



# Image-Based Rendering Using Image Warping



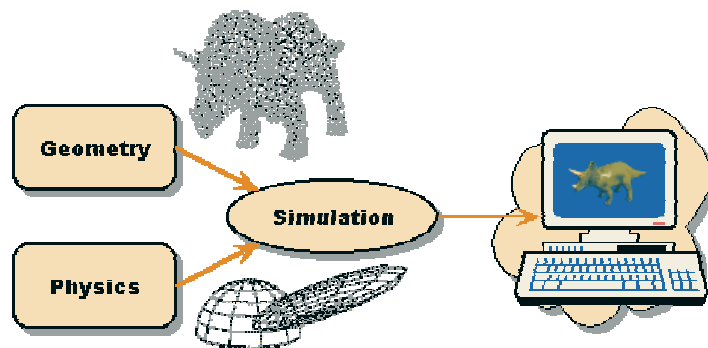
Leonard McMillan  
LCS Computer Graphics Group  
MIT



# Conventional 3-D Graphics



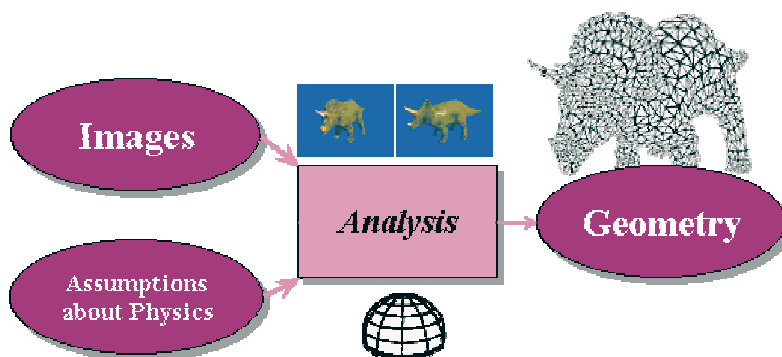
✓ Simulation





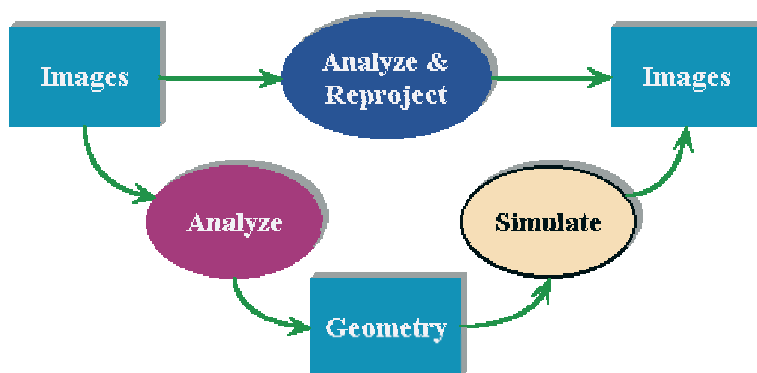
# Computer Vision

## ✓ Analysis



# The Image-Based Approach

## ✓ Transformation





## Images as a Collection of Rays

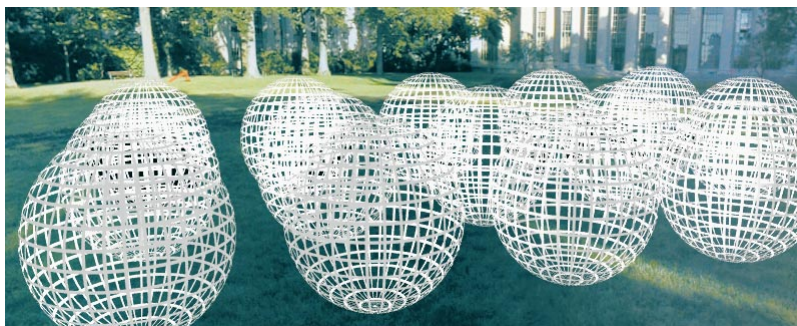


An image is a subset of the rays seen from a given point  
- this "space" of rays occupies two dimensions



## The Plenoptic Function

✓ The set of rays seen from all points ...

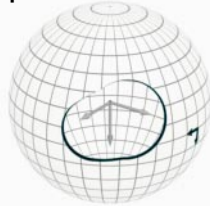


$$p = P(\theta, \phi, x, y, z, \lambda, t)$$



## Image-based rendering is about

...reconstructing a plenoptic function from a set of samples taken from it.



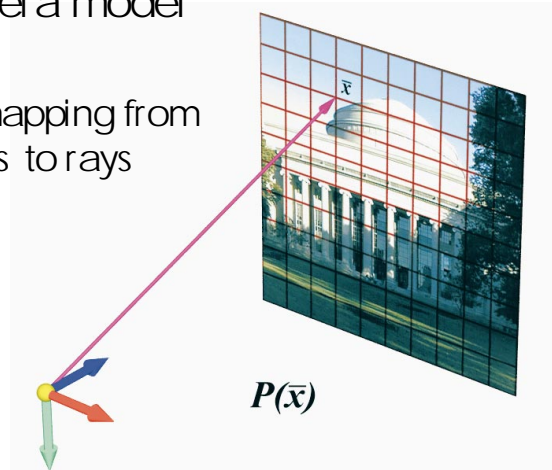
- ✓ Ignoring time, and selecting a discrete set of wavelengths gives a 5-D plenoptic function



## Where to Begin?

- ✓ Pinhole camera model

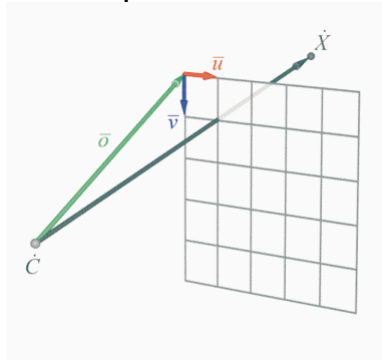
- Defines a mapping from image points to rays in space





# Mapping from Rays to Points

## Simple Derivation

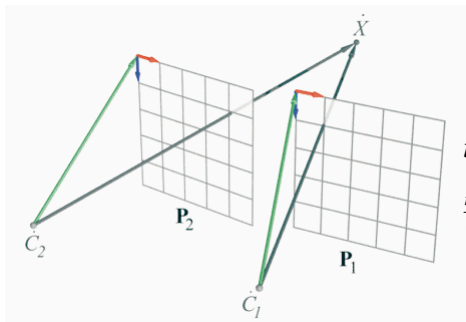


$$P = \begin{bmatrix} u_x & v_x & o_x \\ u_y & v_y & o_y \\ u_z & v_z & o_z \end{bmatrix}$$

$$\dot{X} = \dot{C} + t P \vec{x}$$



# Correspondence



$$\dot{C}_2 + t_2 P_2 \vec{x}_2 = \dot{C}_1 + t_1 P_1 \vec{x}_1$$

$$t_2 P_2 \vec{x}_2 = \dot{C}_1 - \dot{C}_2 + t_1 P_1 \vec{x}_1$$

$$t_2 \vec{x}_2 = P_2^{-1} (\dot{C}_1 - \dot{C}_2) + t_1 P_2^{-1} P_1 \vec{x}_1$$

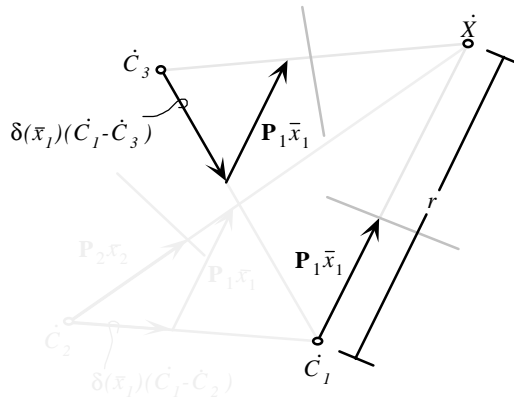
$$\frac{t_2}{t_1} \vec{x}_2 = \frac{1}{t_1} P_2^{-1} (\dot{C}_1 - \dot{C}_2) + P_2^{-1} P_1 \vec{x}_1$$

$$\vec{x}_2 \doteq \underbrace{\frac{1}{t_1}}_{\delta} P_2^{-1} \underbrace{(\dot{C}_1 - \dot{C}_2)}_{e_{21}} + \underbrace{P_2^{-1} P_1}_{H_{21}} \vec{x}_1$$



# Planar Warping Equation

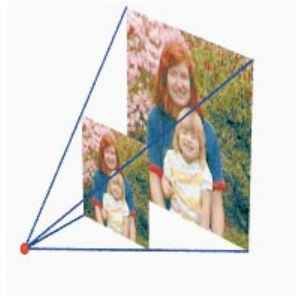
$$\vec{x}_2 \doteq \delta(\vec{x}_1)P_2^{-1}(\dot{C}_1 - \dot{C}_2) + P_2^{-1}P_1\vec{x}_1$$



# Resulting Warping Function

✓ A perturbed planar warp ...

$$\vec{x}_2 = \delta\vec{e}_2 + H_1\vec{x}_1$$





SIGGRAPH

## Special Case

✓ A simple Planar warp

$$\vec{x}_2 = H_{21} \vec{x}_1$$



SIGGRAPH

## Warping in Action

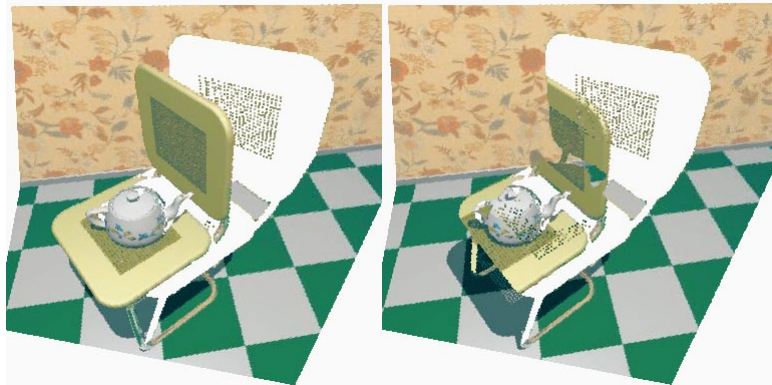
✓ A 3D Warp





## Visibility

- ✓ The warping equation determines where points go...

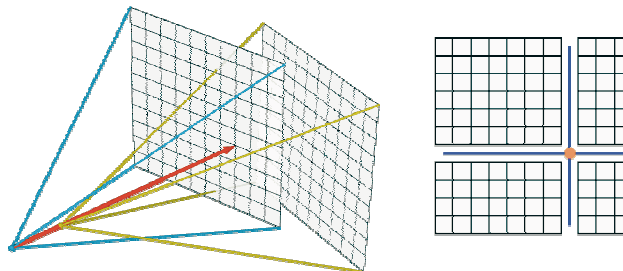


... but that is not sufficient



## Partition Reference Image

- ✓ Project the *desired* center-of-projection onto the reference image

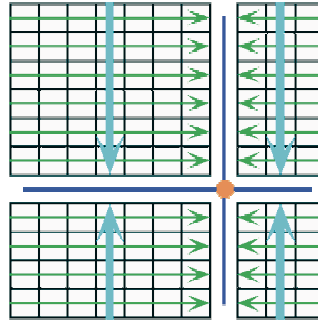






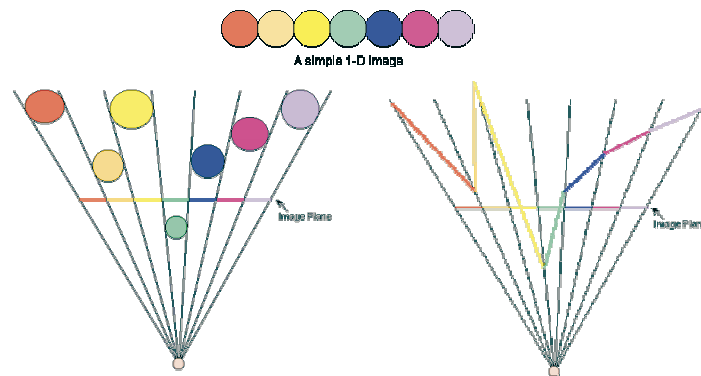
## E numeration

- ✓ Drawing toward the projected point guarantees an *occlusion compatible* ordering
- ✓ Ordering is consistent with a painter's algorithm
- ✓ Independent of the scene's contents
- ✓ Easily generalized to other viewing surfaces
- ✓ No auxiliary information required



## R econstruction

- ✓ Typical images are discrete, not continuous
- ✓ An image can be formed by different geometries





## Gaussian Cloud Model



- ✓ Represents samples as Gaussian cloud densities
- ✓ Excessive exposure errors



## Bilinear Patch Model



- ✓ Fits a bilinear patch through grid points in reference image
- ✓ Excessive occlusion errors



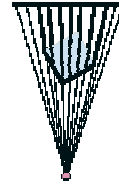
## Comparison of Models

### ✓ Gaussian-Cloud Model



- Excessive exposure errors
- Pinhole problems
- Generally preferred

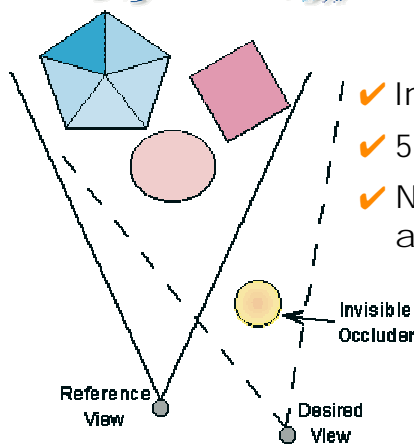
### ✓ Bilinear-Patch Model



- Excessive occlusion errors
- Rasterization HW
- Difficult to navigate



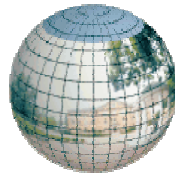
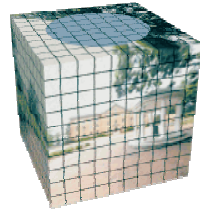
## Problems with Planar Cameras



- ✓ Invisible occluder problem
- ✓ 5 intrinsic parameters
- ✓ Non-uniform sampling of solid angle



## Panoramic Cameras

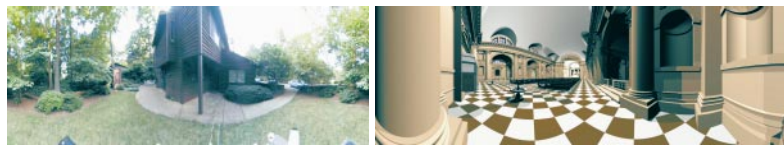


- ✓ Warping equation can be easily adapted
- ✓ Visibility algorithm works
- ✓ Nonlinear mapping functions



## Examples

- ✓ Cylindrical camera



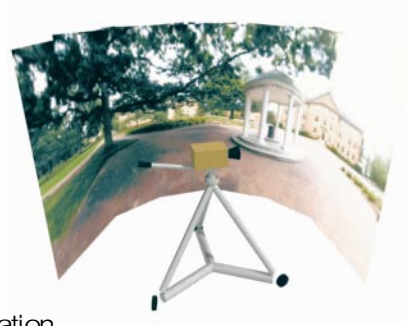


## Constructing Panoramas

- ✓ Images are related by a projective transforms

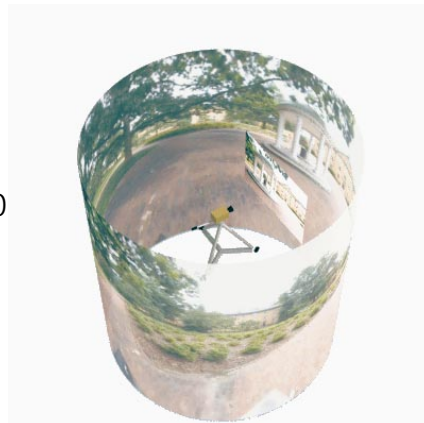
$$\vec{x}_2 = H_{21} \vec{x}_1$$

- ✓ Optimization problem
  - maximize normalized correlation
  - minimize sum of squared error



## Initial Guesses and Constraints

- ✓ Sum of angles is  $2\pi$ 
  - constrains focal length
- ✓ Skew of camera is near 0
- ✓ Aspect ratio near 1





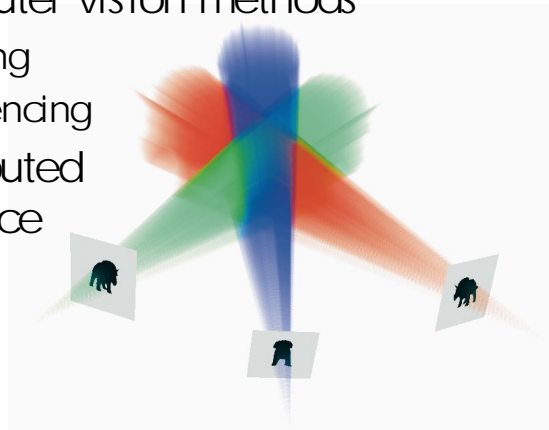
## Finding Disparity

- ✓ How to get it
  - 3-D laser scanners
  - Depth-from-stereo
  - Depth-from-motion
  - Depth-from-focus
  - Depth-from-light-fields
  - Manual layer segmentation
- ✓ How accurate must it be?



## Visual Hulls

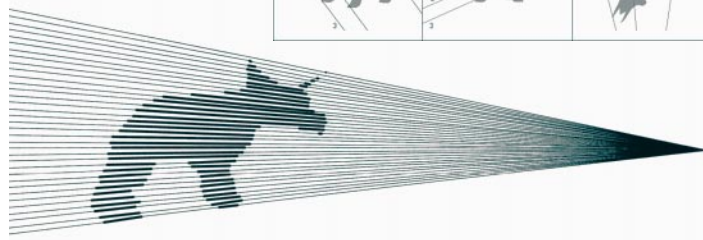
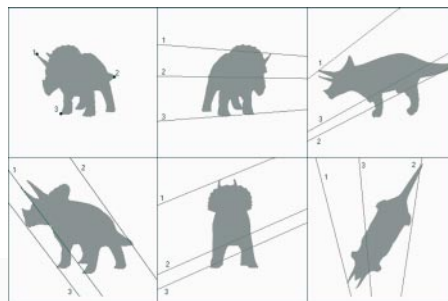
- ✓ Depth-from-silhouettes
- ✓ Simple computer vision methods
  - blue screening
  - image differencing
- ✓ Can be computed in image space





## Image-based Visual Hulls

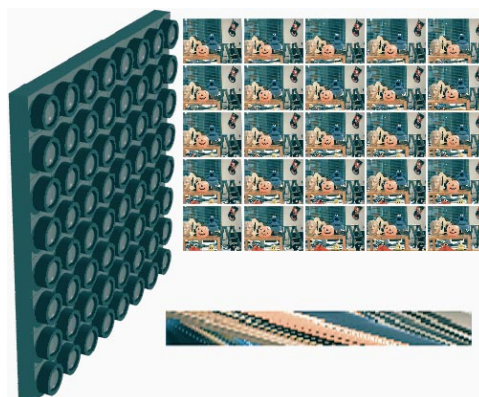
- ✓ Volume-like
- ✓ Self-consistent
- ✓ Discrete-discrete-continuous



## Depth from Redundant Structure

- ✓ Light fields for depth acquisition

- Depth-from
  - stereo
  - motion
  - focus
  - silhouettes





## Comparing Rendering Approaches

- ✓ Geometry Based
  - Forward Mapping (graphics pipeline)
  - Inverse Mapping (ray tracing)
- ✓ Image based
  - Greater spatial coherence
  - Lower depth complexity



## Image-Based Pipeline

### Geometry-Based Rendering Pipeline



### Incremental Evaluation



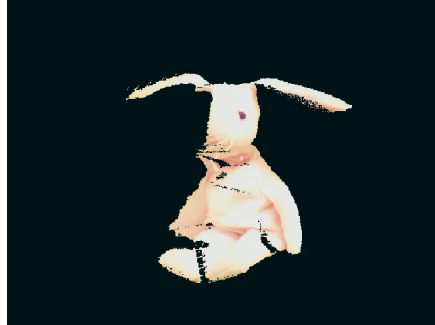
### Image-Based Rendering Pipeline





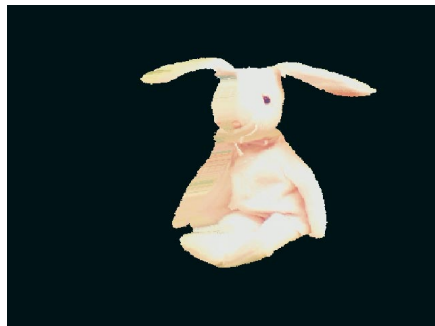
## Forward-warping

- ✓ Single depth value per pixel



## Forward-Mapped Visual Hull

- ✓ Draws a line segment for each interval





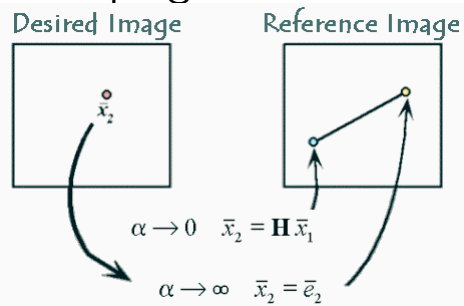
## Merging Forward Warps

- ✓ Draw textured line segments



## Image-Based Ray Tracing

- ✓ Inverse warping



Linear Interpolation  $x = a(1-t) + bt$

Harmonic Interpolation  $x = a\left(\frac{\theta}{1-\theta}\right) + b\left(\frac{1}{1-\theta}\right)$



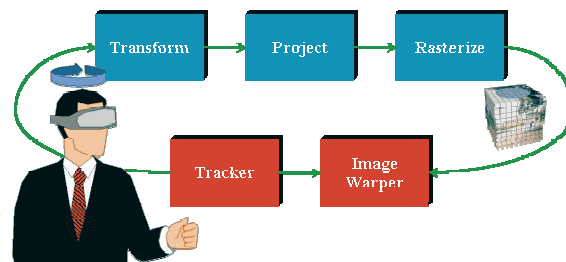
## Algorithm Properties

- ✓ Search is confined to a line
- ✓ First intersection is closest point
- ✓ Incremental line drawing
- ✓ Reconstruction in reference image
- ✓ Work is proportional to size of output image



## Applications of IBR

- ✓ IBR combined with traditional methods
- ✓ Decouples rendering from interaction
- ✓ Latency compensation





SIGGRAPH

## Conclusions

- ✓ IBR provides
  - new representations for 3D graphics
    - easy to acquire
    - allows efficient rendering
  - scalable performance
    - depends on number of pixels rather than the number of geometric primitives
  - amenable to HW acceleration