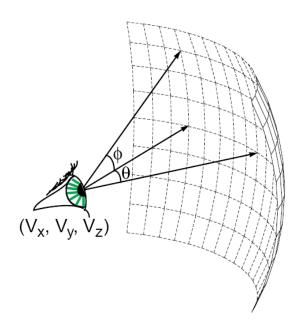
Computational Photography



Definition and basic properties



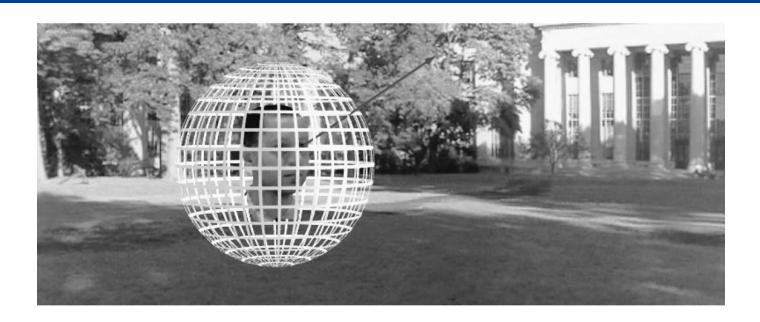
- plenoptic (Latin plenus: full, Greek optic: vision)
- Plenoptic function [Adelson91] describes the radiance at
 - a position in space (3D)
 - in a certain direction (2D)
 - at a particular point in time (1D)
 - in a particular wavelength (1D)
 - $L = P(x, y, z, \theta, \varphi, t, \lambda)$ (7D function)



 Imagine a collection of dynamic environment maps covering the whole space



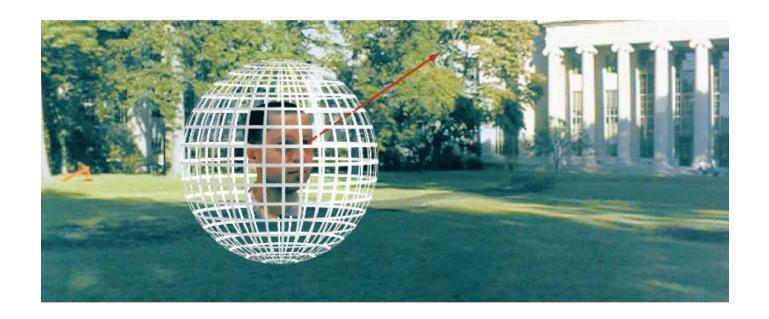
Grayscale snapshot



- Intensity of light $P(\theta, \phi)$
 - Seen from a single view point
 - At a single time
 - Averaged over the wavelengths of the visible spectrum
- (can also do P(x,y); spherical coordinates are nicer)

universität**bonn**

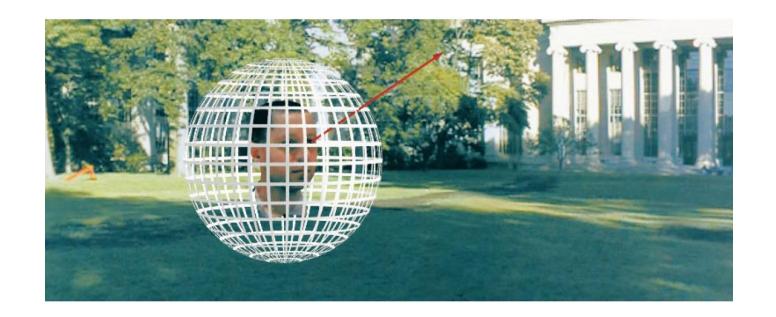
Color snapshot



- Intensity of light $P(\theta, \phi, \lambda)$
 - Seen from a single view point
 - At a single time
 - As a function of wavelength



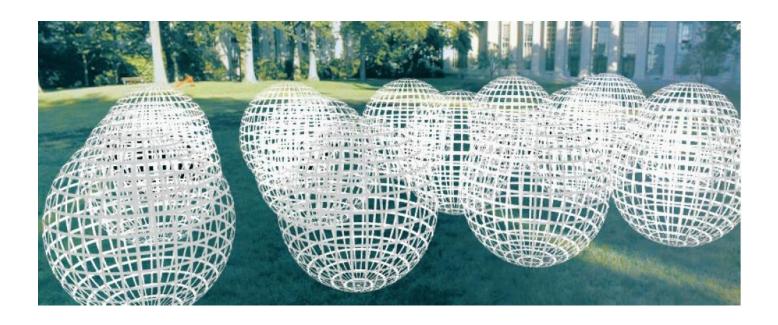
A movie



- Intensity of light $P(\theta, \phi, \lambda, t)$
 - Seen from a single view point
 - Over time
 - As a function of wavelength



Holographic movie



- Intensity of light $P(\theta, \phi, \lambda, t, V_x, V_y, V_z)$
 - Seen from ANY viewpoint
 - Over time
 - As a function of wavelength



- Describes everything that can possibly be seen (and much more)
 - For example, wavelength includes all electromagnetic radiation (not necessarily visible by human observer)
 - Non-physical effects are covered
 - Describes but doesn't explain (for instance, illumination dependency; time variation, wavelength shifting)
- Plenoptic function is unknown, what use does it have?
 - Conceptual tool to group imaging systems according to greater flexibility in view manipulation



- Imaging concepts using sub-sets of the plenoptic function
 - Conventional photograph (2D sub-set of θ, ϕ)
 - Panorama [Chen95] (2D full range of θ, ϕ)
 - Video sequence (3D sub-set of $x, y, z, \theta, \varphi, t$)
 - Light field [Levoy96, Gortler96] (4D sub-set of x, y, z, θ, φ)
 - dynamic light fields [Wilburn05] (5D sub-set of $x, y, z, \theta, \varphi, t$)



- In real imaging systems, radiance is limited in range
 - LDR for conventional cameras
 - HDR



- Drawback: Many scene parameters molded into time parameter, e.g.
 - dynamic scenes
 - illumination changes
 - light material interaction
- Therefore: difficult to edit
- Alternatives (next lecture):
 - Plenoptic illumination function [Wong02]
 - Reflectance fields [Debevec00]



• [McMillan95] use sampled 5D function $(x, y, z, \theta, \varphi)$ on a regular grid

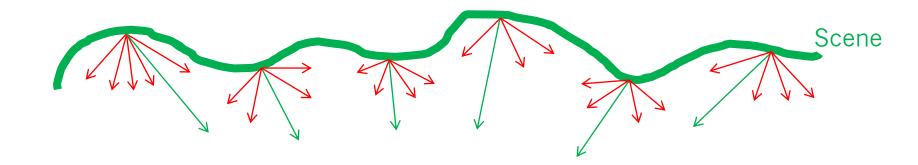
 Interpolate to generate new views

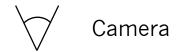


- Light fields are only 4D
 - Free space assumption: radiance is constant along a ray



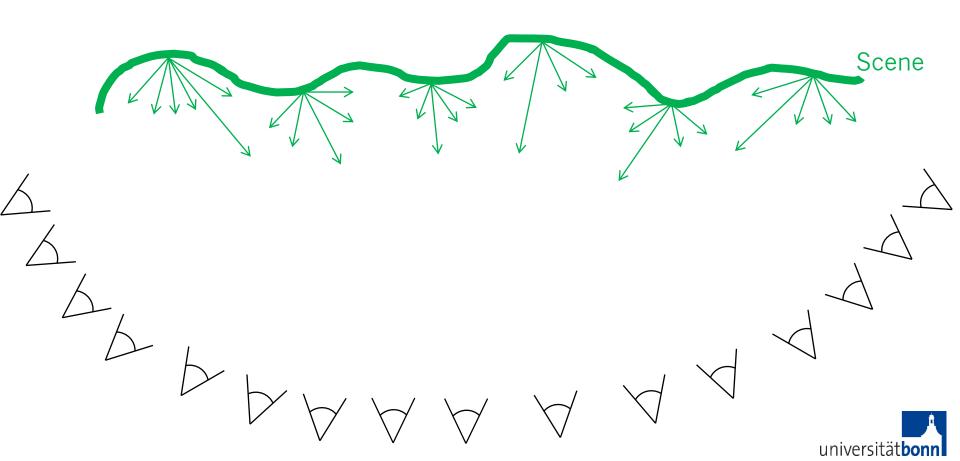
• Normal (2D) photograph



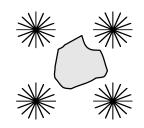




• Light Field (4D)



Space with occluders – 5D



Outside – in viewing

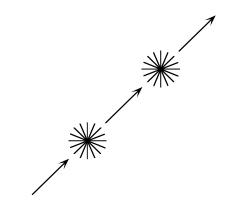
Free space

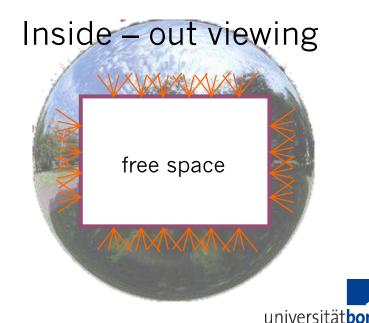


Free space

Free space

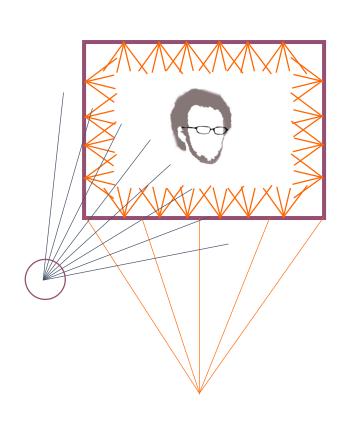
Free space, radiance stays constant along the ray - 4D

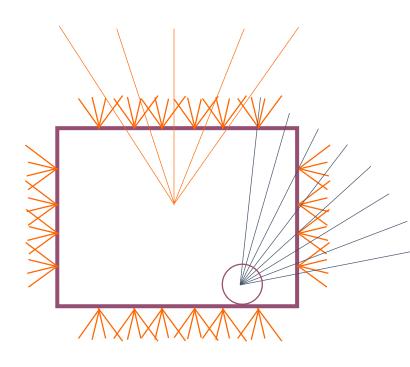




Light Fields – Principle of View Synthesis

Re-arrange ray samples to generate new views







Light Fields – Properties

- Advantages
 - Rendering complexity is independent of scene complexity
 - Display algorithms are fast
 - Complex view-dependent effects are simple (no mathematical model required)
- Disadvantages

 - Difficult to edit (no model)



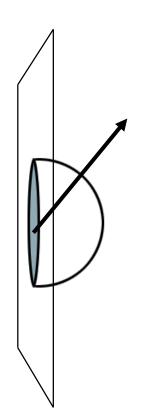
Light Fields – Parameterizations

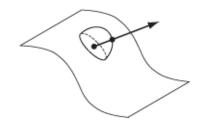
- Need a way to parameterize rays in space for simple sampling and retrieval
- Should be adapted to sensor geometry
- New view synthesis should be fast
- Let's consider some candidate parametrizations



Light Fields – Parameterizations

- Point on plane + direction $L(u, v, \theta, \varphi)$
 - Mixture between Cartesian and trigonometric parameters
 - Inefficient to evaluate
 - Non-uniform sampling
 - Directional interpolation difficult
- Alternatively arbitrary surface + direction,
 - Should be convex to avoid duplicates

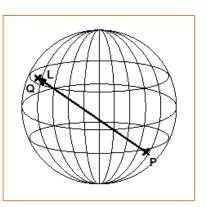






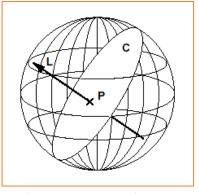
Light Fields – Parameterizations

- Two points on sphere [Camahort98]
 - Uniform sampling
 - Needs a uniform subdivision of sphere into patches
 - Needs a way to sample single rays
 - Difficult for real scenes



 $L(\theta_1, \phi_1, \theta_2, \phi_2)$

- Great circle + point on disk [Camahort98]
 - Uniform sampling
 - Needs orthographic projections to disk
 - less difficult than 2PS parametrization

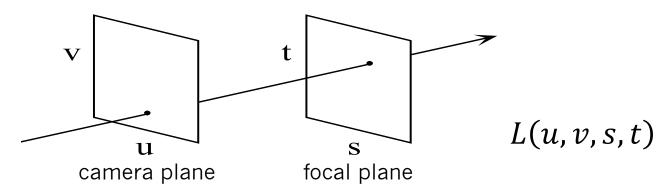


 $L(u, v, \theta_2, \phi_2)$



Light Fields - Parametrizations

Two-plane parametrization (light slab) [Levoy96]

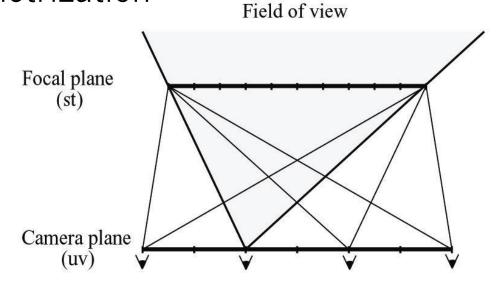


- Fast display algorithms (projective geometry)
- Simple interpretation (array of images)
- Most commonly used parametrization
- Drawback: only in one major direction
 - Covering 360° requires at least 6 light slabs [Gortler96]
 - Switching from one slab to the next introduces artifacts (disparity problem)



Light Fields – Parametrizations

Light field generation with two-plane parametrization

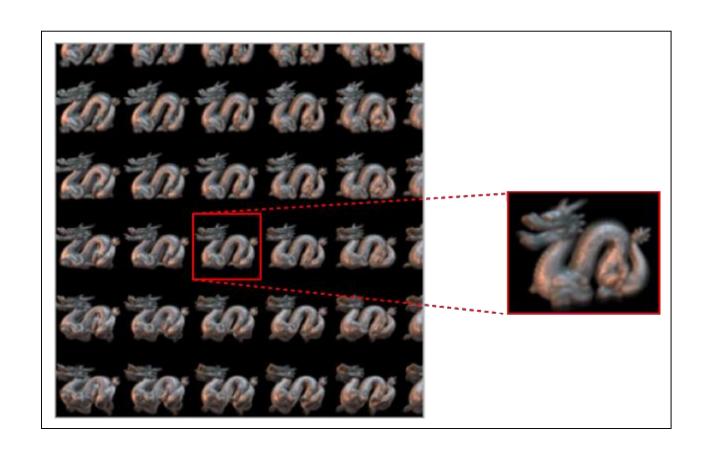


- Off-axis perspective projections
- Normal camera images need (simple) re-sampling



Light Fields – Parametrizations

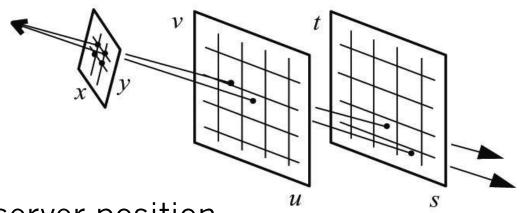
 A two-plane parametrized light field is basically a collection of images





Light Fields – Parametrizations

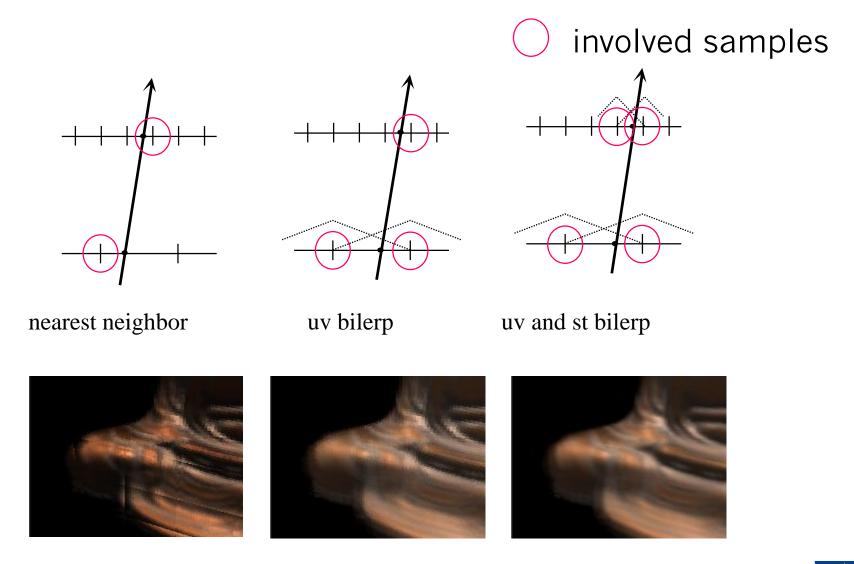
View generation from two-plane parametrization



- At an observer position
 - Project (u, v) and (s, t) parameter planes into virtual view (x, y)
 - For each pixel in virtual view use projected (u, v, s, t) to look up radiance L(u, v, s, t)
 - Two perspective projections and one look-up determine virtual view → efficient rendering

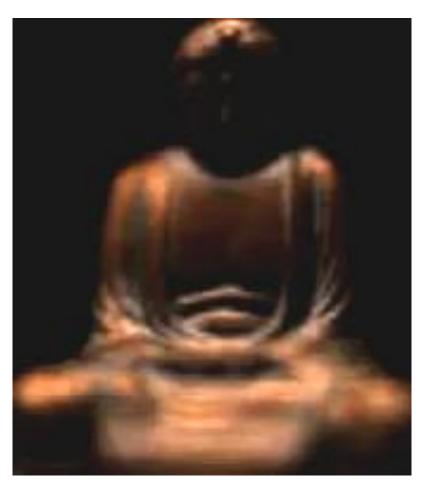


Light Fields – Rendering 2D

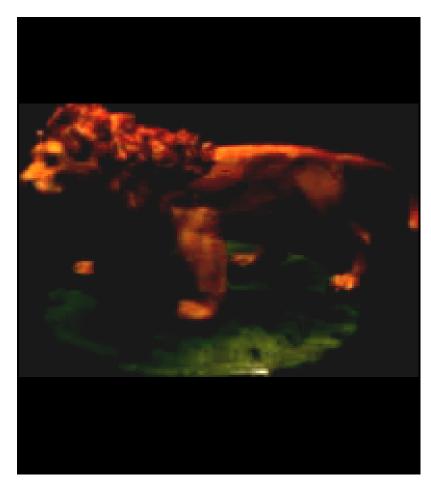




Light Field Rendering – Examples [Levoy1996]



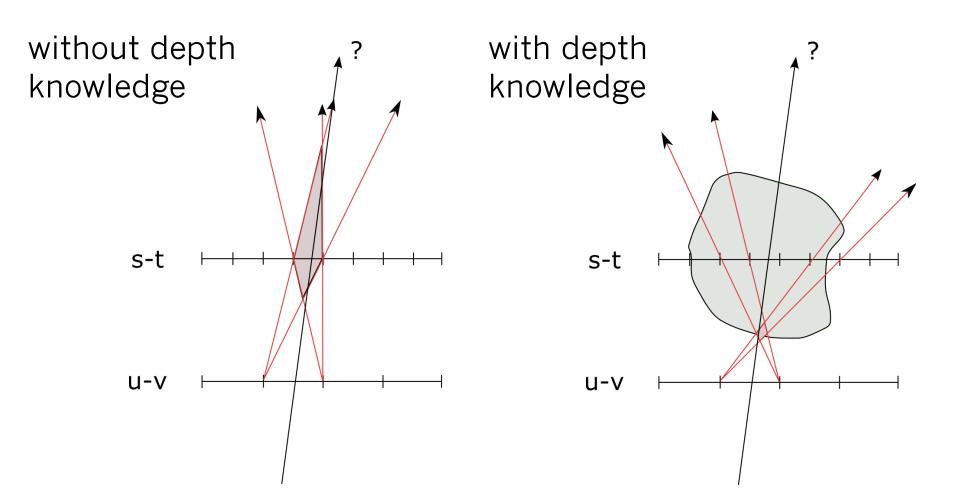
16x16 images 1 slab



32 x 16 images 4 slabs



Depth Assisted Light Fields [Gortler96]



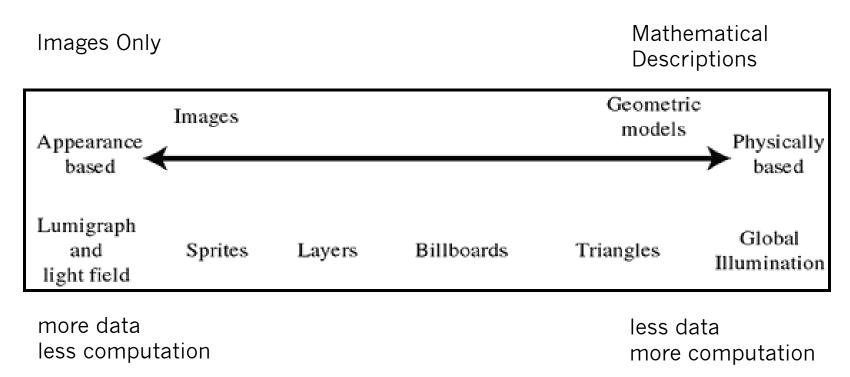
different pixels have to be interpolated!





Image-based vs. Model-based Rendering

 trade-off between image-based and model-based rendering approaches



- Is there a way to find a good trade-off?
- need some signal processing for analysis



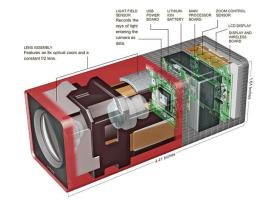
Capturing light fields

Using calibrated gantries [Levoy1996]

Using camera arrays [Wilburn2005]



Using lenslet arrays [Ng2005]



• Using hand-held devices [Gortler1996, Davis2012] (requires camera tracking)



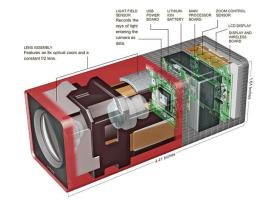
Capturing light fields

Using calibrated gantries [Levoy1996]

Using camera arrays [Wilburn2005]



Using lenslet arrays [Ng2005]



• Using hand-held devices [Gortler1996, Davis2012] (requires camera tracking)



"Plenoptic camera"

Integral photography [Lippmann 1908]

EPREUVES RÉVERSIBLES

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donc un large faisceau qui converge vers A (voir fig. 1): c'est un faisceau large, puisqu'il a pour base toute la plaque sensible, ou du moins toute la partie de cette plaque d'où le point A était visible (1).

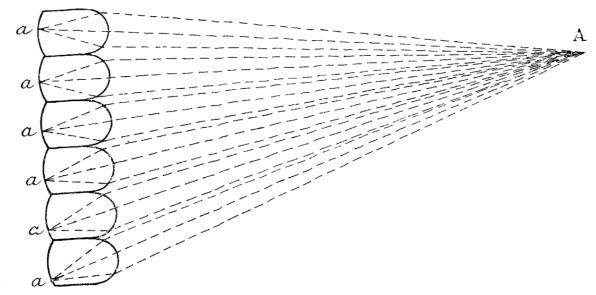
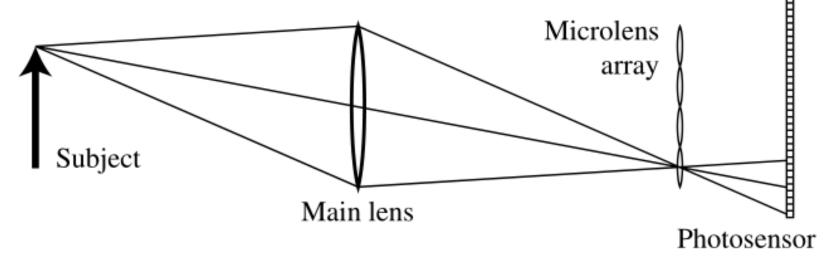


Fig. 1.



"Plenoptic camera" [Ng2005]

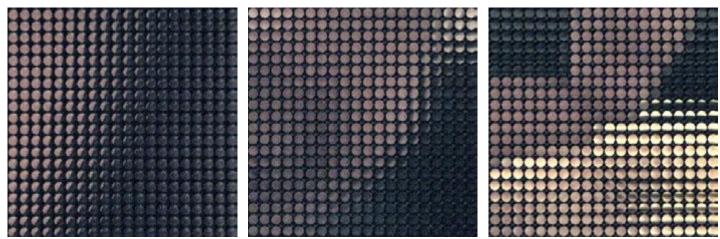
 Lenslet array resolves pixels by direction, or intersection with main aperture





[Ng2005]







How to make the best use of sensor pixels

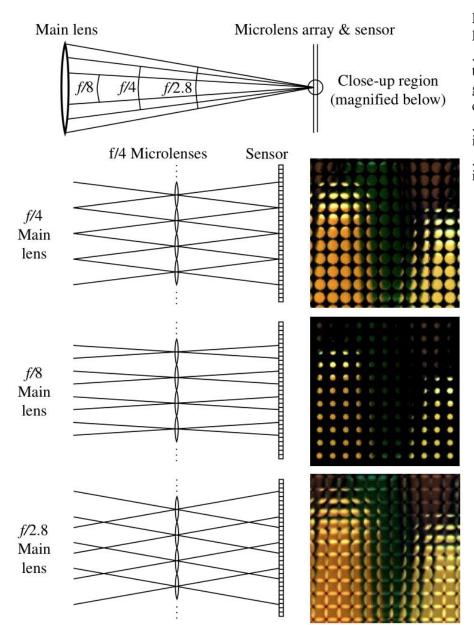


Figure 2: Illustration of matching main lens and microlens f-numbers. Top: Extreme convergence rays for a main lens stopped down to f/2.8, f/4 and f/8. The circled region is shown magnified for each of these f-stops, with the extreme convergence rays arriving at microlenses in the manigifed region. The images show close-ups of raw light field data collected under conditions shown in the ray diagrams. When the main lens and microlens f-numbers are matched at f/4, the images under the microlenses are maximal in size without overlapping. When the main lens is stopped down to f/8, the images are too small, and resolution is wasted. When the main lens is opened up to f/2.8, the images are too large and overlap.

• [Ng2005]



Mathematical analysis of light fields

Epipolar-plane images (EPI)

• Frequency-domain analysis

Fourier slice theorem



Epipolar plane images (EPI) [Bolles1987]

 2D Light field mapped out over two-plane parameters:



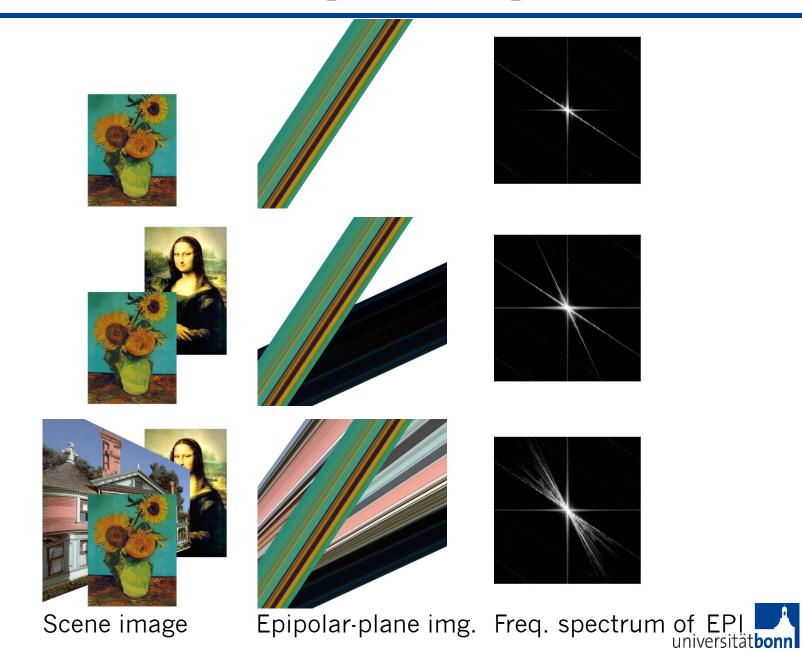




• Slope = depth Images from [Kim2013]



EPI in Fourier domain [Chai2000]



Depth from EPI [Wanner2013]

 Use structure tensor I to extract depth from epipolar-plane image:

$$J = \begin{bmatrix} G_{\sigma} * (S_x S_x) & G_{\sigma} * (S_x S_y) \\ G_{\sigma} * (S_x S_y) & G_{\sigma} * (S_y S_y) \end{bmatrix} = \begin{bmatrix} J_{xx} & J_{xy} \\ J_{xy} & J_{yy} \end{bmatrix}$$

$$G_{\sigma} : \text{Gaussian} \qquad S_{x,y} :$$

$$\text{smoothing} \qquad \text{Gradient}$$

$$\text{kernel} \qquad \text{components}$$

The direction of the local level lines can then be computed via [5]

$$\mathbf{n}_{y^*,t^*} = \begin{bmatrix} \Delta x \\ \Delta s \end{bmatrix} = \begin{bmatrix} \sin(\varphi) \\ \cos(\varphi) \end{bmatrix}$$
with $\varphi = \frac{1}{2} \arctan\left(\frac{J_{yy} - J_{xx}}{2J_{xy}}\right)$, (5)

from which we derive the local depth estimate via f = distanceequation (3) as

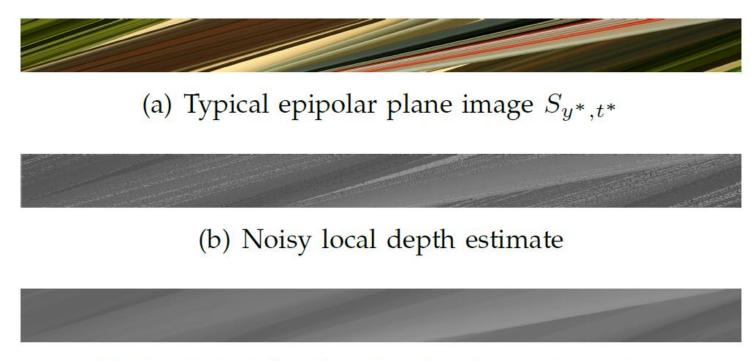
$$Z = -f \frac{\Delta s}{\Delta x}.$$
(6)

Disparity: $d_{y^*,t^*} = \frac{f}{z} = \frac{\Delta x}{\Delta s} = \tan \phi$: pixel shift of a scene point when moving between the views



Denoising [Wanner2013]

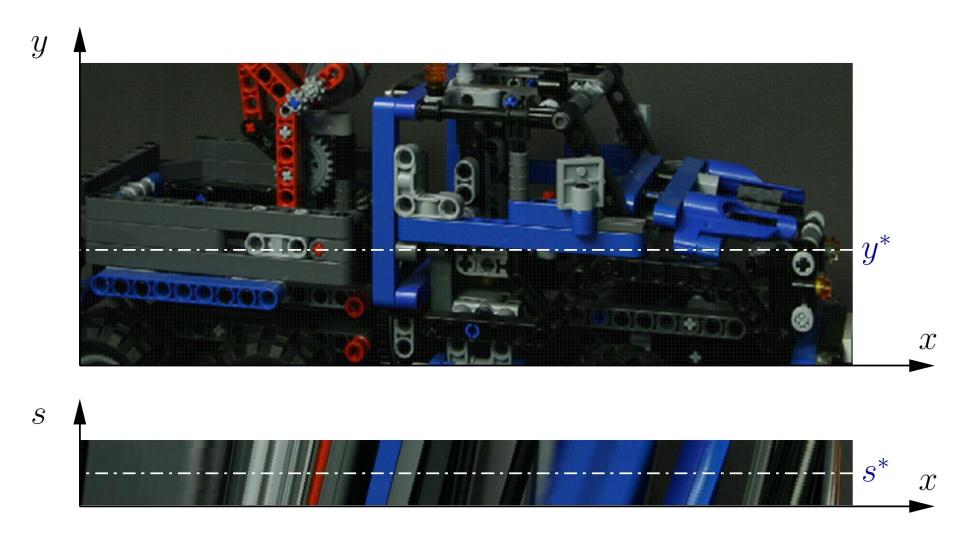
• Filter local disparity estimate to obtain global depth estimate u for each view (s,t):



(c) Consistent depth estimate after optimization



Non-Lambertian (non-diffuse) scenes





Light field manipulation

 Propagation shears EPI (direction stay the same; positions change proportionally to direction)

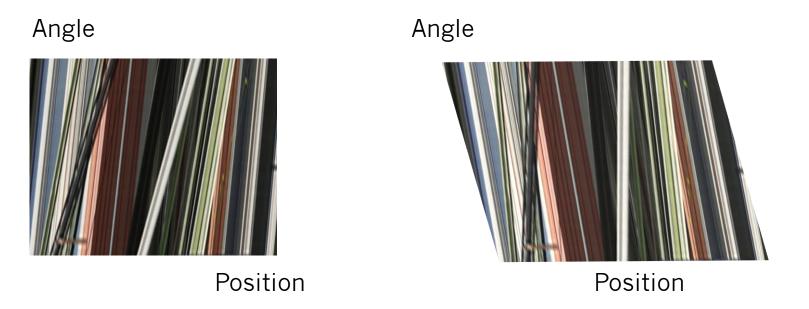
Angle Angle

Position Position



Light field manipulation

 Taking an in-focus image: Propagate (shear) EPI until features become vertical! Then project down

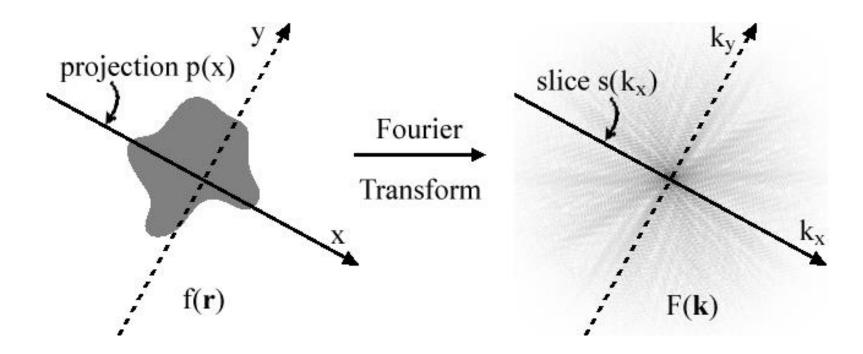


Alternatively, project along slanted direction



Fourier slice theorem (projection-slice theorem)

- Remember the convolution theorem?
- Focus (projection) can be expressed the same way

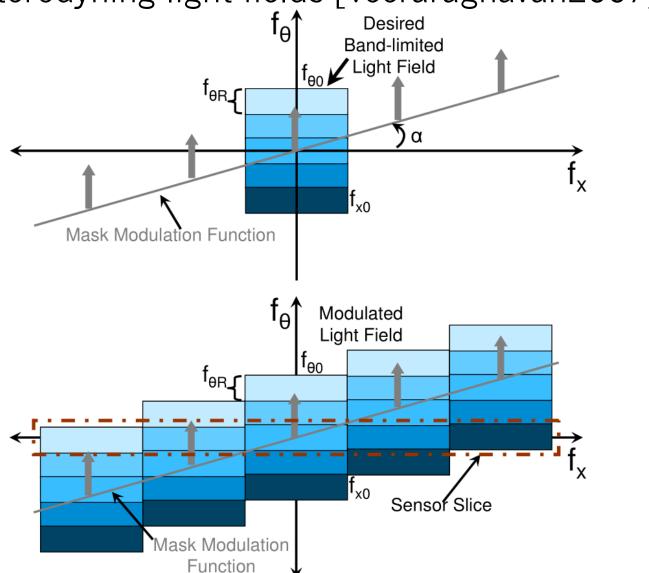


 Projection in one domain maps to slicing in other domain [Ng2005]



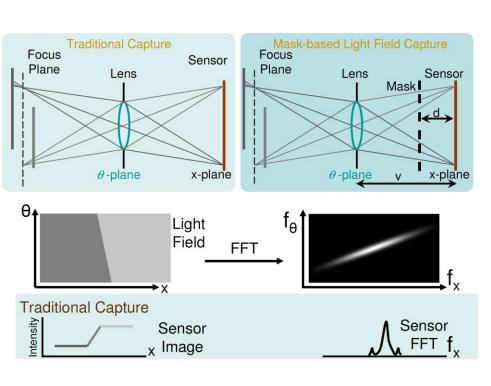
Example of Fourier-space manipulation

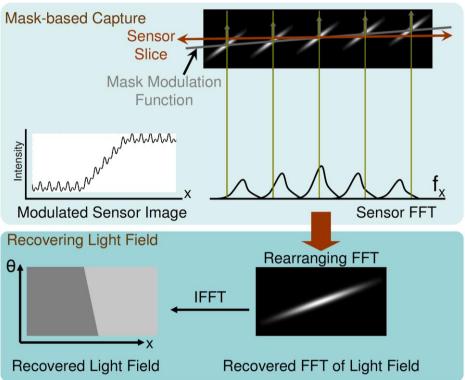
Heterodyning light fields [Veeraraghavan2007]





Heterodyning by multiplicative mask

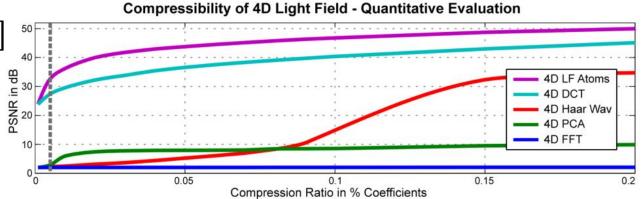


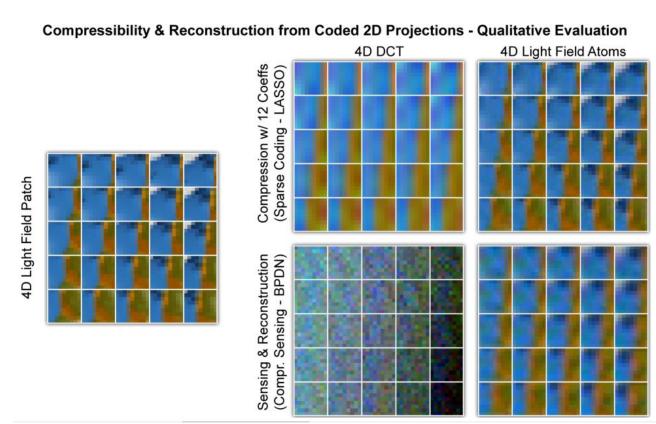




Compressive acquisition of light fields

• [Marwah2013]





Compressive LF photography [Marwah2013]

 Setup very similar to mask-based LF camera – but operated differently:

> use multiple random mask patterns, solve linear system

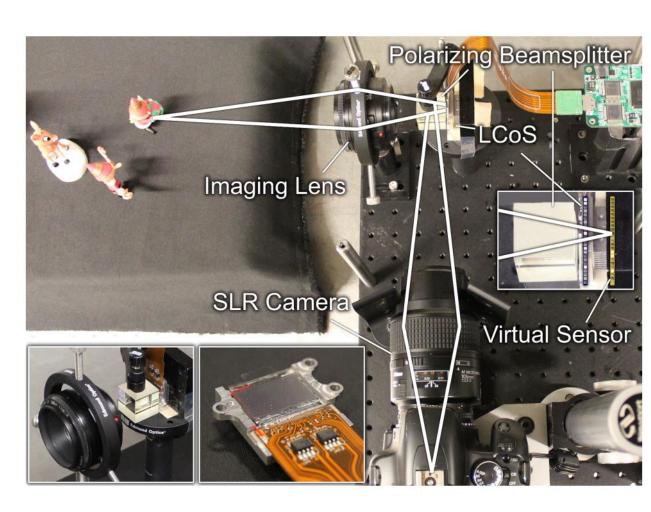


Figure 9: Prototype light field camera. We implement an optical relay system that emulates a spatial light modulator (SLM) being mounted at a slight offset in front of the sensor (right inset). We employ a reflective LCoS as the SLM (lower left insets).

References

- [Lippmann1908] G. Lippmann, Épreuves réversibles donnant la sensation du relief. Comptes Rendus de l'Académie des Sciences 146 (9): 446–451.
- [Adelson1991] E. H. Adelson, J. R. Bergen, "The Plenoptic Function and the Elements of Early Vision", Computation Models of Visual Processing, 1991
- [Gortler1996] S. J. Gortler et al., "The Lumigraph", SIGGRAPH 1996, pp. 43-54.
- [Levoy1996] M. Levoy, P. Hanrahan, "Light Field Rendering", SIGGRAPH 1996, pp. 31-42.
- [Chai2000] JX. Chai et al., "Plenoptic Sampling", SIGGRAPH 2000, pp.307-318.
- [Ng2005] R. Ng et al., "Light Field Photography with a Hand-held Plenoptic Camera", Stanford Tech. Report CTSR 2005-02.
- [Veeraraghavan2007] A. Veeraraghavan et al., Dappled Photography: Mask Enhanced Cameras for Heterodyned Light Fields and Coded Aperture Refocusing (Proc. SIGGRAPH 2007).
- [Wanner2013] S. Wanner and B. Goldlücke, Variational Light Field Analysis for Disparity Estimation and Super-Resolution. IEEE TPAMI.
- [Bolles1987] R. Bolles et al., "Epipolar-plane image analysis: An approach to determining structure from motion", IJCV 1(1), 1987.
- [Kim2013] C. Kim et al., Scene Reconstruction from High Spatio-Angular Resolution Light Fields (SIGGRAPH 2013).
- [Marwah2013] K. Marwah et al., Compressive Light Field Photography using Overcomplete Dictionaries and Optimized Projections (SIGGRAPH 2013)

