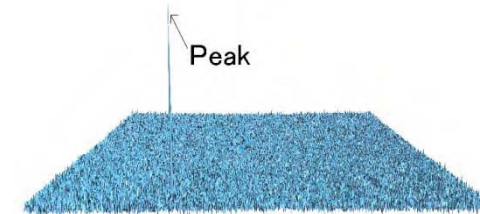
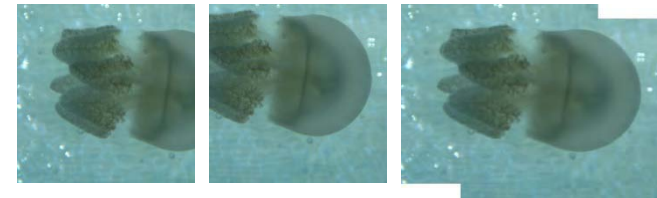


Computer methods for creating photomosaics. IEEE Trans. Computer 23 1975.  
Recognizing panoramas, ICCV 2003

# Overriding field of views: **Gigantic** panoramas

**Stitching should be massive:**

→ Consumer gigapixel images (Fourier)



$$\frac{F_1(u, v)F_2^*(u, v)}{\underbrace{|F_1(u, v)F_2^*(u, v)|}_{\text{Cross-power spectrum}}} = \exp(2\pi i(ux_t + vy_t))$$

**Phase correlation principle:**  
(Fourier cross-spectrum peak)

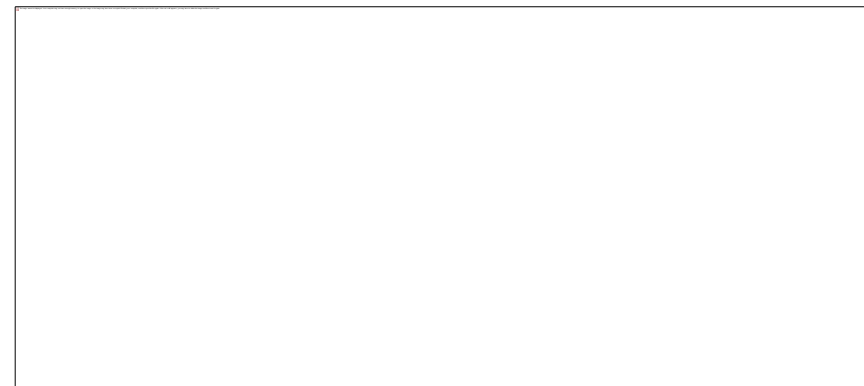
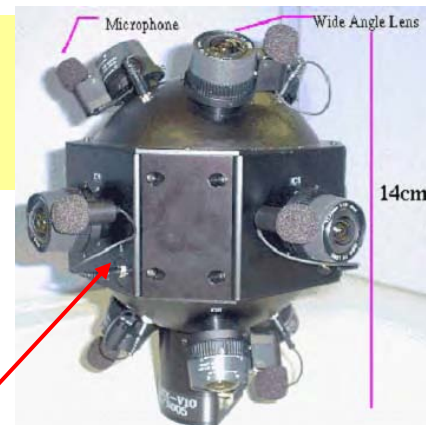
The Phase Correlation Image alignment Method. IEEE Int. Conf. on Cybernetics and Society, 1975.  
ClairVoyance: A Fast and Robust Precision Mosaicing System for Gigapixel Images, IECON 2006.

# Overriding field of views: **Surround videos**

Surround videos: full view movies:  
**No intrinsic parameters.**

BUT...

- **Parallax**
- **Color correction**
- **Compression**
- **(De)Warping on GPU**



Cluster of cameras looking outward

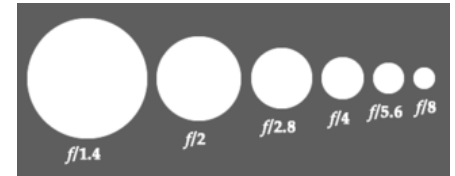
Or catadioptric system (use mirrors to align *virtual* nodal points)

FullView.com / Page on omnidirectional systems <http://www.cis.upenn.edu/~kostas/omni.html>

Surround video: A multihead camera approach, CVPR 2001, ITCC 2002, Visual Computer Journal 2005.  
A GPU Panorama Viewer for Generic Camera Models, Shader X5, 2006.

## Removing Trade-offs Dynamic Range (exposure)

# Overriding Trade-offs... Exposure=Qty of light



- **Aperture** (f-stop number)

- Expressed as ratio between focal length and aperture diameter:

- diameter =  $f / \langle f \text{ number} \rangle$

- f/2.0, f/2.8, f/4.0, f/5.6, f/8.0, f/11, f/16 (factor of sqrt (2))

- Small f number means large aperture

- Main effect: *depth of field*

- A good standard lens has max aperture f/1.8.

- A cheap zoom has max aperture f/3.5

$$f / \# = N = \frac{f}{D}$$



F/32 (Pinhole)



F/5

- **Shutter speed**

- In fraction of a second

- 1/30, 1/60, 1/125, 1/250, 1/500 (factor of 2)

- Main effect: *motion blur*



25  
sec

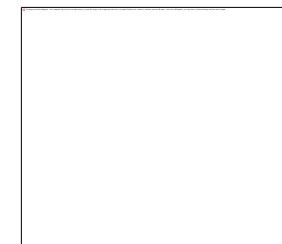
- **Sensitivity**

- Gain applied to CCD/CMOS sensor

- In ISO, bigger number, more sensitive (100, 200, 400, 800, 1600)

- Main effect: *sensor noise*

→ degrees of freedom for setting an exposure.



# Overriding Trade-offs... Exposure/Dynamic range

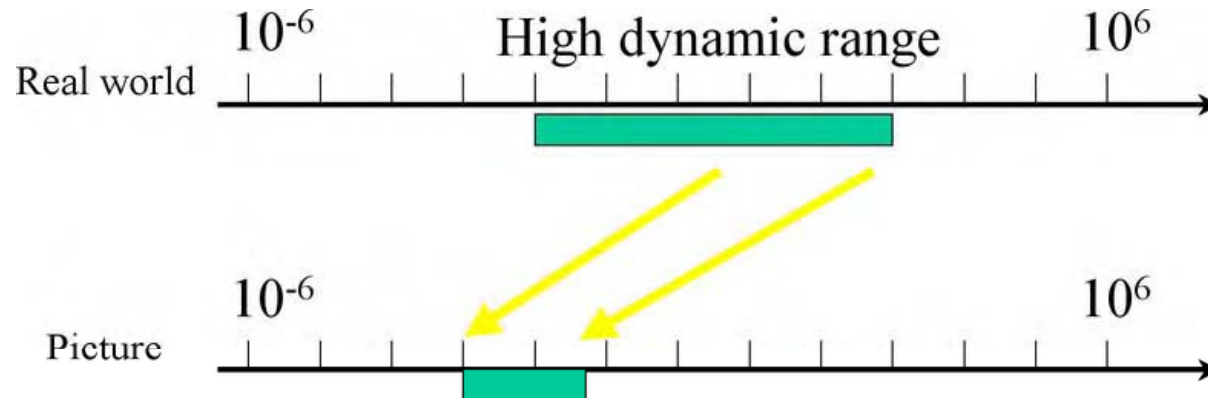
**Radiant**: #photons per joule:

$$\frac{5.034 \times 10^{15}}{\text{Photon wavelength}}$$

**Radiant flux**: energy per sec. (in Watt)

**Candela** (cd): luminous power per solid angle

**Illuminance** in candela/m<sup>2</sup> (nit) (Irradiance)



Overexposed (white)

Typical scene has dynamic range 1:100.000  
(17 bits, 17 f-stops)

Images are quantized and some pixels may be **clamped**:  
Underexposed (clamped to 0) or overexposed (clamped to 255)



# Overriding Trade-offs... Exposure/Dynamic range

**Exposure latitude (film contrast ratio)**= range of light intensities.

Digital cameras: pixels in 8-,12- or 16-bit quantized values.

So far we needed to choose the **dynamic range (DR)** properly



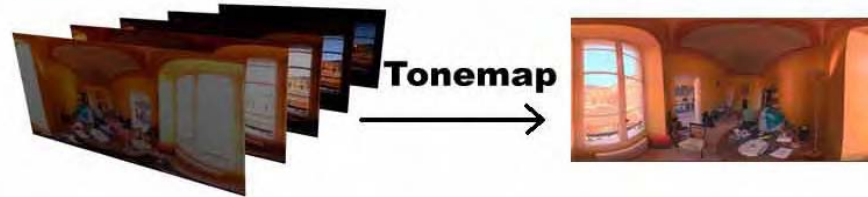
Override exposure limits by `stitching several' dynamic range pictures  
From exposed picture (LDR) to **radiance picture (HDR)**

HDRShop <http://gl.ict.usc.edu/HDRShop/>

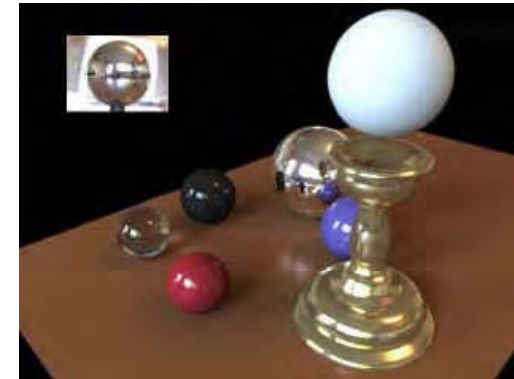
Recovering High Dynamic Range Radiance Maps from Photographs, SIGGRAPH 1997

# Overriding Dynamic range... Radiance pictures

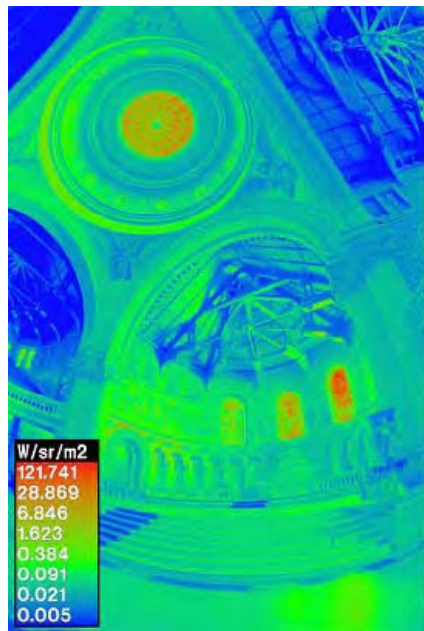
Tone mapping



Killer application: Image-based lighting (IBL)



Synthetic rendering using light probes



Tone mapped  
(for display)



Photographic tone reproduction, SIGGRAPH 2002. <http://www.gregdowning.com/HDRI/tonemap/Reinhard/>  
Image-Based Lighting (IBL). IEEE Computer Graphics and Applications 22(2): 26-34 (2002)  
Backward Compatible High Dynamic Range MPEG Video Compression, SIGGRAPH 2006

## Removing Trade-off Depth of Field (DoF)

# Overriding Depth of field (DoF)

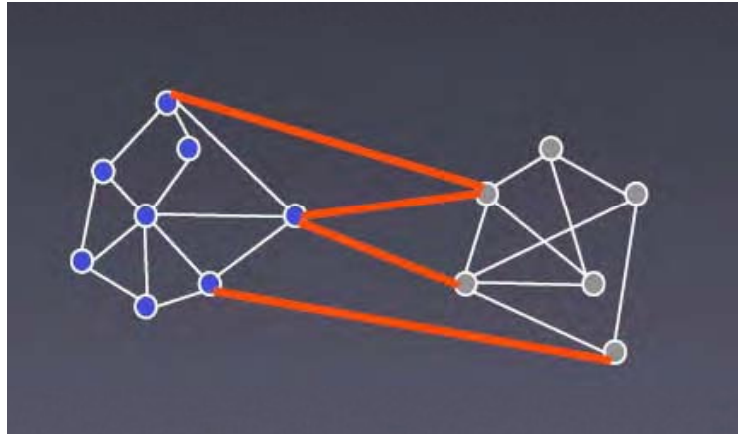


← All-in-focus image from **multiple** focused images using *graph cuts*

Interactive Digital photomontage, SIGGRAPH 2004 <http://grail.cs.washington.edu/projects/photomontage/>  
Graph Cuts for Energy Minimization, ICCV 2003. <http://www.cs.cornell.edu/~rdz/graphcuts.html>

# Overriding Depth of field | Graph cuts

Max flow/min cut graph algorithms applied to images (large graphs)



$$cut(A, B) = \sum_{u \in A, v \in B} w(u, v).$$

Min cut or max cut

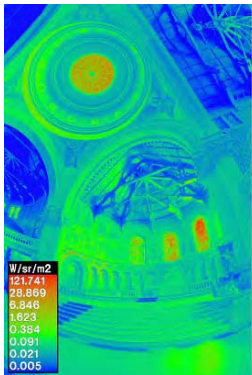


# Computational Photo.: Overriding Trade-offs...

→ Multiple image fusion techniques to remove current photography limits



Field of view → **panorama picture**  
(Omnidirectional picture)



Exposure → **radiance picture**  
(Omnirange picture)



Depth of field → **all-in-focus picture**  
(omnifocus picture)

Picture → **Omnipicture**  
(Multiple Capture Single Image, MCSI)

## Human Perception versus Digital Image Processing

Qualia

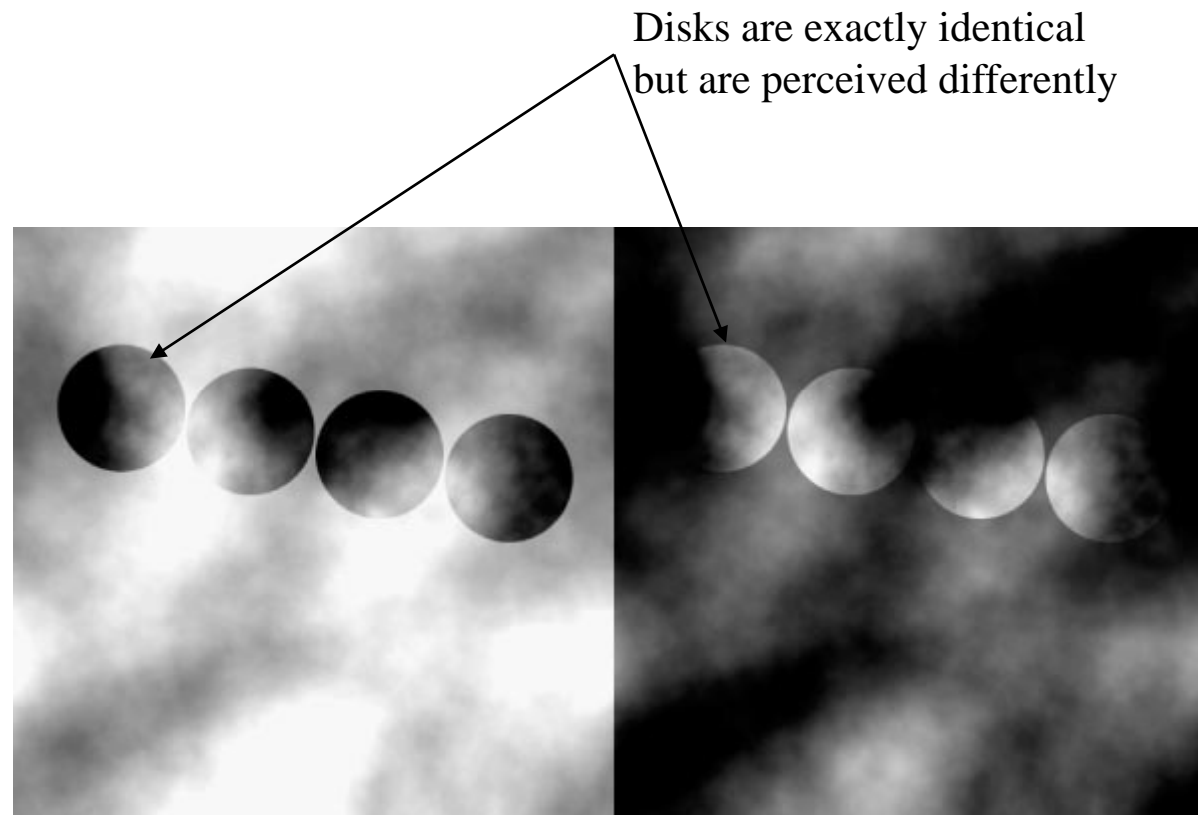
vs

Turing machine computation...



# Overriding Dynamic range... Tone mapping

Scientific (measurement) images  $\neq$  Human perceptual images



'dark disks' visible  
*through* light haze

'light disks' visible  
*through* dark haze



# S/W Computational Photo.: Hybrid images

Humans perceive low/high frequency differently according to distances.



Miss Calm and Dr Angry

High frequency (=edges) at small distances

Low frequency at large distances  
(= Gaussian filter)

# S/W Computational Photo.: Hybrid images



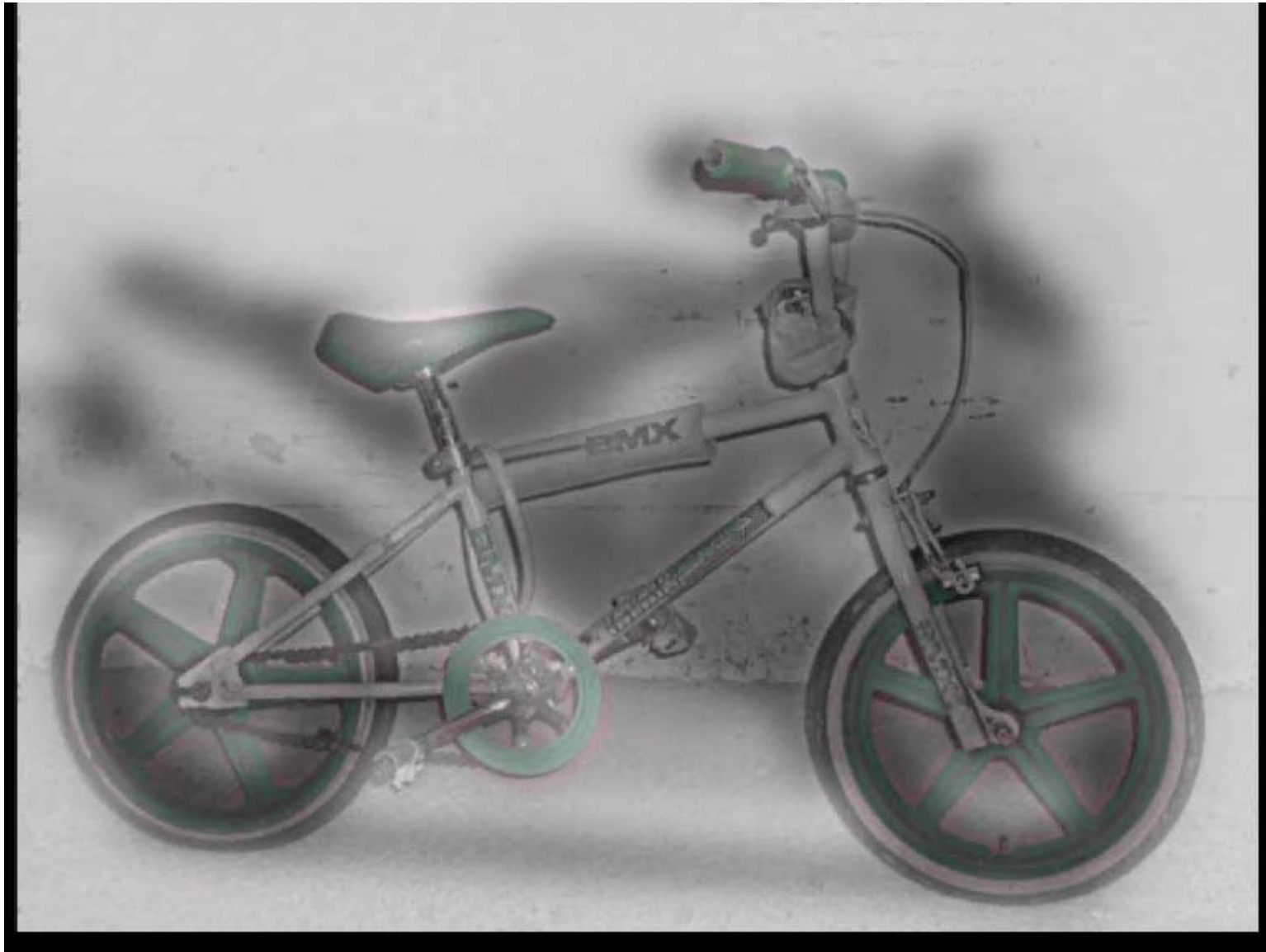
© 2006 Antonio Torralba and Aude Oliva

High frequency  
at close distance



Low frequency  
at far distance

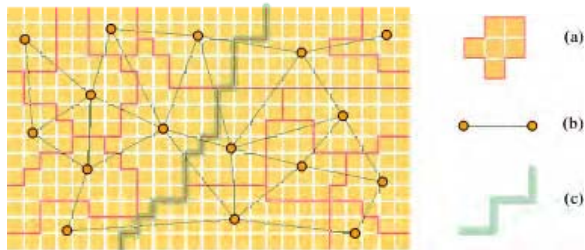
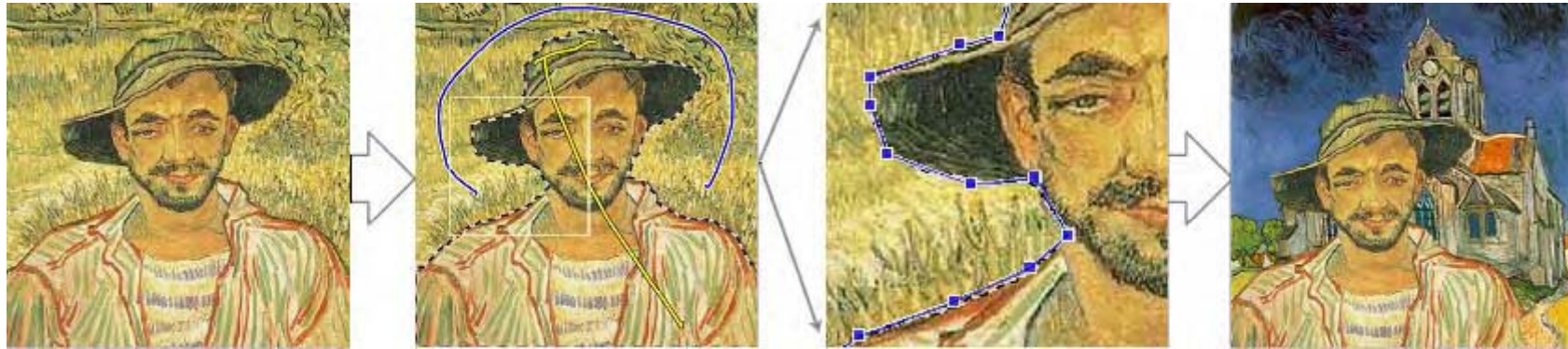
# S/W Computational Photo.: Hybrid images



Hybrid images, SIGGRAPH 2006.

## Modern Image Processing images as graphs

# S/W Computational Photo.: Object cutout



**Graph cut with presegmentation**  
(mean shift oversegmentation)



(a) Girl (4/2/12)

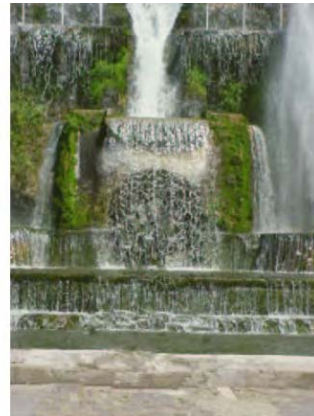
(b) Ballet (4/7/14)

(c) Boy (6/2/13)

Lazy snapping, SIGGRAPH 2004 / <http://research.microsoft.com/~jiansun/>  
Implementation <http://www.cs.cmu.edu/~mohit/segmentation.htm>

# Computational Photography

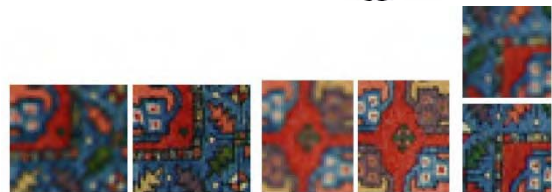
## Inpainting... Texture Synthesis... Hallucination...



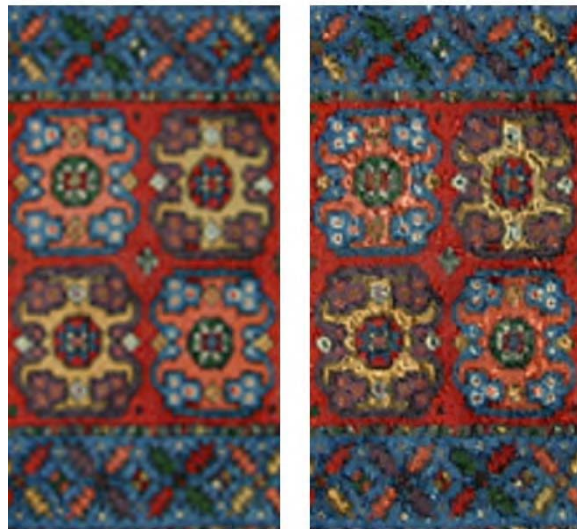
Region filling and object removal by exemplar-based inpainting. IEEE Trans. Image Process. 2004  
<http://research.microsoft.com/~antcrim/papers.htm>

# Comp. Photography: Image analogies

Image analogies

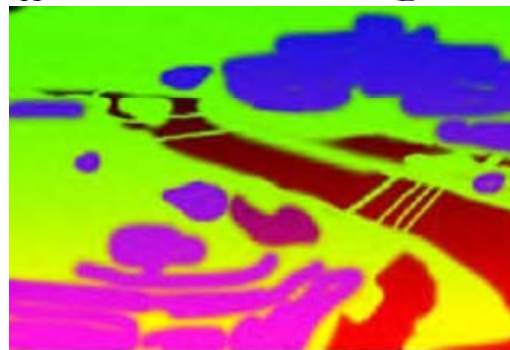


Training pairs ( $A, A'$ )

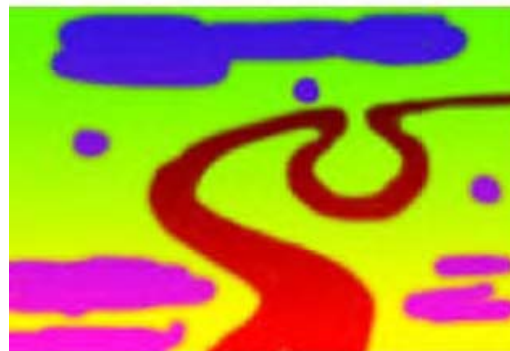


Unfiltered target ( $B$ )

Filtered target ( $B'$ )



Unfiltered source ( $A$ )



Unfiltered ( $B$ )



Filtered source ( $A'$ )

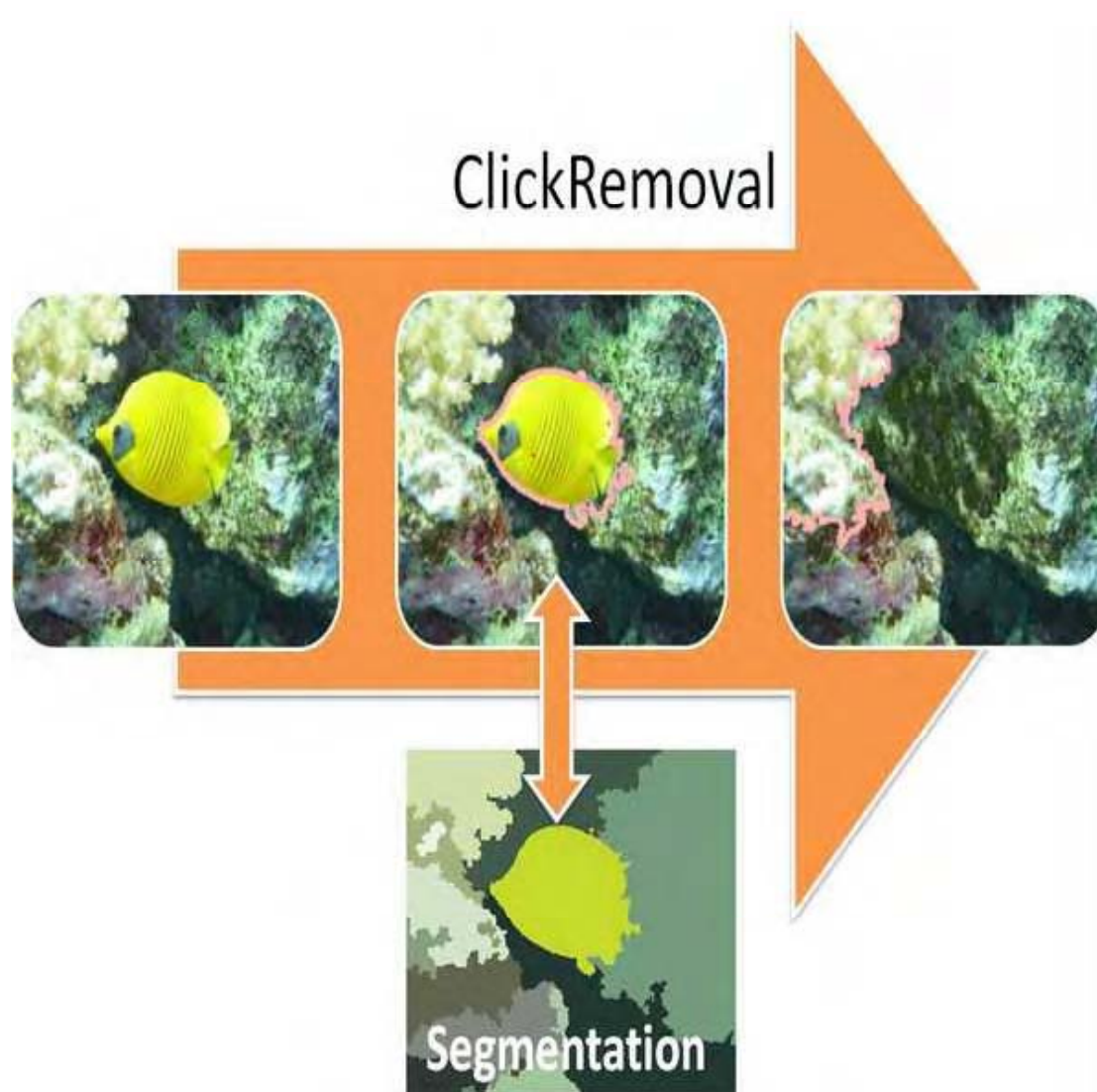


Filtered ( $B'$ )

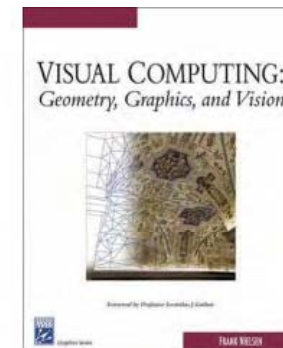
Pictures by numbers (segmentation)

Superresolution

# Computational Photography: **ClickRemoval** applet



Visual Computing:  
Geometry, Graphics, and Vision  
2005.



Techniques described  
with C++ code

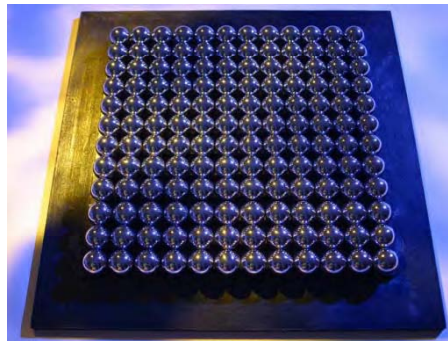
Frank Nielsen, Richard Nock: ClickRemoval: interactive pinpoint image object removal.  
[ACM Multimedia 2005:](#)



## Computational Photography: H/W

# Computational Photography

## Novel hardware & processing techniques

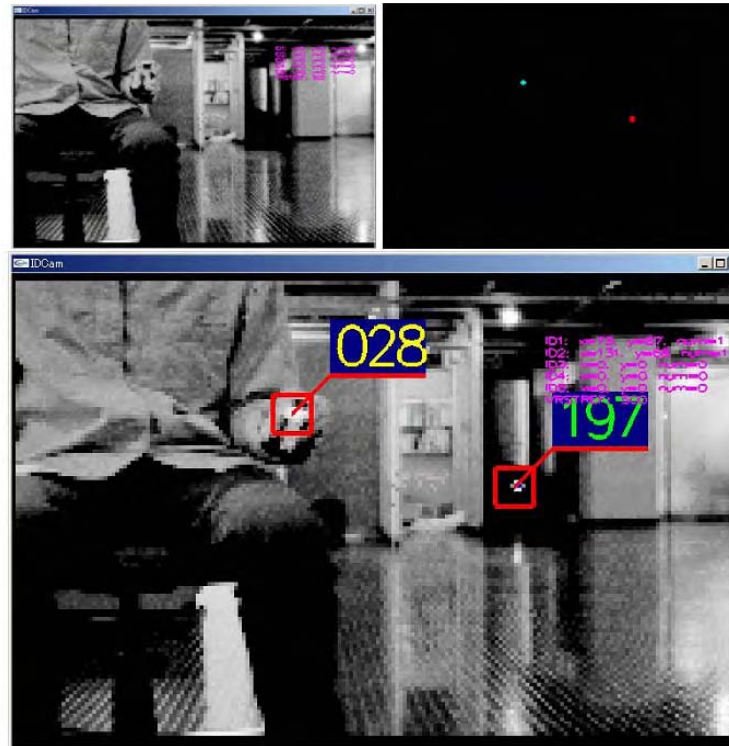
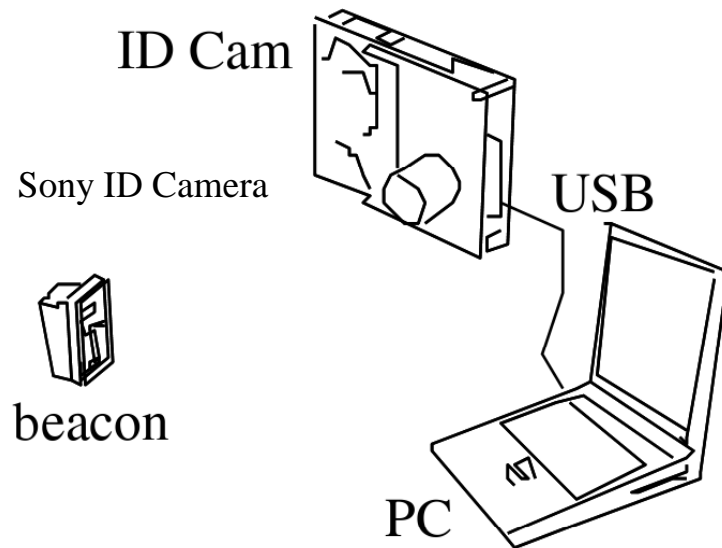
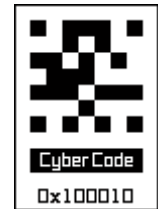
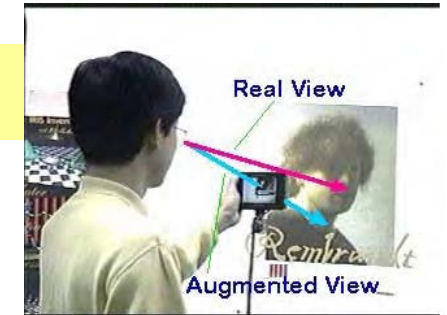


# Computational Photo.: ID Camera



## NaviCam Augmented-Reality (AR)

Multiple capture single image (MCSI)  
CMOS sensor, image processing on-board



ID CAM: A Smart Camera for Scene Capturing and ID Recognition (ISMAR'03)

The World through the Computer: Computer Augmented Interaction with Real World Environments, UIST 1995

# Computational Photography: Vein Viewer



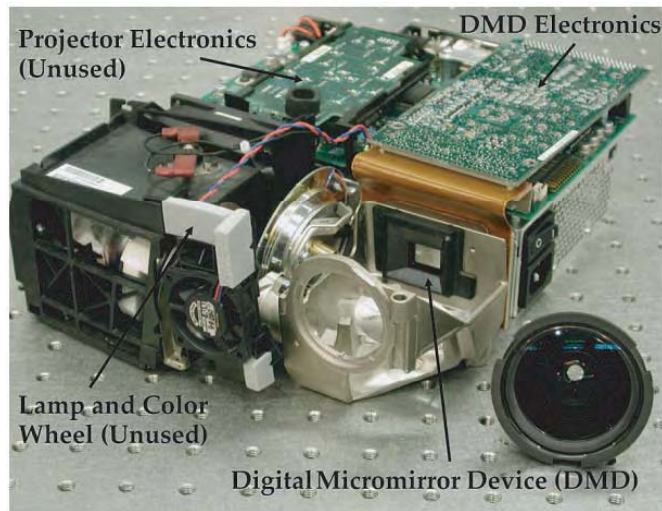
Coaxial Infrared camera + Projector



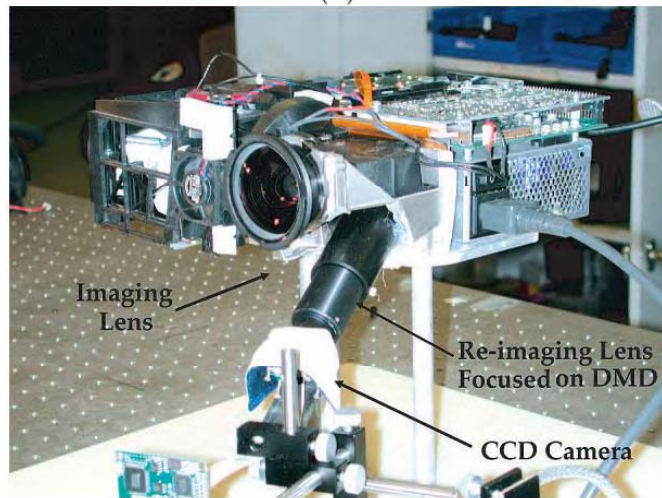
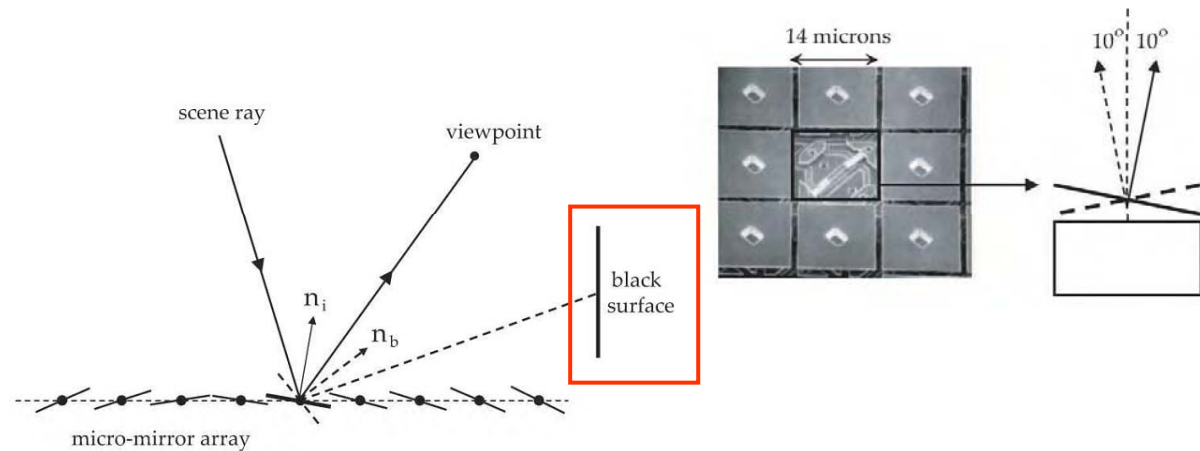
# Computational Photography:

## Computing in Optical Domain

# H/W Comp. Photo.: Computing in Optical domain



(a)

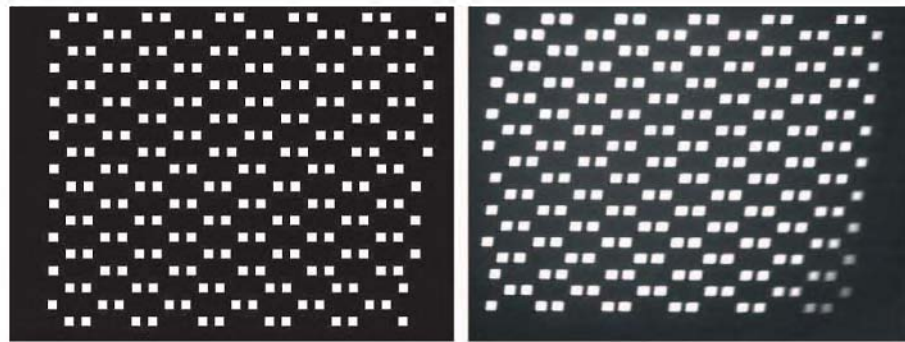


Control the rays in space-time:  
**Exposure** allows **optical** computations  
→ **Light integration** on the sensor

Programmable imaging using a digital micromirror array (CVPR'04)

Programmable Imaging: Towards a Flexible Camera, Int. Journal of Computer Vision. 2006

# H/W Comp. Photo.: Computing in Optical domain

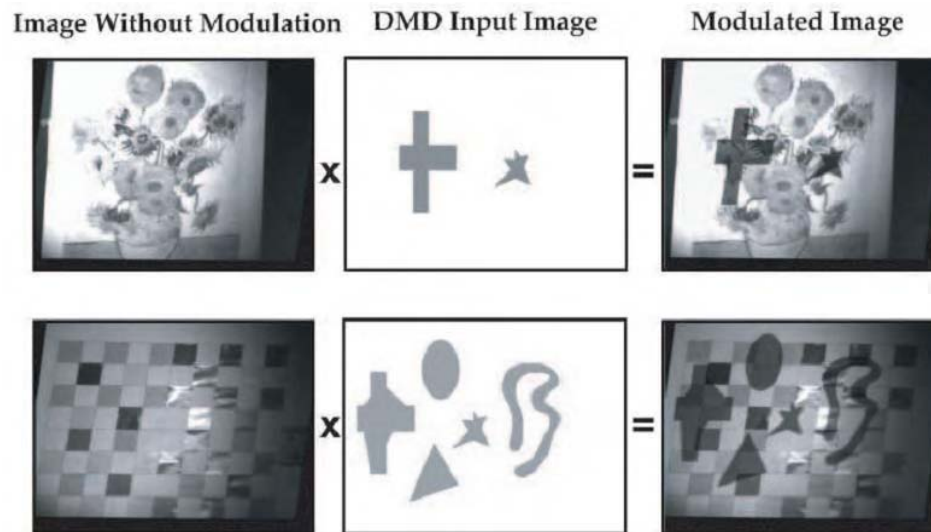


DMD input image

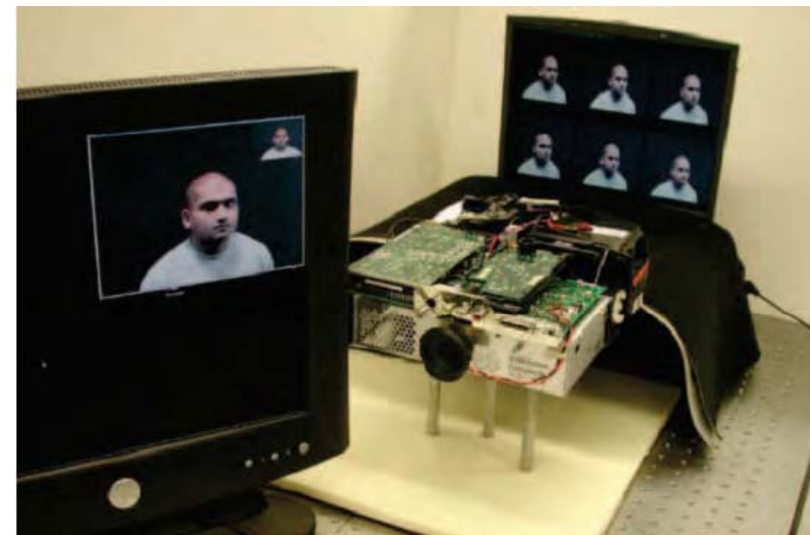
Camera output image



Require to **calibrate** the DMD with the camera coarsely



**Convolution in optical domain**



Convolution in optical domain for face recognition

Programmable imaging using a digital micromirror array (CVPR'04)  
Programmable Imaging: Towards a Flexible Camera, Int. Journal of Computer Vision. 2006

# Computational Photography:

## Computing in Gradient Domain

# Computational Photography : Loose Copy/Paste

For pasting objects, do not care of precise boundaries/mattes



Former method: Multi-band Laplacian image pyramid blending

New approach based on Poisson image editing using a Poisson equation solver



$f^*$  – the known image

Scalar 2D function from  $(x,y)$  to grayscale value.

$f$  - the image in the unknown area

$\Omega$  – the unknown area (domain of  $f$ )

$$\arg \min_f \iint_{\Omega} |\nabla f|^2 \quad s.t. \quad f|_{\partial\Omega} = f^*|_{\partial\Omega}$$

Complete the area as smoothly as possible.

Drag-and-drop pasting, SIGGRAPH 2006 [Poisson Image Editing 2003]

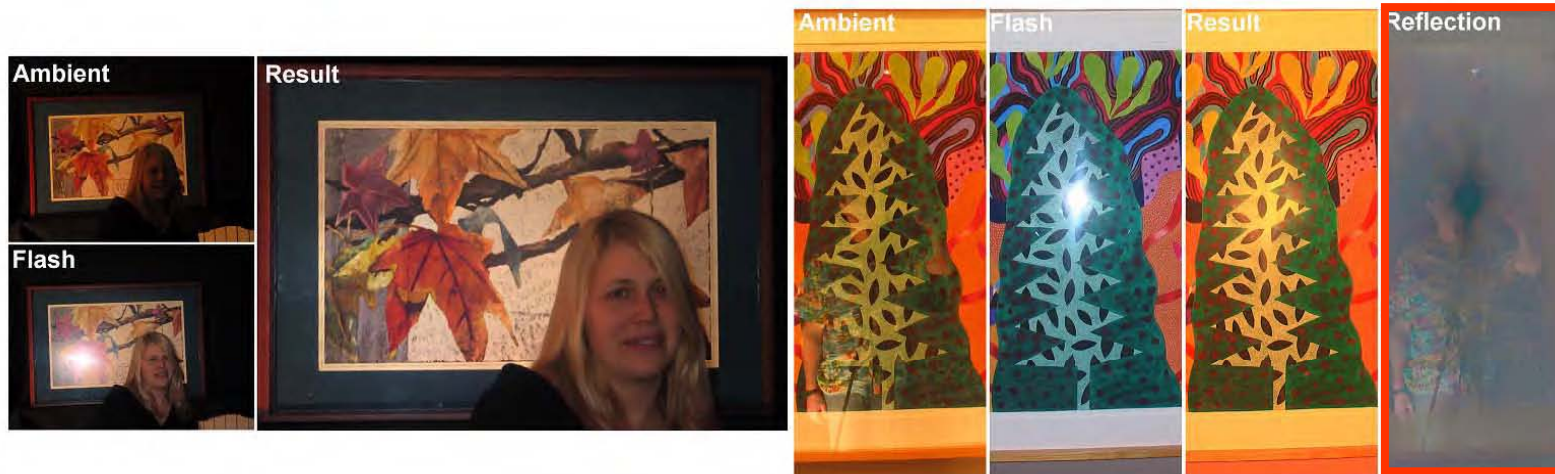
The Laplacian Pyramid as a Compact Image Code, IEEE Trans. Communications (1983)



# Computational Photography:

## Computing with Flash/no-flash

# H/WComp. Photography: Gradient camera



Removing photography artifacts using gradient projection and flash-exposure sampling, SIGGRAPH 2005

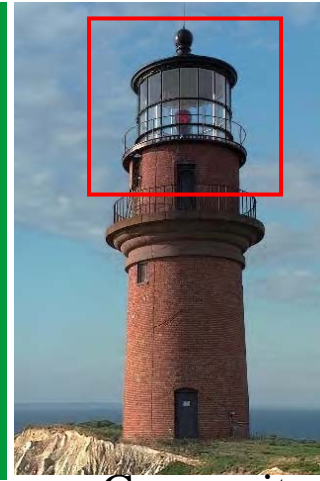
# S/W Computational Photo.: **Matte** Extraction



Input



Alpha matte



Composite

- Seminal blue screen, rotoscoping
- Probability theory of **alpha matting**:
  - ← Bayesian matting, belief propagation

**Under constrained problem:**

One equation, **three** unknowns



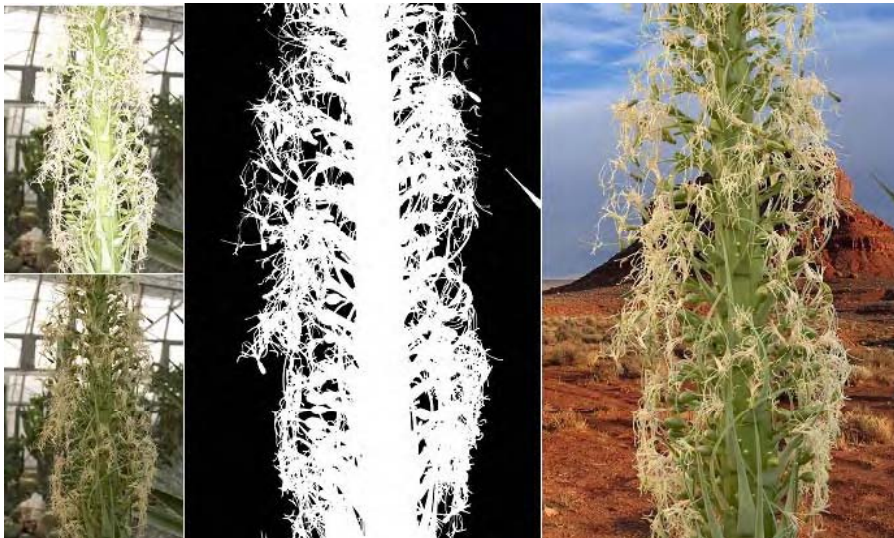
$$I_i = \alpha_i F_i + (1 - \alpha_i) B_i$$



→ need to **constrain the problem!**

→ Many techniques

# H/W Computational Photo.: Flash/no flash matting

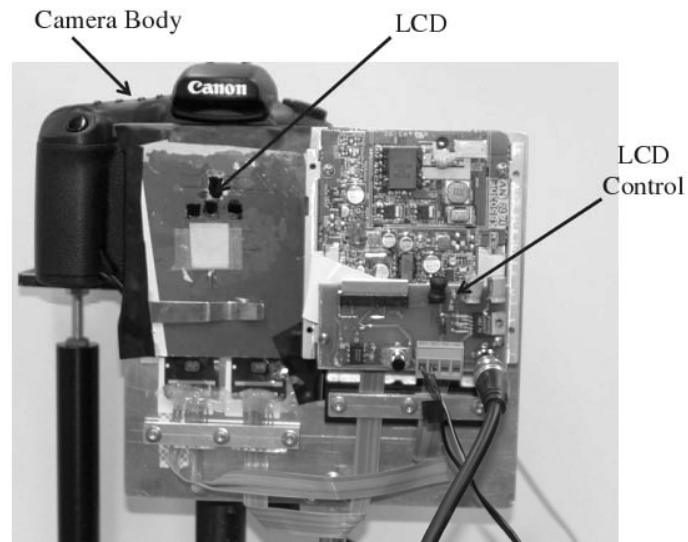


- Need tripod
- Problems with specularities

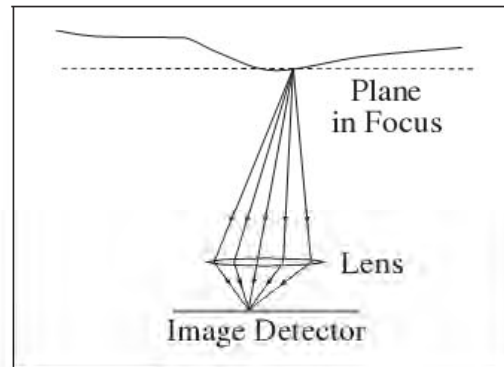
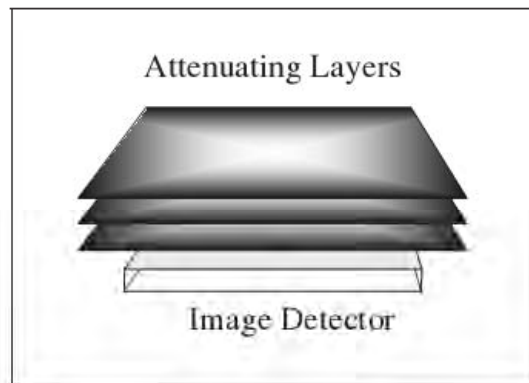
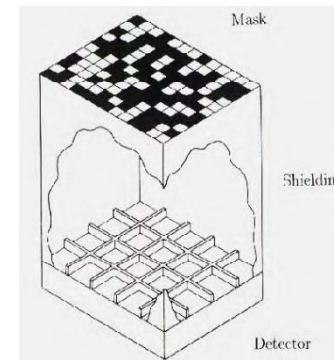
# Computational Photography:

Computing with  
exotic “lenses”

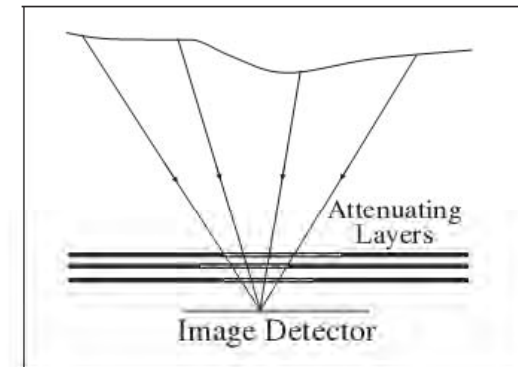
# Computational Photo.: Lensless Camera



Control the light rays on each layer:  
**Multiple-layer aperture**

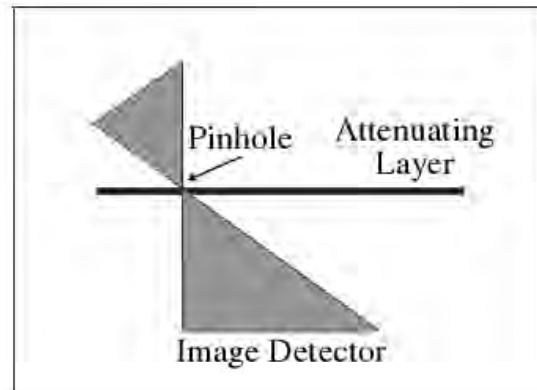


Traditional

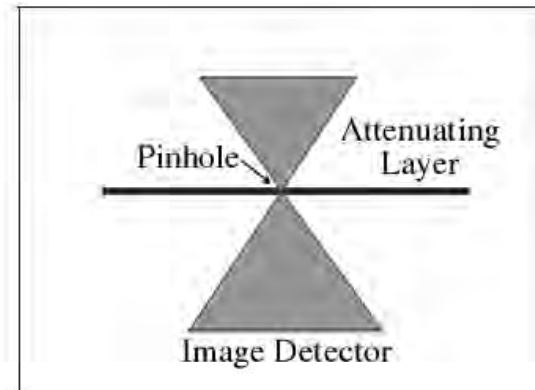


New

# Computational Photo.: Lensless Camera



(a)



(b)



Pan/tilt field of view (fov) without physical moving parts

# Computational Photo.: Lensless Camera

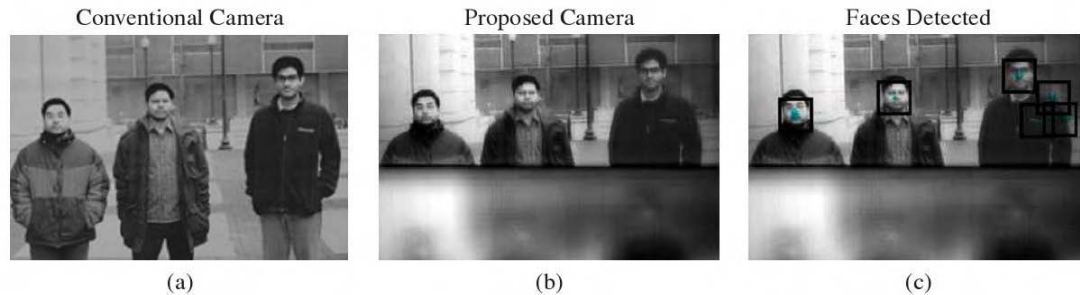


(a)

Split field of view, spatially varying zoom



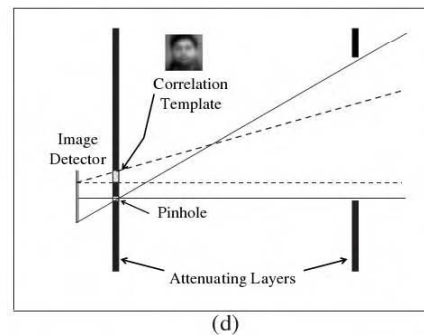
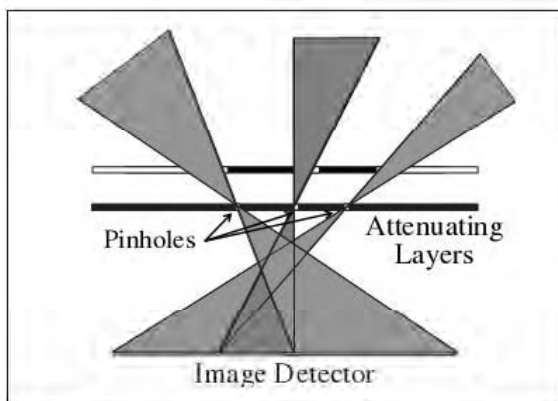
(b)



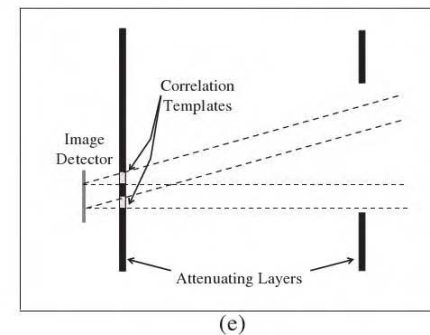
(a)

(b)

(c)



(d)



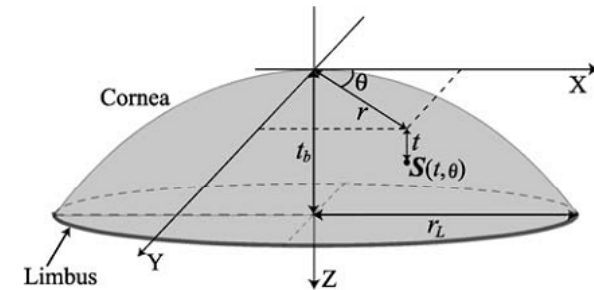
(e)

Computations in optical domain

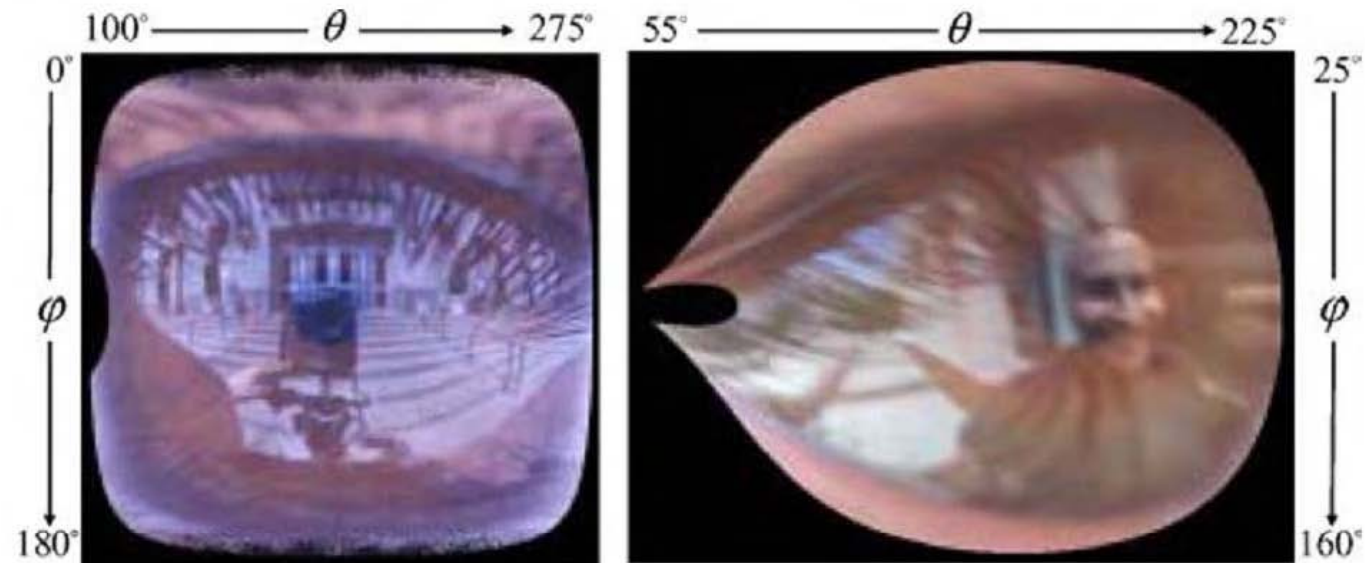


# Computational Photography: Eye Optics

Appearances of eyes captures both the environment and gazing direction



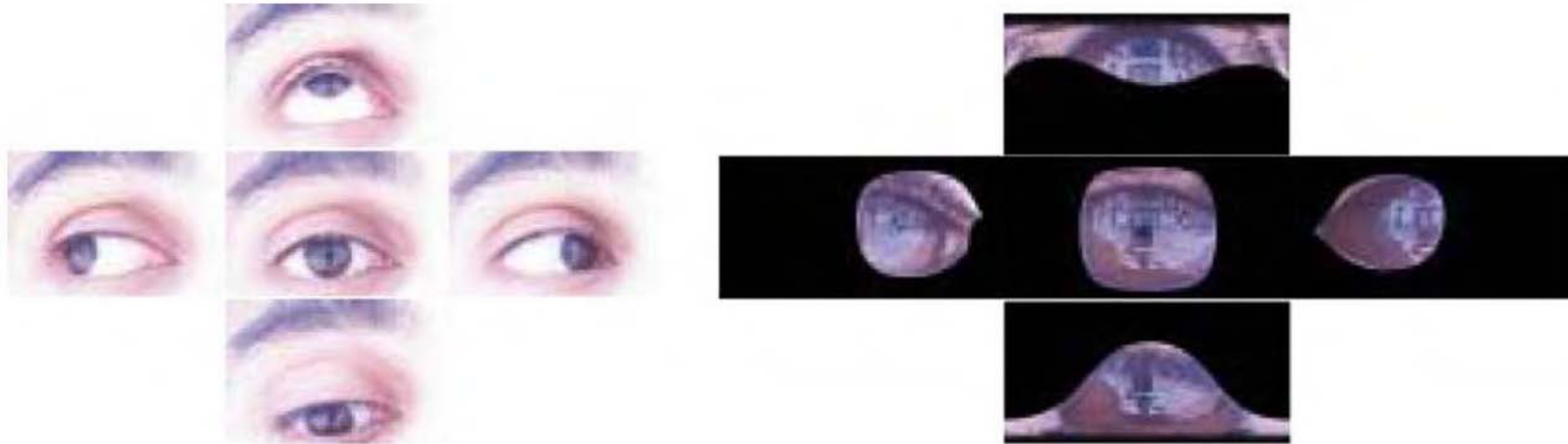
Spherical panorama  
(latitude-longitude)



Corneal Imaging System Environment from Eyes, Int. Journal on Computer Vision (IJCV) 2006.  
Eyes for relighting, SIGGRAPH 2004.

# Computational Photo.: Eye Optics

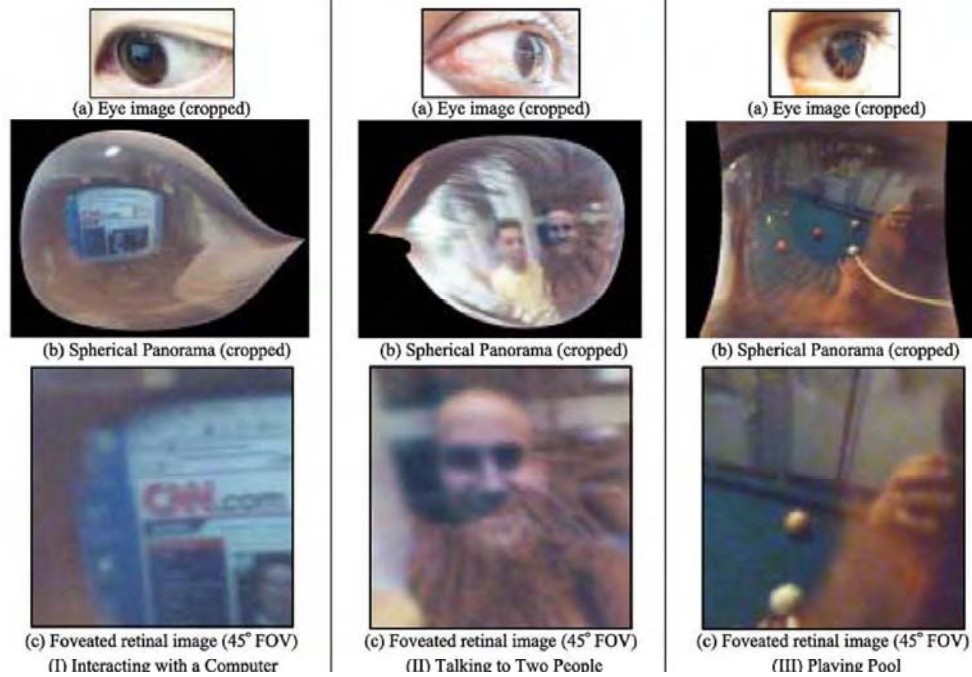
Gazing directions and corneal images



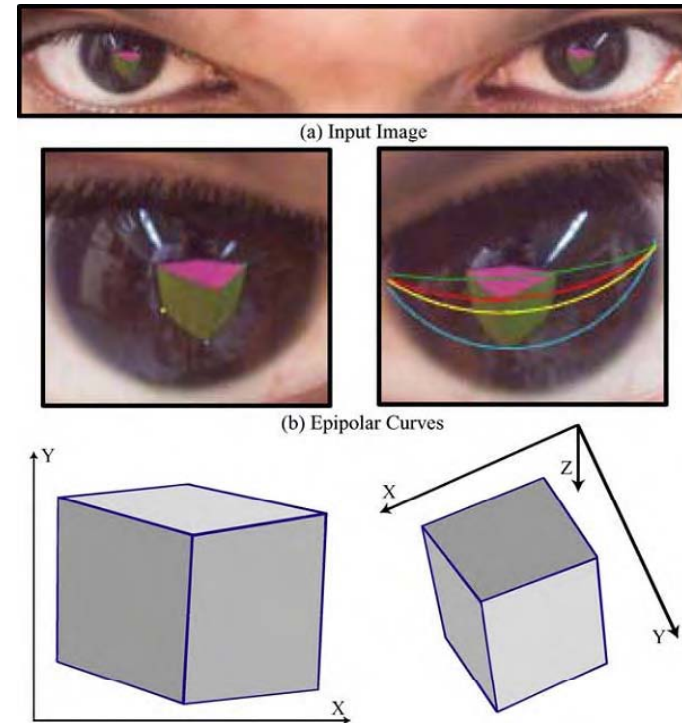
Stitching and blending onto an equirectangular map

Corneal Imaging System Environment from Eyes, Int. Journal on Computer Vision (IJCV) 2006.  
Eyes for relighting, SIGGRAPH 2004.

# Computational Photo.: Eye Optics



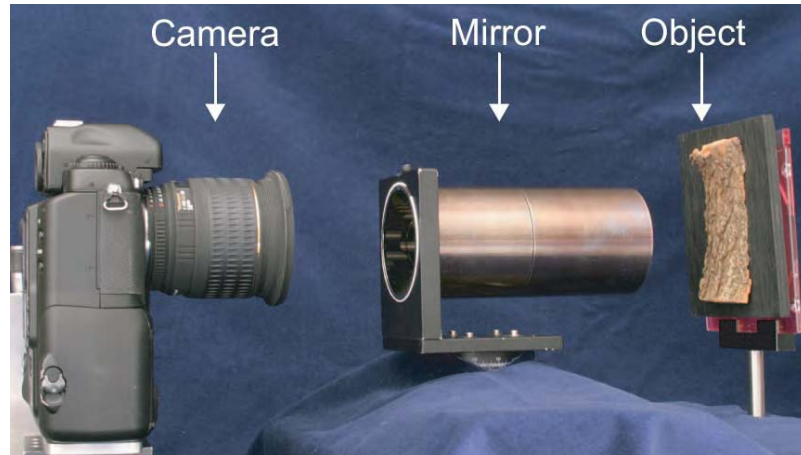
Monitoring activities



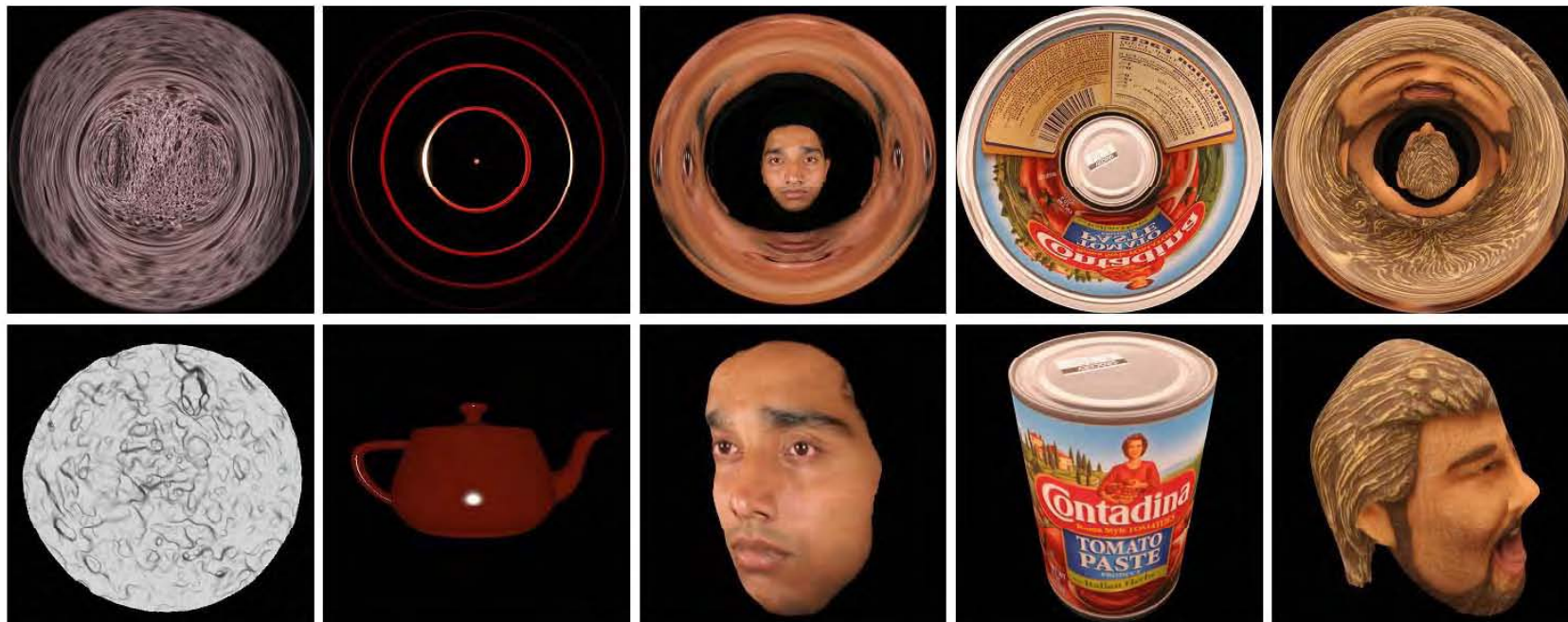
Performing 3D reconstruction  
Of a 3D cube displayed on a monitor  
(Epipolar geometry of corneal imaging system)

Corneal Imaging System Environment from Eyes, Int. Journal on Computer Vision (IJCV) 2006.  
Eyes for relighting, SIGGRAPH 2004.

# Comp. Photography: Radial Catadioptric Camera

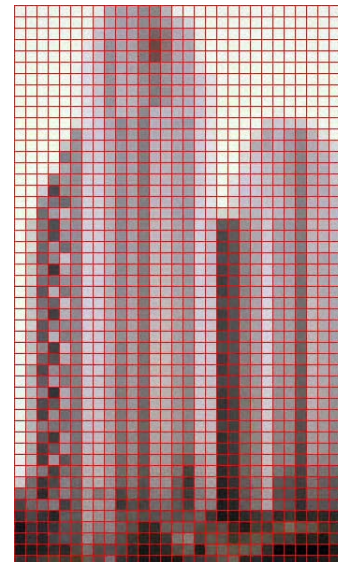


- Capture a *radial* space of rays
- Both mirrored and object parts
- 3D reconstruction with BRDF  
(using a single shot!)



# Computational Photography:

## Beyond 2D pixels: 4D+ Light fields



# Computational Photography: Plenoptic camera

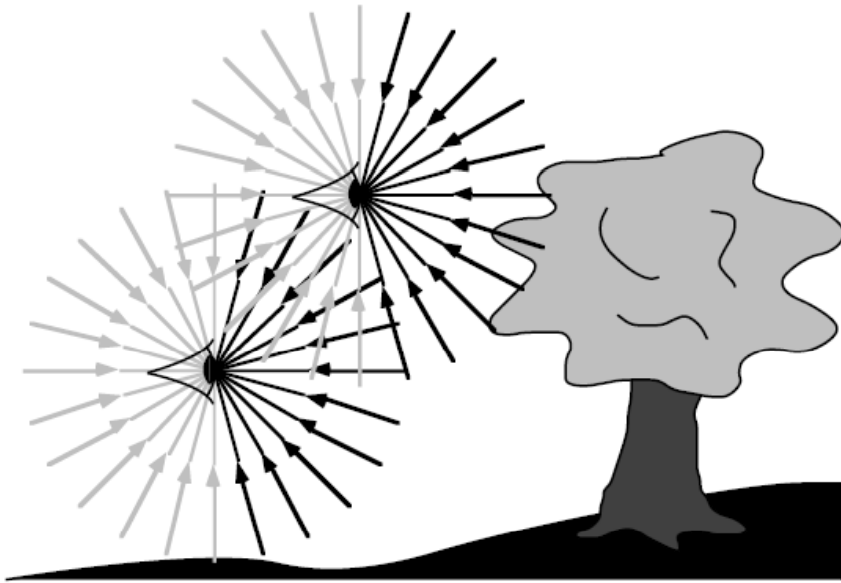


Fig. 1.3

The plenoptic function describes the information available to an observer at any point in space and time. Shown here are two schematic eyes-which one should consider to have punctate pupils-gathering pencils of light rays. A real observer cannot see the light rays coming from behind, but the plenoptic function does include these rays.

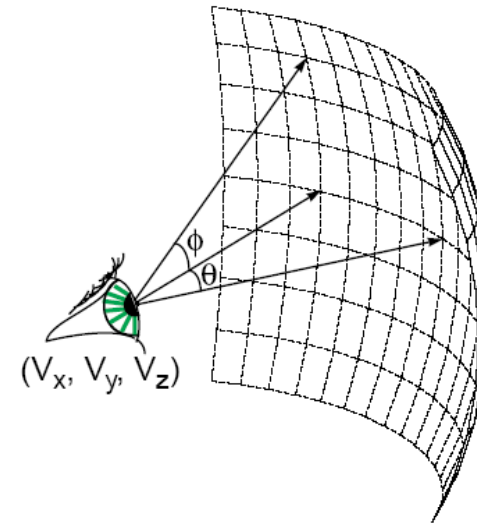


FIGURE 1. The plenoptic function describes all of the image information visible from a particular viewing position.

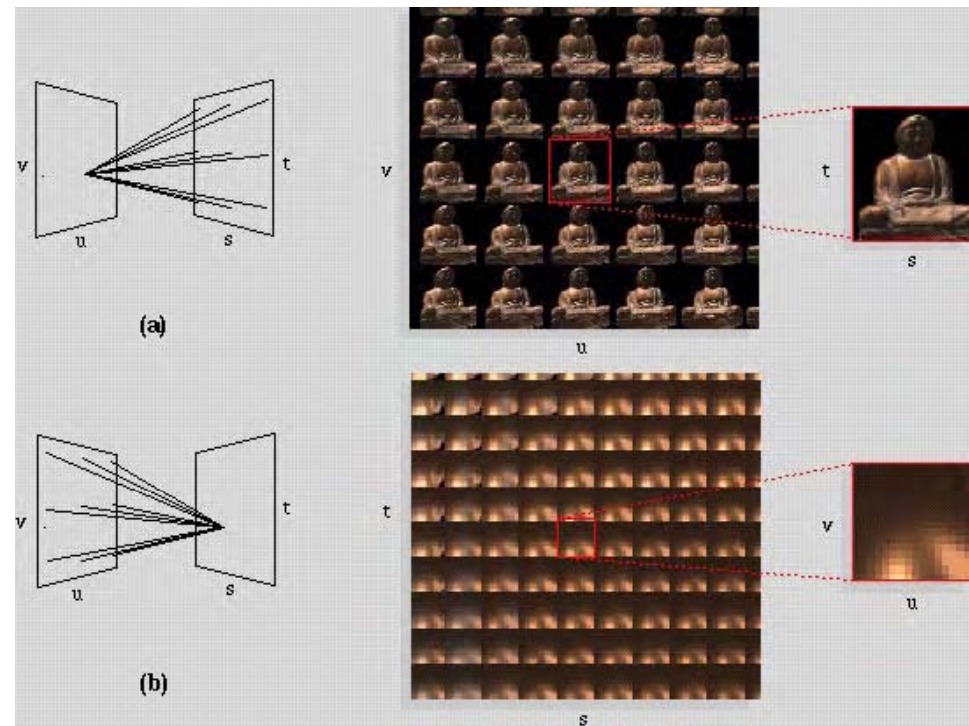
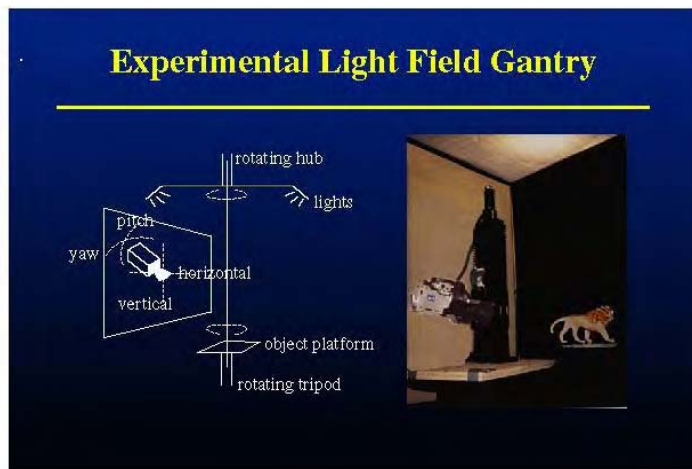
Plenoptic (latin plenus+optics) is a **7D function**  $(X, Y, Z, \theta, \phi, \lambda, t)$

The Plenoptic Function and the Elements of Early Vision 1991

Plenoptic Modeling: An Image-Based Rendering System, SIGGRAPH 1995

# Computational Photography: Light field camera

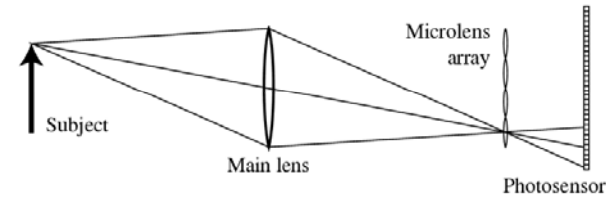
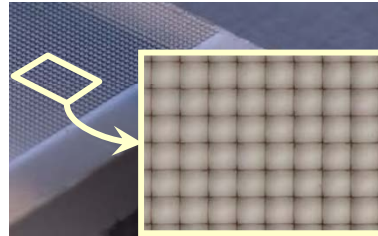
Instead of using a pinhole camera, why not capture a larger set of rays.  
→4D light fields



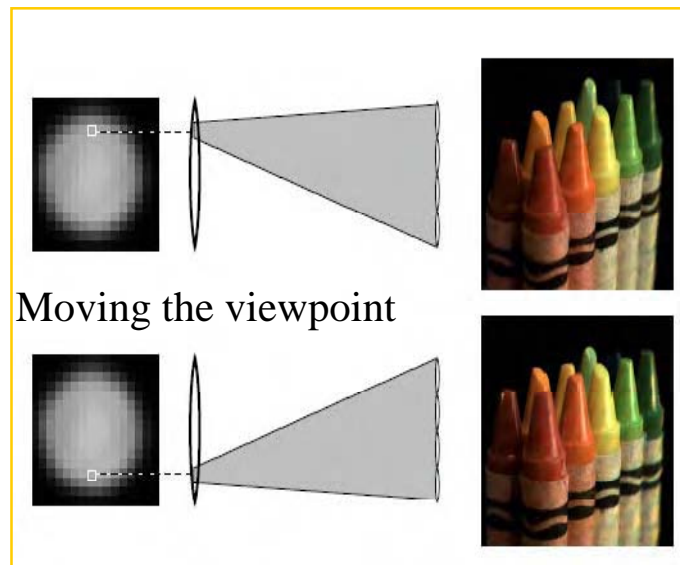
Light field rendering, SIGGRAPH 1996 <http://graphics.stanford.edu/papers/light/>  
The lumigraph, SIGGRAPH 1996

# Computational Photography: Light field camera

Acquire first, postprocess later.



Digital refocusing



16 MP: 300x300 lens images



# H/WComp. Photography: Light field camera

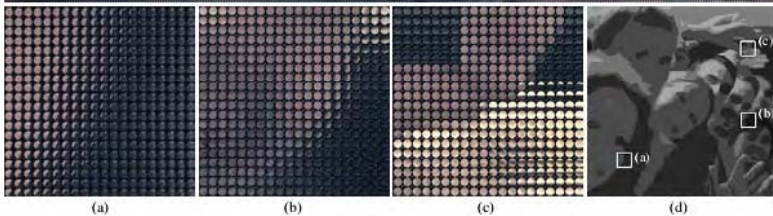
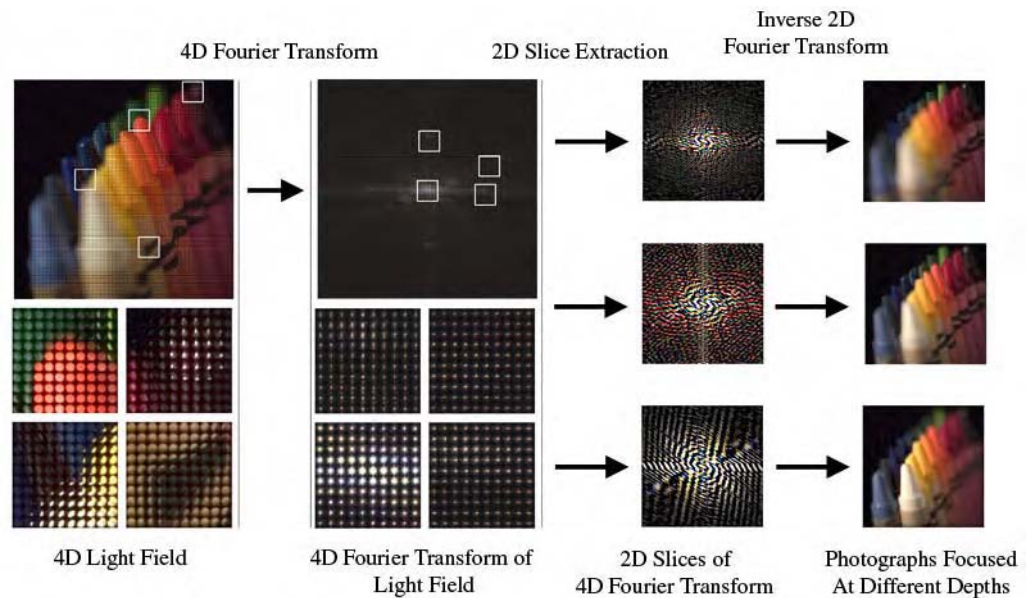


Figure 13: A complete light field captured by our prototype. Careful examination (zoom in on electronic version, or use magnifying glass in print) re-



## Fourier Slice Photography

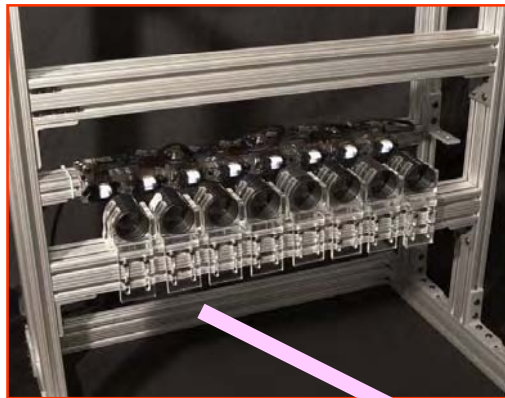
# Comp. Photography: **8D Reflectance field**

4D light field : all rays outgoing at some closure

4D illumination field : all incoming rays some closure

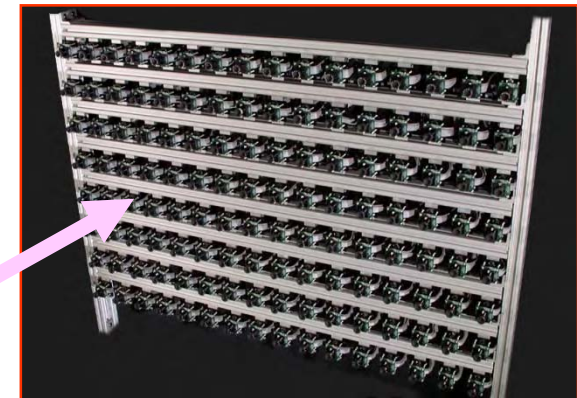
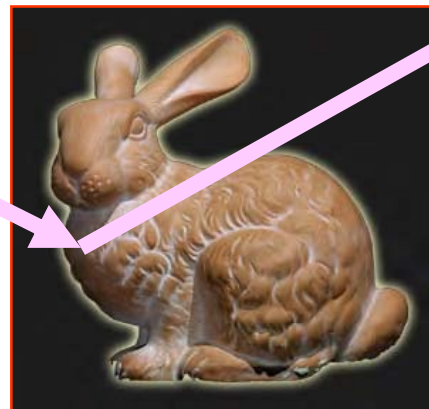
8D reflectance field: ratio of outgoing/incoming rays

8D reflectance field modeled as a transport matrix between the 4D incident light field and the 4D reflected light field.



Projector array

**Light transport**



Camera array

(so far, only 6D measurements)

# Computational Photography

# Computational Photography

## Smart pictures and Smart cameras

# Comp. Photography: Novel World Depictions



Pablo Picasso



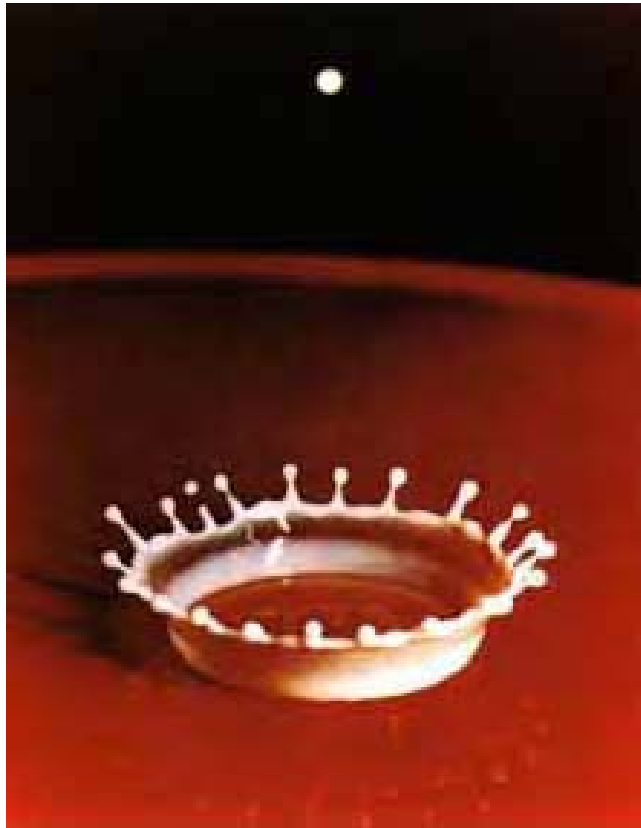
Marc Chagall

Artists depicting our world



David Hockney, 1985

# Comp. Photography: Strobe light photography



Doc Edgerton, 1936



Few microseconds

Hint: Sub-shutter speed if flash lapse is shorter than exposure time

# Comp. Photography: Expressive photography



Express artistically or scientifically a scene.  
What are the **expressive rays**?

# Comp. Photography: Multiperspective panoramas

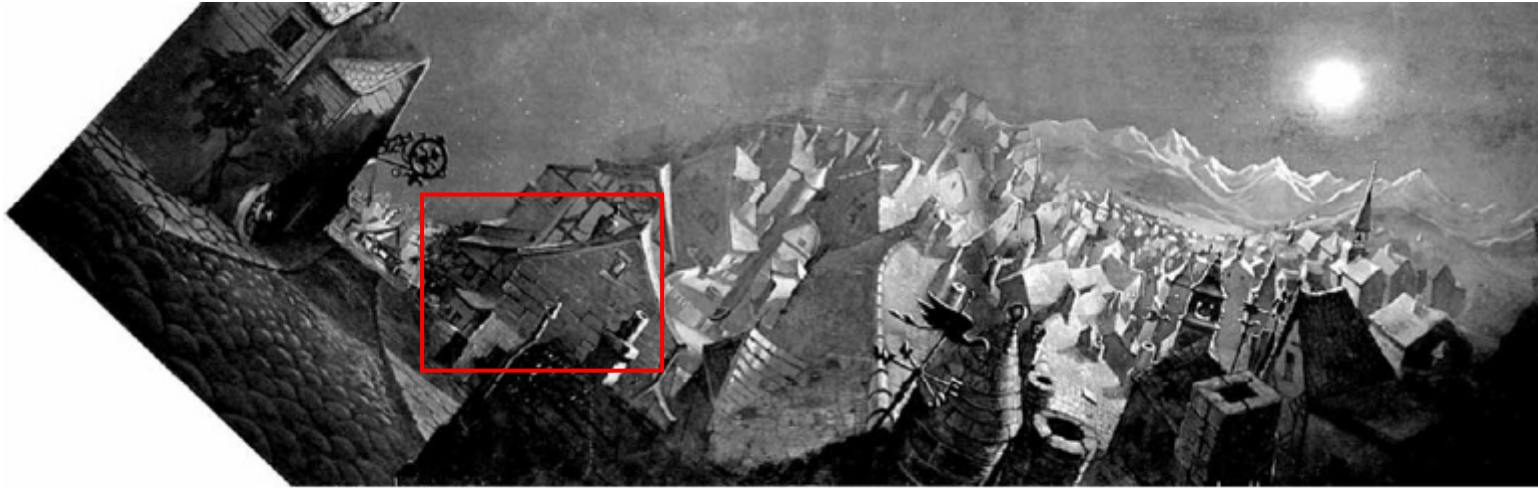
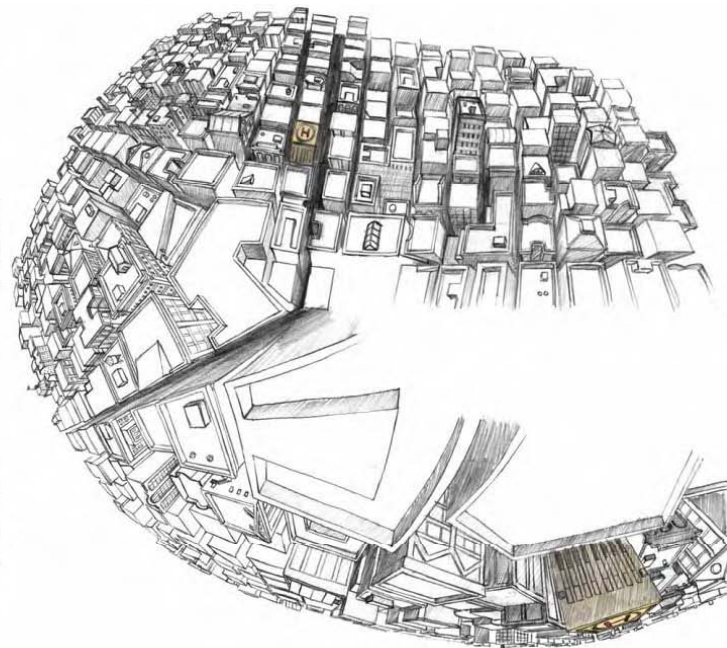
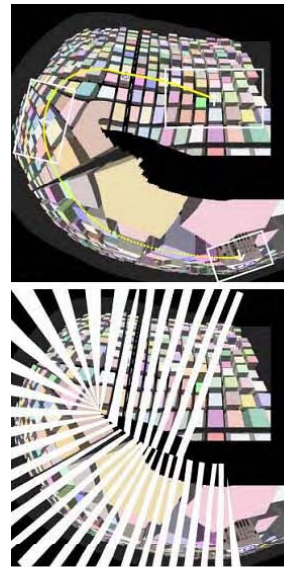
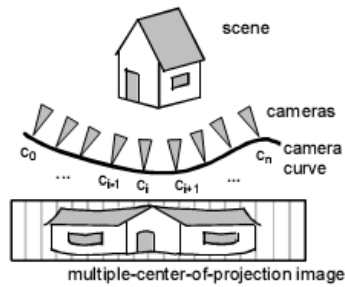


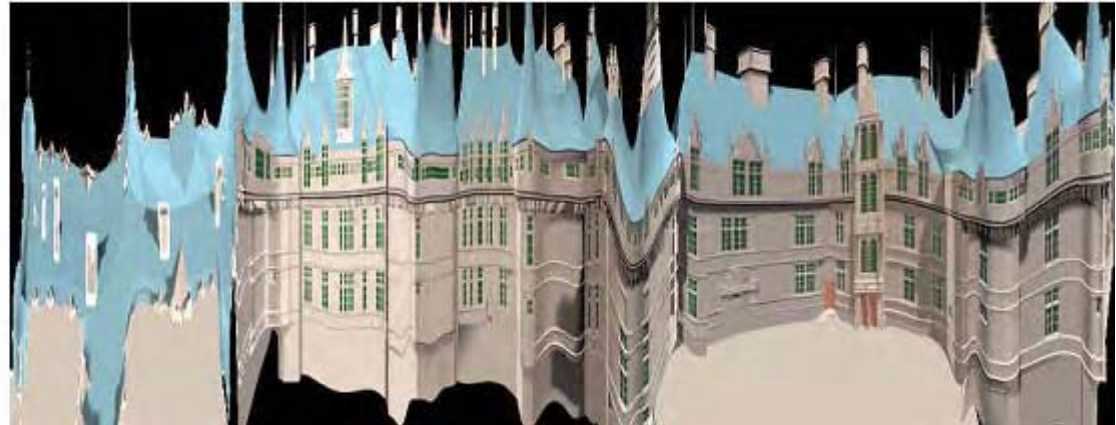
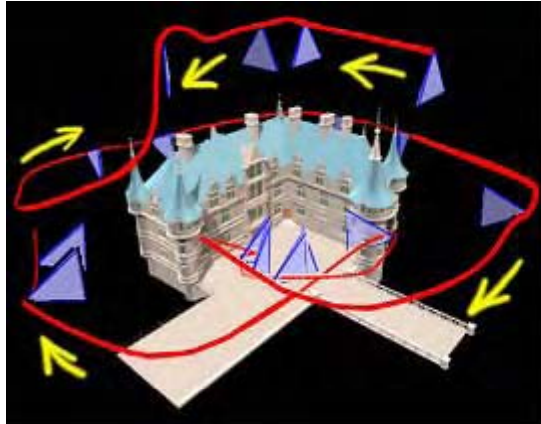
Figure 1 A multiperspective panorama from Disney's 1940 film *Pinocchio*. (Used with permission.)



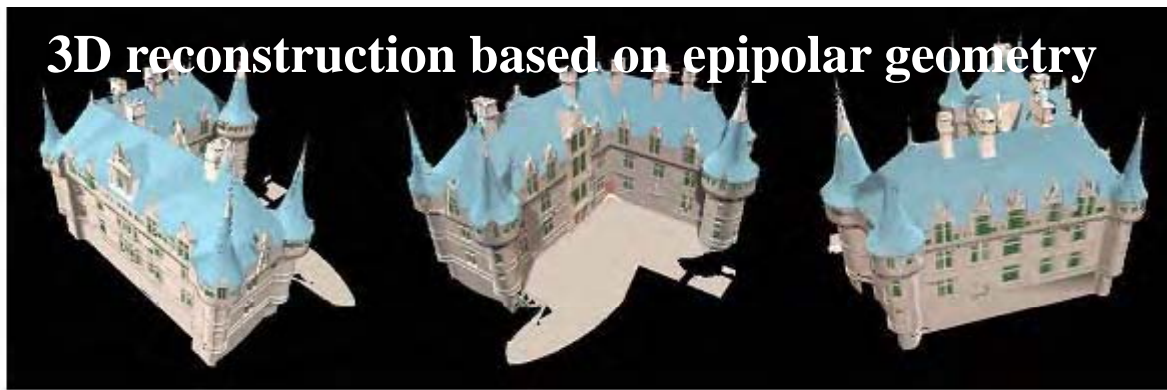
# Comp. Photography: Novel World Depictions



Multiperspective images (MCOP)



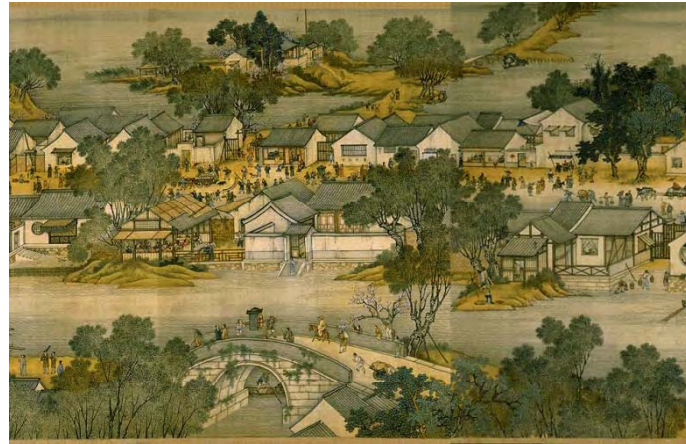
3D reconstruction based on epipolar geometry





# Comp. Photography: Novel World Depictions

Route panorama



Photographing Long Scenes with Multi-Viewpoint Panoramas, SIGGRAPH 2006

# Comp. Photography: Novel World Depictions

Matte extraction: strobing application

Old film of Etienne-Jules Marey



Mosaicing+matting provides a kinetic experience



Visualizing motion is important for video-based applications (PVR, etc.)

# Comp. Photography: Novel World Depictions



Computer generated motion lines

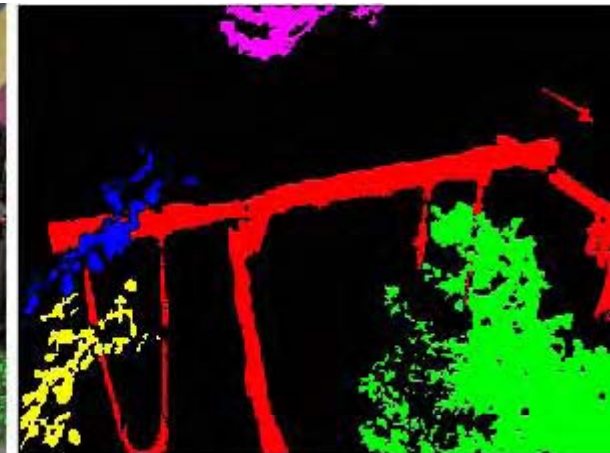
# Computational Photography: Motion amplification



(a) Registered input frame



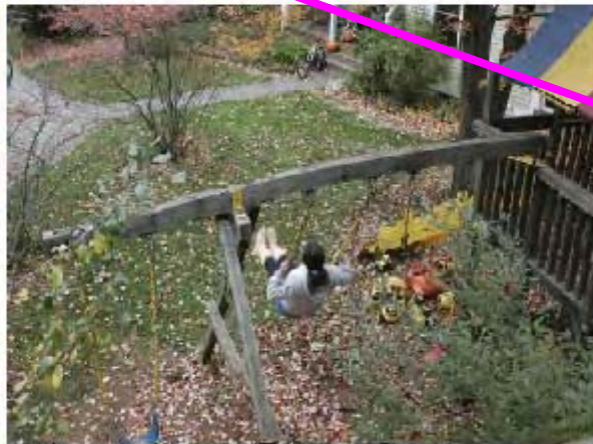
(b) Clustered trajectories of tracked features



(c) Layers of related motion and appearance



(d) Motion magnified, showing holes



(e) After texture in-painting to fill holes



(f) After user's modification to segmentation map in (c)

A video example best described the result  
(Applications to telesurveillance, etc.)

# Computational Photography: Motion amplification

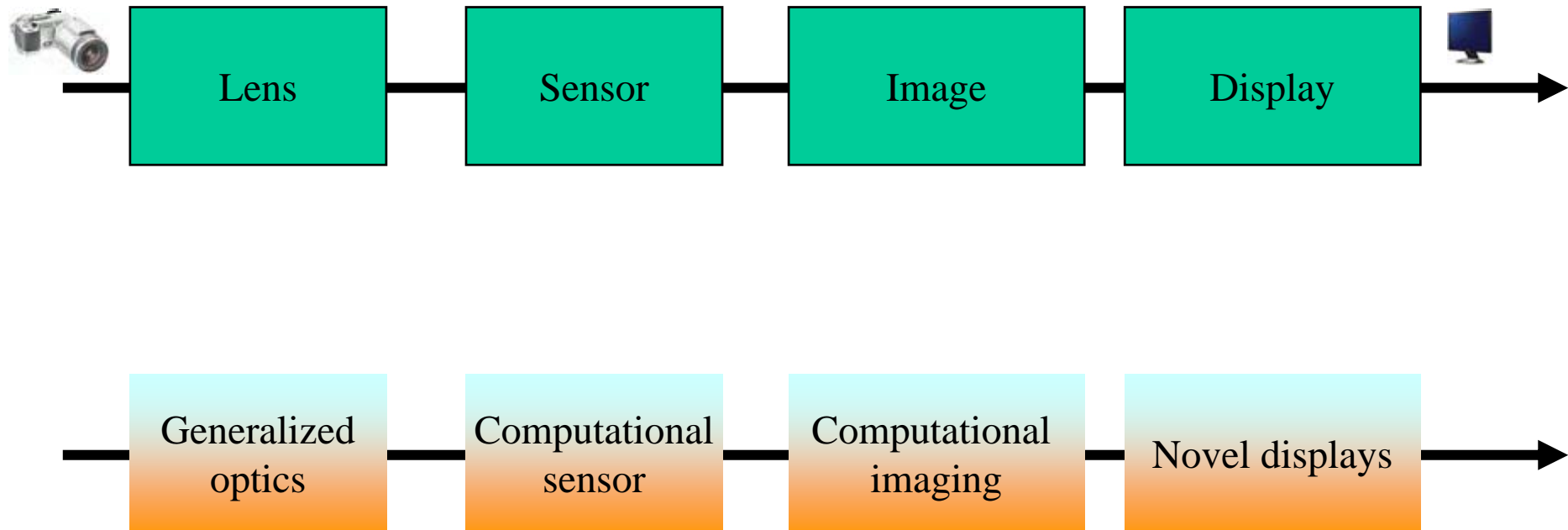


Motion magnification, SIGGRAPH 2005  
<http://people.csail.mit.edu/celiu/motionmag/motionmag.html>

# Computational Photography

## Summary

# Computational Photography



**Computational photography  $\neq$  focal-plane intensities**

# Computational Photography: Announcement

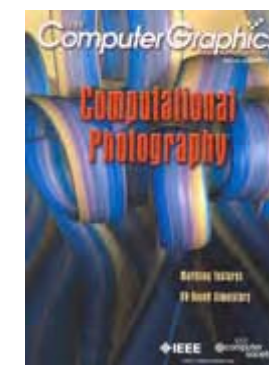
LIX Colloquium at Ecole Polytechnique on  
*Emerging Trends in Visual Computing*

(about 20 guest speakers)

**November 18th-20th** 2008



Fredo Durand, MIT



Ramesh Raskar, MERL

