### Image-Based Modeling and Rendering

Richard Szeliski Microsoft Research IPAM Graduate Summer School: Computer Vision July 26, 2013

### How far have we come?

# Light Fields / Lumigraph - 1996



### Environment matting - 2001



Figure 1 Sample composite images constructed with the techniques of this paper. slow but accurate on the left, and a more restricted example acquired at video rates on the right.

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### Photo Tourism - 2006



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### Ambient Point Clouds - 2010



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### Photo Tours - 2012



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[Kushal et al., 3DIMPVT 2012]

### The Visual Turing Test



Figure 5 Visual Turing test. In each image nair, the ground truth image is on the left and our result is on the right

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### [Shan et al., 3DV 2013]

### Where are we going?

### A personal retrospective

- Panoramas and 360° Video Walkthroughs
- Light Fields and Lumigraphs
- LDIs, Sprites, and Layered Video
- Image-Based Modeling
- Environment Mattes and Matting
- Photo Tourism and Photosynth
- Point-Based Rendering and NPR
- Reflections and Transparency [2012]

# Pre-history (?): view interpolation

 Depth maps and images: view extrapolation [Matthies,Szeliski,Kanade'89]



input

depth image

novel view

 View interpolation: warp and dissolve [Beier & Neely '92; Chen & Williams '93]

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### Panoramic image stitching

### Convert image sequence into a cylindrical image



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### Panoramic image stitching

Key technical breakthroughs:

- $\checkmark$  interactive viewing [(Lippman'80), Chen '95]
- ✓ general camera motions [1997...]
- ✓ parallax compensation [1998…]
- ✓ fully automated feature detection and matching [Brown & Lowe '03]
- ✓ seam selection [1975 (1998), 2001…]
- ✓ Laplacian and Poisson blending [1984, 2003] Early example of *computational photography* **Richard Szeliski**

## "VR" today: Gigapan



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### "VR" today: 360 cities



### "VR" today: Photosynth



# Moving beyond single (or linked) panoramas...

### Panoramic Video-Based Tours

[Uyttendaele et al. 2004]

 $2D \rightarrow$  "3D Light Field" (?)

### Video-Based Walkthroughs

# Move camera along a rail ("dolly track") and play back a 360° video

Applications:

- Homes and architecture
- Outdoor locations (tourist destinations)



### Surround video acquisition system



### OmniCam (six-camera head) [ Point Grey Ladybug ]

### Acquisition platforms (then)



**Robotic cart** 



### Acquisition platforms (today)



### Acquisition platforms (future?)



### Acquisition platforms (now)



- 10 camera panoramic rig
- One bubble every 2 meters
- Reproject into cube maps



### Lightfields and Lumigraphs

"True 4D"

(with lots of slides from Michael Cohen)

# Modeling light

How do we generate new scenes and animations from existing ones?

Classic "3D Vision + Graphics":

- take (lots of) pictures
- recover camera pose
- build 3D model
- extract texture maps / BRDFs
- synthesize new views
- ... tons of great work and demos as 3DIMPVT

### **Computer Vision**



### **Computer Graphics**



### Combined



### But, vision technology falls short



### ... and so does graphics.



### **Image Based Rendering**





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### Lumigraph - Organization

2D position 2D position 2 plane parameterization

### Lumigraph - Organization

2D position 2D position

### 2 plane parameterization

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U.V

u,v

36

S

## Lumigraph - Rendering

For each output pixel

- determine s,t,u,v
- either
  - find closest discrete RGB
  - interpolate near values






### Lumigraph - Rendering

### **Depth Correction**

- quadralinear interpolation
- new "closest"
- like focus

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# Lumigraph – Image Effects

Image effects:

- parallax
- occlusion
- transparency
- highlights



## **Unstructured Lumigraph**

What if the images aren't sampled on a regular 2D grid?

- can still re-sample rays
- ray weighting becomes more complex [Buehler *et al.*, SIGGRAPH'2000]



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# Surface Light Fields

[Wood et al, SIGGRAPH 2000] Turn 4D parameterization around: image @ every surface pt.

Leverage coherence: compress radiance fn (BRDF \* illumination) after rotation by *n* 



## Surface Light Fields

### [Wood et al, SIGGRAPH 2000]



## 2.5D Representations

Images (and panoramas) are 2D Lumigraph is 4D 3D

- 3D Lumigraph subsets (360 video tours)
- Concentric mosaics

2.5D

- Layered Depth Images
- Sprites with Depth (impostors)
- Layered (Virtual Viewpoint) Video
- View Dependent Surfaces (see Façade)

### Layered Depth Image



### Layered Depth Image

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# Layered Depth Image

### □ Rendering from LDI [Shade *et al.*, SIGGRAPH'98]



- Incremental in LDI X and Y
- Guaranteed to be in back-to-front order

### Sprites with Depth

Represent scene as collection of cutouts with depth (planes + parallax)

Render back to front with fwd/inverse warping [Shade *et al.*, SIGGRAPH'98]

Basis of Virtual Viewpoint Video [Zitnick *et al.* 2004]



### Virtual Viewpoint (3D) Video

[Zitnick et al., SIGGRAPH 2004]

### Scenarios for 3D video

Sports events, e.g., CMU's 30-camera "EyeVision" system at SuperBowl XXXV)

Concert performances, plays, circus acts

Games

Instructional video,

e.g., golf, skating, martial arts Interactive (Internet) video



### 3D video: Challenges

Capture: record multiple synchronized camera streams

Processing and representation: ensure <u>photorealism</u>

Compression: exploit redundancy Rendering: provide interactive viewpoint control



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### Matching pixels





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### Harder





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### **Really Really Hard**





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# Matting



## Find matting information:

1. Find boundary strips using depth.



2. Within boundary strips compute the colors and depths of the foreground and background object.



### Why matting is important

### **No Matting**







### Representation



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# Massive Arabesque

### Outline

- Panoramas and 360° Video Walkthroughs
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### **Image-Based Modeling**

## **Image-Based Modeling**

### Modeling and Rendering Architecture from Photographs

Debevec, Taylor, and Malik 1996



Original photograph with marked edges Richard Szeliski

Recovered model Model edges projected onto photograph Image-Based Rendering and Modeling

Synthetic rendering

## Façade

- 1. Select building blocks
- 2. Align them in each image
- Solve for camera pose and block parameters (using constraints)











### View-dependent texture mapping

- 1. Determine visible cameras for each surface element
- 2. Blend textures (images) depending on distance between original camera and novel viewpoint





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### Graz reconstruction



Fully automated multi-view stereo, ca. 2009

### Non-photorealistic experiences

### Photo Tourism



### Images on the Internet

#### **Computed 3D structure**

### [Snavely, Seitz, Szeliski, SIGGRAPH 2006]

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### Photo Tourism



### **Internet Computer Vision**

# Use the Internet as an image and/or annotation source to solve challenging vision problems.



Scene Completion Using Millions of Photographs James Hays and Alexei Efros. Transactions on Graphics (SIGGRAPH 2007). August 2007, vol. 26, No. 3.

#### Project Page, SIGGRAPH Paper, CACM Paper, CACM Technical Perspective by Marc Levoy, Bibtex

Abstract: What can you do with a million images? In this paper we present a new image completion algorithm powered by a huge database of photographs gathered from the Web. The algorithm patches up holes in images by finding similar image regions in the database that are not only seamless but also semantically valid. Our chief insight is that while the space of images is

### **Internet Computer Vision**

### Photo Tourism and IM2GPS:

3D Reconstruction and Geolocation of Internet Photo Collections CVPR 2009 half day course, June 20, 2009 (morning) Course organizers: Noah Snavely, Cornell University, and James Hays, CMU



### **Internet Computer Vision**



### Recent research
# **Piecewise planar proxies**



## [Sinha, Steedly, Szeliski ICCV'09]

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# **Building Interiors**



<u>[Furukawa et al., ICCV'09]</u>

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## **Internet-Scale Stereo**



[Furukawa et al., CVPR'10]

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# What's missing?

Reflections Gloss

...?

# Reflections



# Image-Based Rendering for Scenes with Reflections

Sudipta N. Sinha Johannes Kopf Michael Goesele Daniel Scharstein Richard Szeliski





Wrapping up...

# Graphics/Imaging Continuum



# What works? What doesn't?

- ✓ Automatic 3D pose estimation
- ✓ Aerial (+ active ground level) modeling
- Accurate boundaries & matting
- Reflections and transparency
- User-generated content
  - Casually acquired photos and videos

New sensors

- Active sensing (Kinect...); Plenoptic cameras
- Integration with recognition

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## What about Computational Photography?

### CSCI 129 Computational Photography

Fall 2012, MWF 11:00 to 11:50, CIT 477 (Lubrano) Instructor: **James Hays** HTA: Sam Birch and GTA: Emanuel Zgraggen

#### **Course Description**

#### Course Catalog Entry

Computational Photography describes the convergence of computer graphics, computer vision, and the Internet with photography. Its goal is to overcome the limitations of traditional photography using computational techniques to enhance the way we capture, manipulate, and interact with visual media. In this course we will study many interesting, recent image based algorithms and implement them to the degree that is possible. We will cover topics such as

- Cameras and image formation
- Human visual perception
- Image processing (filtering, pyramids)
- Image blending and compositing
- Image retargeting
- Texture synthesis and transfer
- Image completion / inpainting
- Super-resolution, deblurring, and denoising.
- Image based lighting and rendering
- High dynamic range
- Depth and defocus

R

- Flash / no flash photography
- Coded aperture photography
- Single / multi view reconstruction
- Photo quality assessment
- Non photorealistic rendering
  - Modeling and synthesis using Internet data



# **Image-Based Rendering**

- Panoramas and 360° Video Walkthroughs
- Light Fields and Lumigraphs
- Layered Representations and Matting
- Image-Based Modeling
- Environment Mattes and Matting
- Photo Tourism and Photosynth
- Point-Based Rendering and NPR
- Reflections and Transparency
- Where next?
- How to use in *your* applications?

# Graphics/Imaging Continuum



# (Questions)

## [The End]