#### Reconstruction

CSE 455 Linda Shapiro

## 3d model

- "Digital copy" of real object
- Allows us to
  - Inspect details of object
  - Measure properties
  - Reproduce in different material
- Many applications
  - Cultural heritage preservation
  - Computer games and movies
  - City modelling
  - E-commerce



# Applications: cultural heritage

**SCULPTEUR European project** 





# Applications: art

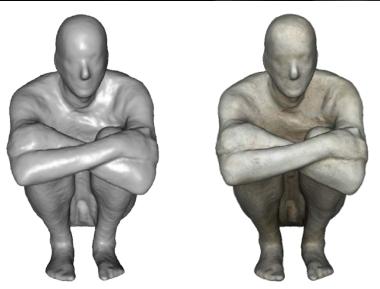


Block Works Precipitate III 2004 Mild steel blocks 80 x 46 x 66 cm



Domain Series Domain VIII Crouching 1999 *Mild steel bar* 81 x 59 x 63 cm

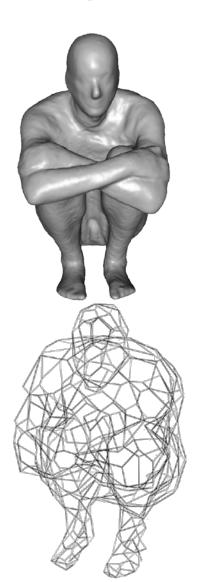




## Applications: structure engineering



BODY / SPACE / FRAME, Antony Gormley, Lelystad, Holland

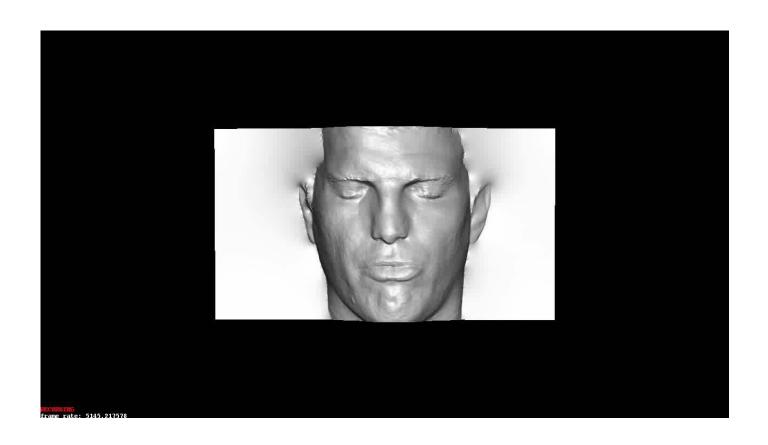


# Applications: art

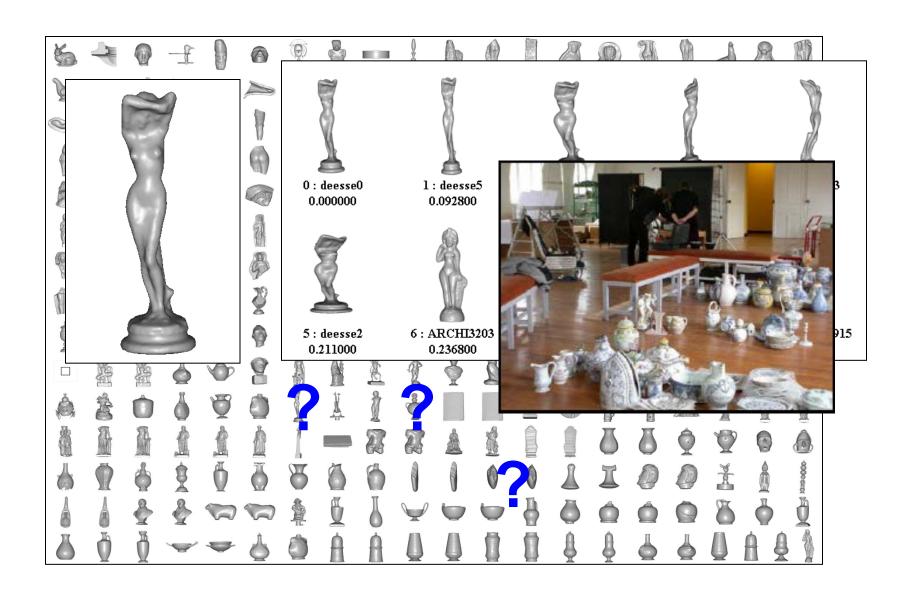




# Applications: computer games



# Applications: 3D indexation



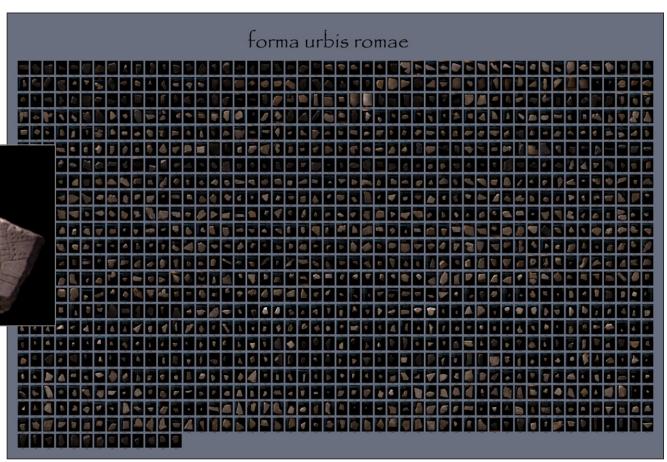
# Applications: archaeology

"forma urbis romae" project

Fragments of the City: Stanford's Digital Forma Urbis Romae Project

David Koller, Jennifer Trimble, Tina Najbjerg, Natasha Gelfand, Marc Levoy

Proc. Third Williams Symposium on Classical Architecture, Journal of Roman Archaeology supplement, 2006.

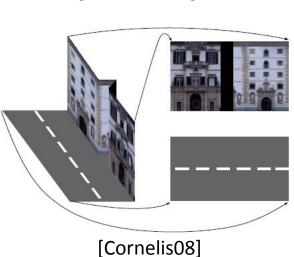


1186 fragments

# Applications: large scale modelling

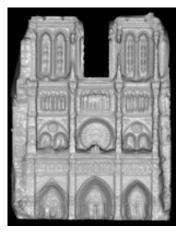


[Furukawa10]



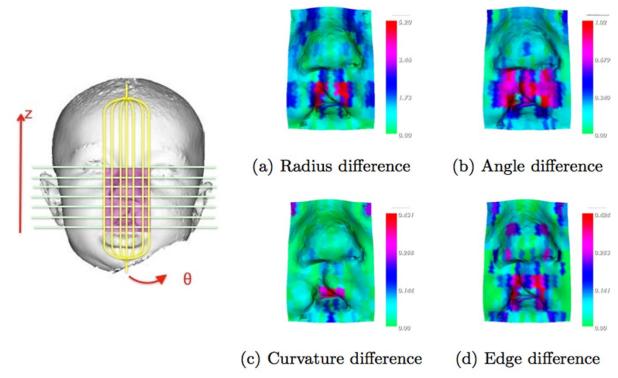


[Pollefeys08]



[Goesele07]

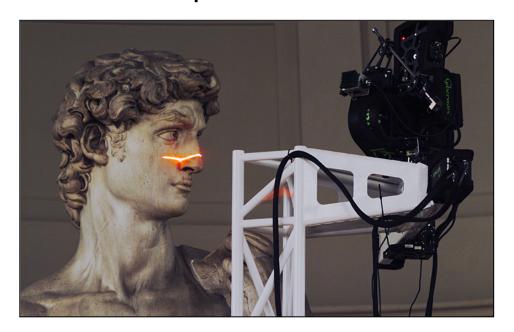
# Applications: Medicine



| expert's order | 1 | 2 | 3 | 4     | 5 | 6 | 7 | 8 | 9  | 10  |
|----------------|---|---|---|-------|---|---|---|---|----|-----|
| images         | 5 | 4 | 4 | Si Si |   | 2 | X |   | 4  | (2) |
| learning       | 1 | 3 | 2 | 4     | 5 | 6 | 8 | 9 | 7  | 10  |
| a-lmk          | 1 | 2 | 3 | 5     | 6 | 4 | 8 | 7 | 9  | 10  |
| mirror         | 1 | 2 | 4 | 8     | 5 | 6 | 9 | 3 | 7  | 10  |
| m-lmk          | 1 | 2 | 3 | 4     | 5 | 6 | 9 | 7 | 10 | 8   |
| plane          | 1 | 2 | 3 | 5     | 4 | 6 | 7 | 9 | 10 | 8   |

# Scanning technologies

- Laser scanner, coordinate measuring machine
  - Very accurate
  - Very Expensive
  - Complicated to use





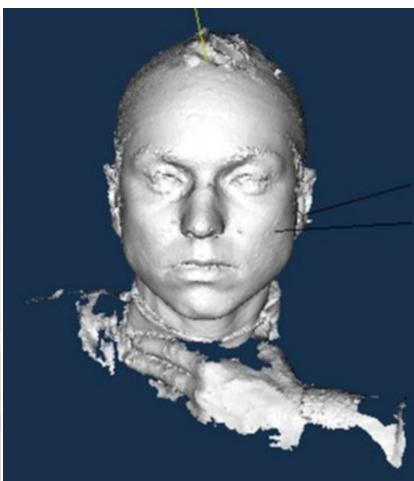
Minolta



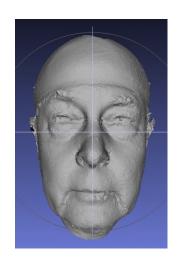
Contura CMM

# Medical Scanning System

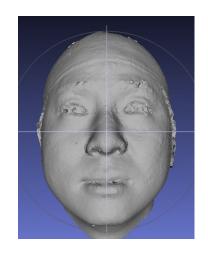


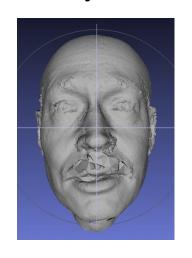


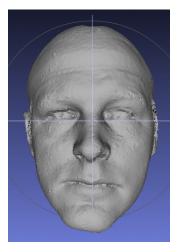
# The "Us" Data Set (subset)

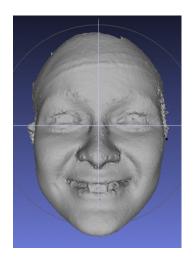


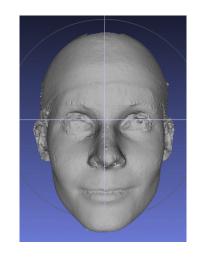


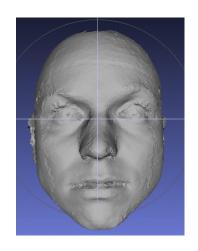






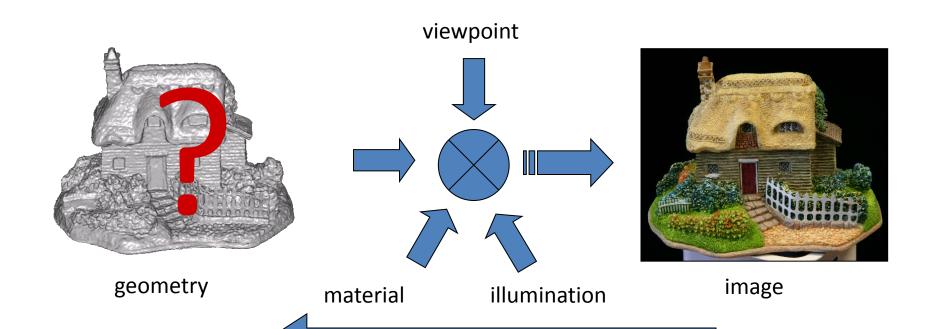






# 3d shape from photographs

"Estimate a 3d shape that would generate the input photographs given the same material, viewpoints and illumination"



## Photometric Stereo

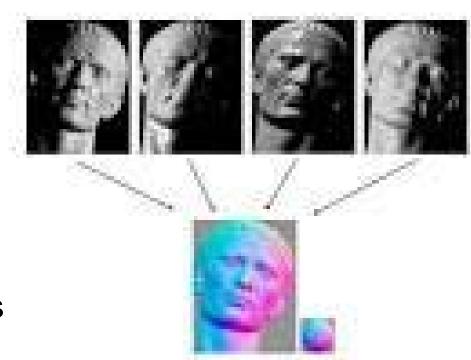
- Estimate the surface normals of a given scene given multiple 2D images taken from the *same* viewpoint, but under *different lighting* conditions.
- Basic photometric stereo required a Lambertian reflectance model:

$$I = \rho n \cdot I$$

where I is pixel intensity,  $\mathbf{n}$  is the normal, I is the lighting direction, and  $\rho$  is diffuse albedo constant, which is a reflection coefficient.

## Photometric Stereo

Inputs



3D normals

# 3d shape from photographs

## Photograph based 3d reconstruction is:

- practical
- ✓ fast
- √ non-intrusive
- ✓ low cost
- Easily deployable outdoors
- "low" accuracy
- Results depend on material properties

#### Reconstruction

 Generic problem formulation: given several images of the same object or scene, compute a representation of its 3D shape



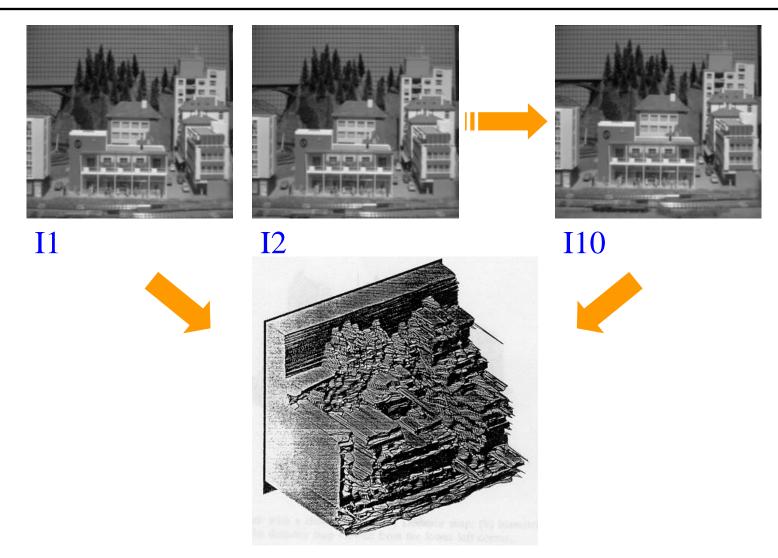




#### Reconstruction

- Generic problem formulation: given several images of the same object or scene, compute a representation of its 3D shape
- "Images of the same object or scene"
  - Arbitrary number of images (from two to thousands)
  - Arbitrary camera positions (camera network or video sequence)
  - Calibration may be initially unknown
- "Representation of 3D shape"
  - Depth maps
  - Meshes
  - Point clouds
  - Patch clouds
  - Volumetric models
  - Layered models

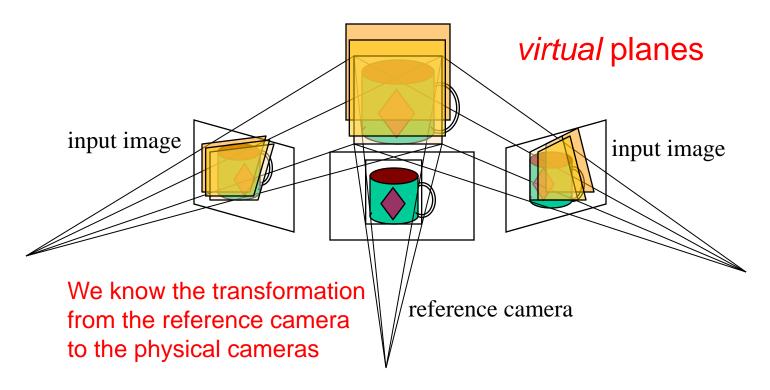
## Multiple-baseline stereo



M. Okutomi and T. Kanade, <u>"A Multiple-Baseline Stereo System,"</u> IEEE Trans. on Pattern Analysis and Machine Intelligence, 15(4):353-363 (1993).

## Plane Sweep Stereo

- Choose a reference view
- Sweep family of planes at different depths with respect to the reference camera



Each plane defines a homography warping each input image into the reference view

R. Collins. A space-sweep approach to true multi-image matching. CVPR 1996.

#### Reconstruction from silhouettes

Can be computed robustly

Can be computed efficiently











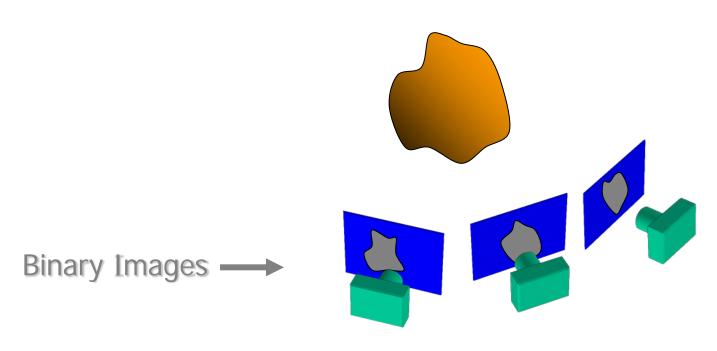




foreground

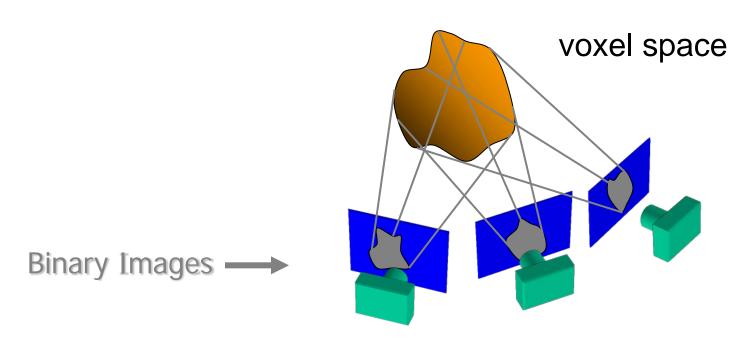
#### Reconstruction from Silhouettes

 The case of binary images: a voxel is photoconsistent if it lies inside the object's silhouette in all views



#### Reconstruction from Silhouettes

 The case of binary images: a voxel is photoconsistent if it lies inside the object's silhouette in all views



Finding the silhouette-consistent shape (*visual hull*):

- Backproject each silhouette
- Intersect backprojected volumes

## Calibrated Image Acquisition



Calibrated Turntable





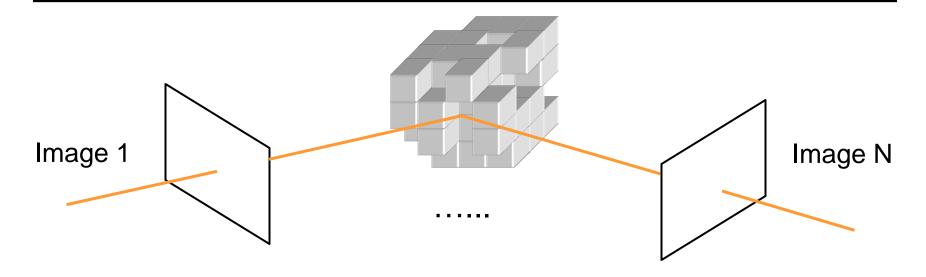
**Selected Dinosaur Images** 





Selected Flower Images

## Space Carving in General

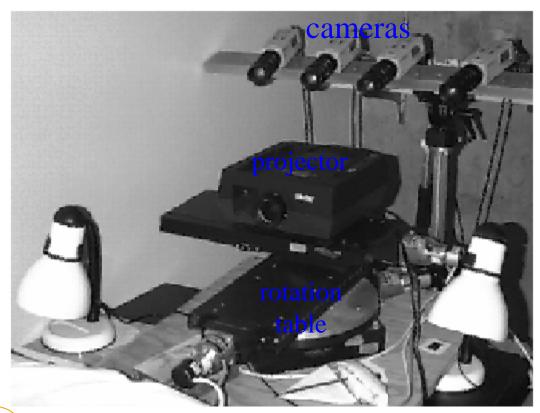


#### Space Carving Algorithm

- Initialize to a volume V containing the true scene
- Choose a voxel on the outside of the volume
- Project to visible input images
- Carve if not photo-consistent
- Repeat until convergence

## Our 4-camera light-striping stereo system

(now deceased)



3D object

## Calibration Object

The idea is to snap images at different depths and get a lot of 2D-3D point correspondences.



# Surface Modeling and Display from Range and Color Data

| Kari    | Pulli    | UW  |
|---------|----------|-----|
| Michael | Cohen    | MSR |
| Tom     | Duchamp  | UW  |
| Hugues  | Hoppe    | MSR |
| John    | McDonald | UW  |
| Linda   | Shapiro  | UW  |
| Werner  | Stuetzle | UW  |
|         |          |     |

UW = University of Washington Seattle, WA USA MSR = Microsoft Research Redmond, WA USA

## Introduction

#### Goal

- develop robust algorithms for constructing
   3D models from range & color data
- use those models to produce realistic renderings of the scanned objects







## Surface Reconstuction

#### Step 1: Data acquisition

Obtain range data that covers the object. Filter, remove background.

#### **Step 2: Registration**

Register the range maps into a common coordinate system.

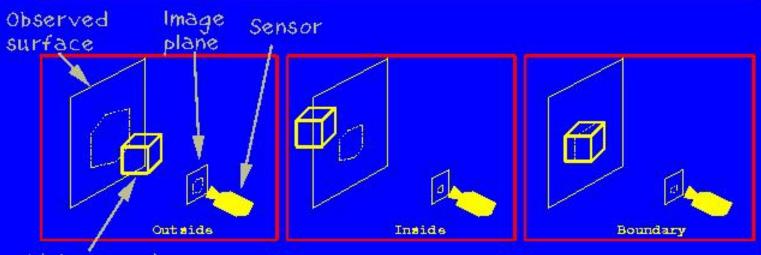
#### **Step 3: Integration**

Integrate the registered range data into a single surface representation.

#### **Step 4: Optimization**

Fit the surface more accurately to the data, simplify the representation.

# Carve space in cubes

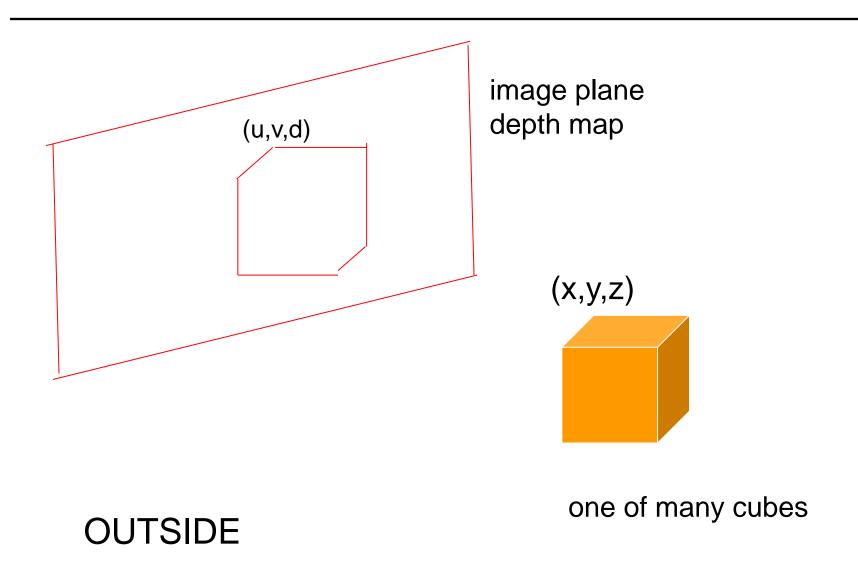


Volume under consideration

#### Label cubes

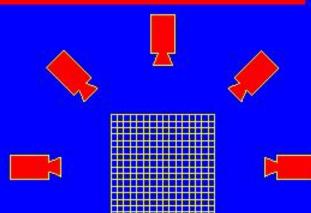
- Project cube to image plane (hexagon)
- · Test against data in the hexagon

## 3D space is made up of many cubes.



## Several views

Processing order:
FOR EACH cube
FOR EACH view



#### Rules:

any view thinks cube's out



every view thinks cube's in

=> it's in

else

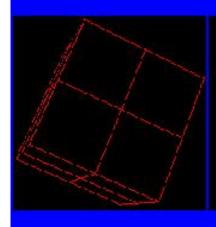
=> it's at boundary

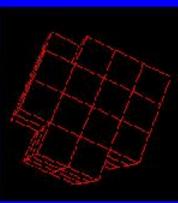
# Hierarchical space carving

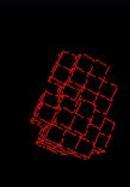
- Big cubes => fast, poor results
- Small cubes => slow, more accurate results
- Combination = octrees

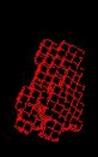
- RULES: cube's out => done

  - cube's in => doneelse => recurse







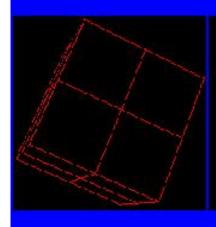


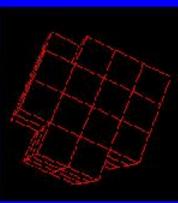
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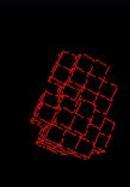
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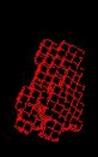
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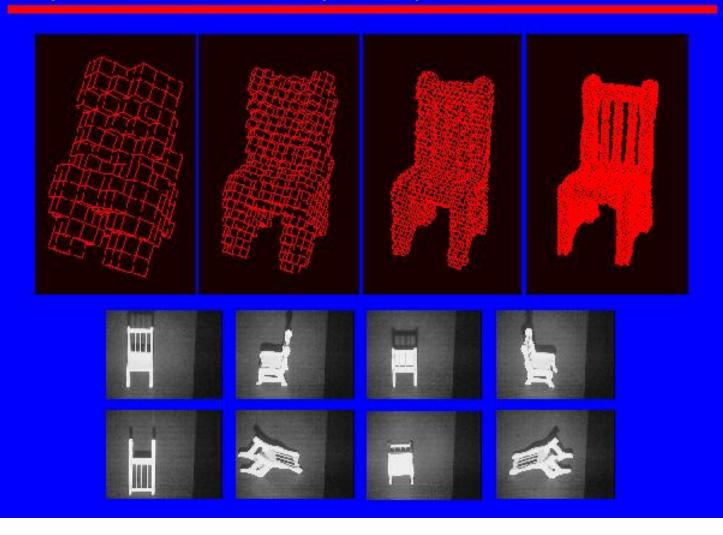




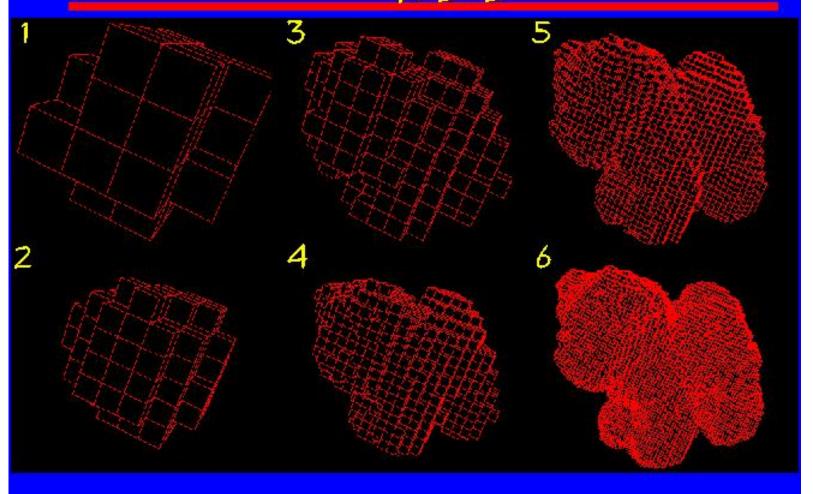




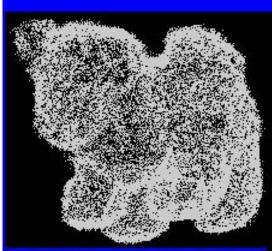
# The rest of the chair



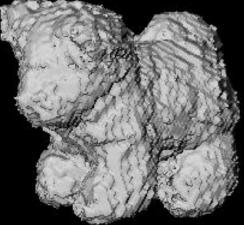
# Same for a husky pup



# Optimizing the dog mesh



Registered points



Initial mesh



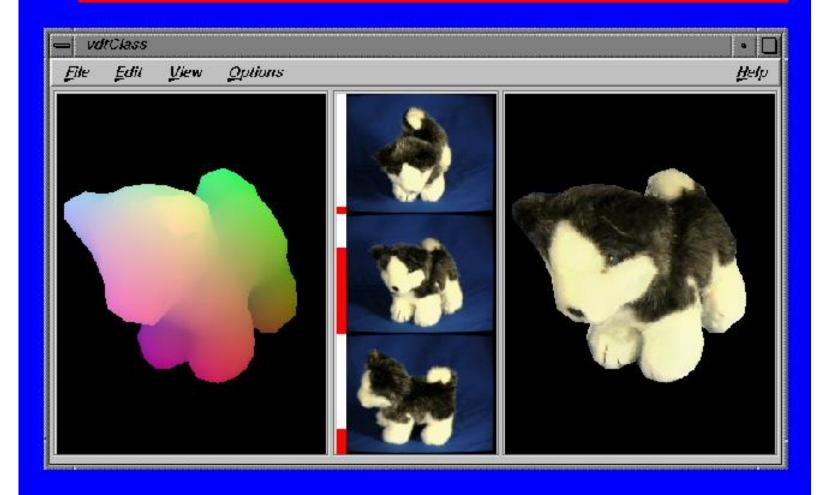
Optimized mesh

# View dependent texturing





# Our viewer



#### More: Space Carving Results: African Violet



Input Image (1 of 45)



Reconstruction



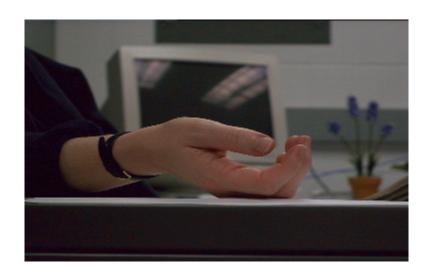
Reconstruction



Reconstruction

Source: S. Seitz

## More: Space Carving Results: Hand



Input Image (1 of 100)



**Views of Reconstruction** 

#### Stereo from community photo collections

- Up to now, we've always assumed that camera calibration is known
- For photos taken from the Internet, we need structure from motion techniques to reconstruct both camera positions and 3D points

