#### L1b: Cameras, Sampling, Calibration

2018 IEEE SPS Summer School on Light Field Data Representation, Interpretation, and Compression



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## Schedule









Lecture 1a: Introduction to Light Fields

**Lecture 1b: Cameras, Sampling, & Calibration** Review: 2D Image Geometry Sampling Patterns Decoding, Calibration, Rectification An interpolating renderer

Lecture 1c: Basic Processing

Hands-on: Writing a renderer, handling light fields in matlab



## Review: Image Transformations

$$
\begin{aligned}\n\begin{bmatrix}\nx_1 \\
y_1\n\end{bmatrix} &= \begin{bmatrix}\n\cos \theta_0 & -\sin \theta_0 \\
\sin \theta_0 & \cos \theta_0\n\end{bmatrix} \begin{bmatrix}\nx_0 \\
y_0\n\end{bmatrix} + \begin{bmatrix}\n\Delta x_0 \\
\Delta y_0\n\end{bmatrix} \\
\boldsymbol{p_i} &= [x_i, y_i]^{\mathsf{T}} & \boldsymbol{t_i} = [\Delta x_i, \Delta y_i]^{\mathsf{T}} & R_i = \begin{bmatrix}\n\cos \theta_i & -\sin \theta_i \\
\sin \theta_i & \cos \theta_i\n\end{bmatrix} \\
\boldsymbol{p_1} &= R_0 \boldsymbol{p_0} + \boldsymbol{t_0} \\
\boldsymbol{p_2} &= R_1 \boldsymbol{p_1} + \boldsymbol{t_1} \\
&= R_1 (R_0 \boldsymbol{p_0} + \boldsymbol{t_0}) + \boldsymbol{t_1}\n\end{aligned}
$$

… Concatenation is cumbersome



## Again with Homogeneous Coordinates

$$
\begin{bmatrix} x_1 \\ y_1 \\ 1 \end{bmatrix} = \begin{bmatrix} \cos \theta_0 & -\sin \theta_0 & \Delta x_0 \\ \sin \theta_0 & \cos \theta_0 & \Delta y_0 \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} x_0 \\ y_0 \\ 1 \end{bmatrix}
$$

$$
\boldsymbol{p_i} = [x_i, y_i, 1]^{\text{T}} \qquad H_i = \begin{bmatrix} \cos \theta_i & -\sin \theta_i & \Delta x_i \\ \sin \theta_i & \cos \theta_i & \Delta y_i \\ 0 & 0 & 1 \end{bmatrix}
$$

 $\bm{p_1} = H_0 \bm{p_0}$  $p_2 = H_1 p_1 = H_1 H_0 p_0$ 

… Concatenation is matrix multiplication, much nicer



## Review: Image Transformations

Projective 8dof

 $h_{11}$ 

Affine 6dof

Similarity 4dof

Euclidean

3dof





Projective transform between two camera views

Image registration, stitching, ... Planar scene only!

Image c/o Mark Pollefeys http://slideplayer.com/slide/5947732/ 666 and the computation of  $6\,$ 



## Review: Camera Calibration

#### Extrinsics (pose):



Intrinsics (pixel-ray mapping):



Radial lens distortion:

$$
\begin{bmatrix} x_d \\ y_d \end{bmatrix} = \left(1 + k_1^{(Z)}r^2 + k_2^{(Z)}r^4\right) \begin{bmatrix} x_u \\ y_u \end{bmatrix}
$$
  
where  $r = \sqrt{x_u^2 + y_u^2}$ 

For N<sub>poses</sub> poses

Estimate 6N<sub>poses</sub> extrinsics 4 intrinsics  $\sim$ 3 radial distortion



## Camera Sampling Patterns



## Light Field Cameras



Stanford camera array



## Sampling Patterns



For ideal cameras  $w$  are typically 4D parallelograms in ray space Note rays are defined by *s,t,u,v* in meters; pixels by *i,j* indices (and later *i,j,k,l*)



## Example 1: Pinhole Camera





Pinhole: w are infinitesimal in *s* Finite pixels:  $w$  have width in U



## Example 2: Thin-Lens Camera



Calibration generally maps out the centroids of the *w* quads



### Camera Intrinsics

We can write a simple expression relating pixel index to patch center If we set plane separation D=1m, *H* is a conventional camera intrinsic matrix







#### Lenslet-Based LF Camera





## Simplifed Lenslet Camera





## Less Simplified Lenslet Camera



$$
\begin{bmatrix} s \\ t \\ U \\ V \\ 1 \end{bmatrix} = \begin{bmatrix} h_{1,1} & 0 & h_{1,3} & 0 & h_{1,5} \\ 0 & h_{2,2} & 0 & h_{2,4} & h_{2,5} \\ h_{3,1} & 0 & h_{3,3} & 0 & h_{3,5} \\ 0 & h_{4,2} & 0 & h_{4,4} & h_{4,5} \\ 0 & 0 & 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} i \\ j \\ k \\ l \\ 1 \end{bmatrix}
$$



## Less Simplifed Lenslet Camera





## Even Less Simplifed: Lens Distortion



[Image c/o Ihrke et al 2016] Unrectified Illum image: distortion in u,v

#### Distortion is in 4D, not only 2D



Solution: "rectify" (unwarp) images before using instrinsic model Usually needs calibration to be accurate



## Decoding, Calibration, Rectification



## Decoding, Calibration, Rectification



**Decoding**: Converting from raw input (2D in case of lenslet camera) to a 4D light field in a desired parameterization

**Calibration**: modelling the camera's intrinsics (and lens distortion) to map pixels to rays and vice-versa



**Rectification**: Undoing lens distortion

Depending on access to hardware and needs of a project, different combinations will be appropriate

## Camera Array: Full Metric Calibration



Per-camera intrinsics, extrinsics, lens distortion *Hard, but can use priors: close to grid; similar lenses*

$$
\begin{bmatrix} s \ t \ t \ V \ 1 \end{bmatrix} = \begin{bmatrix} 0 & 0 & h_{3,3} & 0 & h_{1,5} \\ 0 & 0 & 0 & h_{4,4} & h_{2,5} \\ h_{3,1} & 0 & h_{3,3} & 0 & h_{3,5} \\ 0 & h_{4,2} & 0 & h_{4,4} & h_{4,5} \\ 0 & 0 & 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} i \\ j \\ k \\ l \\ 1 \end{bmatrix}
$$





## Camera Array: Non-Metric Calibration



Assume rotation error dominates Co-register all images to a common view (e.g. center view) *At a specific depth plane: Homography*



Animation: cycling through views of LF



## Homographies for Array Registration



Pairwise homographies  $\rightarrow$  Co-registered LF Register each with center view



## Camera Array: Non-Metric Calibration



Errors in rotation get corrected

We can do a lot with the LF even without metric information



## Lenslet Camera: Metric Calibration

Extrinsics, intrinsics, radial lens distortion

$$
\begin{bmatrix} s \ t \ t \ V \ 1 \end{bmatrix} = \begin{bmatrix} h_{1,1} & 0 & h_{1,3} & 0 & h_{1,5} \\ 0 & h_{2,2} & 0 & h_{2,4} & h_{2,5} \\ h_{3,1} & 0 & h_{3,3} & 0 & h_{3,5} \\ 0 & h_{4,2} & 0 & h_{4,4} & h_{4,5} \\ 0 & 0 & 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} i \\ j \\ k \\ l \\ 1 \end{bmatrix}
$$





# Lenslet Camera Decode Only (no calibration)



Raw lenslet image after 2D debayering and devignetting (cropped)

Flat-field white image (crop)





## Decode from Lenslet Image to 4D





## Example Decode (Light Field Toolbox, no rectification)





Gantry LF for comparison [LF c/o Stanford]

#### Animation: Lytro Illum image Decoded with LF Toolbox



## Rectifcation without Calibration (Lytro Power Tools Beta, no H matrix)



Uses an idealized lens model to undo lens distortion

#### Animation: Lytro Power Tools rectified output



## Rectifcation with Calibration (Light Field Toolbox, Calibrated)



Unrectified, rectified samples overlaid Calibrated rectification includes metric H

Lytro Illum image Decoded with LF Toolbox



## A Simple Renderer



#### Given a light field render novel 2D perspective views



Describe camera's rays As though at origin Position + direction

Transform each ray using camera's pose

Intersect each ray with s,t and u,v planes, yielding a list of rays *Φ*



## A Simple Renderer



Convert the list of rays *Φ* to a list of fractional indices **n**

**n** = H-1 *Φ*

Interpolate to estimate the light field's value at *n*

 $I = L(n)$ 



#### Points to Ponder

When rendering, should we interpolate in u,v; in s,t; in s,u, ... or ...?

How will aliasing affect the rendering?

