



3D Computer Vision Introduction

Guido Gerig

CS 6320, Spring 2015

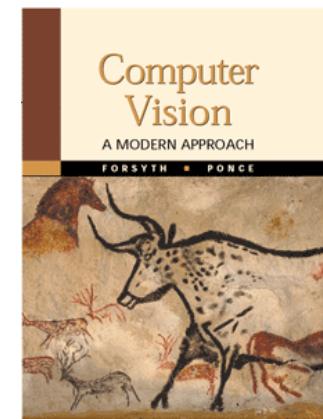
gerig@sci.utah.edu

Acknowledgements: some slides from Marc Pollefeys and Prof.
Trevor Darrell, trevor@eecs.berkeley.edu



Administrivia

- Classes: M & W, 1.25-2:45
Room WEB L126
- Instructor: Guido Gerig
gerig@sci.utah.edu
- TA: Padmashree Teeka
- Prerequisites: CS 6640 ImProc (or equiv.)
- Textbook:
“Computer Vision: A Modern Approach” by Forsyth & Ponce
- Organization:
Admin/Grading/Uuploads:
UofU [canvas](#)
Slides, documents and assignments:
[Course Website](#)

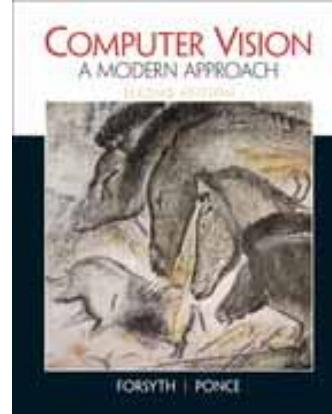
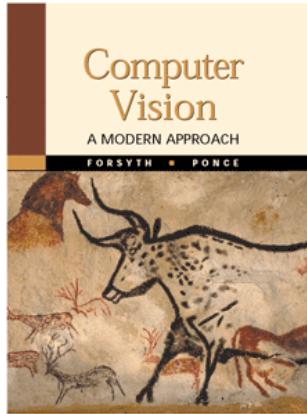




Administrivia

- Textbook:

“Computer Vision: A Modern Approach” by Forsyth & Ponce
Version 1 Version 2e 2012



- The Version 1 is sufficient for this course, but you can also buy the new updated version.
- Electronic version:
http://www.coursesmart.com/IR/5316068/9780132571074?_hdv=6.8



Web-Site

- Linked to canvas CS 6320-001 home page
- Linked to my home page (teaching):

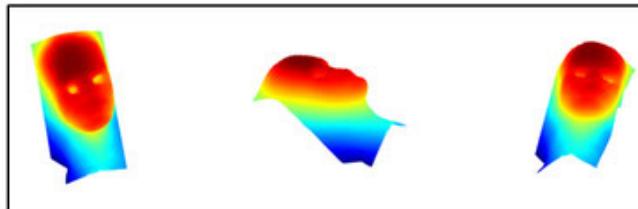
http://www.sci.utah.edu/~gerig/CS6320-S2015/CS6320_3D_Computer_Vision.html



CS6320 3D Computer Vision, Spring 2015

Computing properties of our 3-D world from passive and active sensors

Syllabus, Guido Gerig ([home](#))



Goal and Objectives:

- To introduce the fundamental problems of 3D computer vision.
- To introduce the main concepts and techniques used to solve those.
- To enable participants to implement solutions for reasonably complex problems.
- To enable participants to understand basic methodology that is discussed in the computer vision literature.



TA / SW Tools / Office Hours

- TA: Padmashree Teeka
- HW/SW: Matlab + ev. Imaging Toolbox
CADE lab WEB 130
<http://www.cade.utah.edu/>
- Office Hours TA (MEB 3115) Hours: tbd
- Office Hours instructor: Mo/Wed 3-5pm after class (tbd)



MATLAB

- This course will support MATLAB for practical parts of assignments. C++ or other languages can be used but there will be no support and we need proof that code is fully developed by the student.
- Access via COE CADE computer lab, Matlab licences available. Remote access possible, but very slow.
- Matlab is also installed on the computers in the Knowledge Commons at the Marriott Library on Campus:
 - <http://www.lib.utah.edu/services/knowledge-commons/index.php>
 - According to this webpage, it is also available to use remotely:
<http://www.lib.utah.edu/services/labs/software.php>
- If students want to purchase their own copy, Matlab for students is \$50, or \$99 (including 10 toolboxes.),
[link](#)
- We will ***NOT USE Toolboxes*** but implement our own code.



Prerequisites

- General Prerequisites:
 - Data structures
 - A good working knowledge of MATLAB programming (or willingness and time to pick it up quickly!)
 - Linear algebra
 - Vector calculus
- Assignments include theoretical paper questions and programming tasks (Matlab or C++).
- **Image Processing CS 6640** (or equivalent).
- Students who do not have background in signal processing / image processing: Eventually possible to follow class, but requires significant special effort to learn basic image processing.
- **THIS IS NOT AN IMAGE PROCESSING COURSE BUT FOCUSES ON 3D VISION ASPECTS.**



Grading - Weights

- Assignments (4-5 theory/prog.): 60%
- Final project (incl. design, proposal, demo, presentation, report): 30%
- Class participation (active participation in summaries and discussions): 10%
- Quizzes with discussions to check understanding (scoring part of partic.)
- Final project replaces final exam
- Successful final project required for passing grade



Assignments & Projects

- Assignments: Theoretical and Practical Part: [Example](#)
- Strict deadlines: 10% deduction per day late, no more accepted after 3 days.
- Assignments solutions include:
 - Solutions to [theoretical parts](#) (can be handwritten and scanned)
 - Detailed report on [practical solution](#) (pdf document)
 - Code used to solve practical part
- Important:
 - Be creative with own images and experiments with your code. Try different scenarios and discuss pro's and con's.
 - Report needs to include description of what you did, description of results, and critical assessment of results, limitations, etc.
 - Code with image data submitted a separate tar/zip file.



Other Resources

- Cvonline:
<http://homepages.inf.ed.ac.uk/rbf/CVonline/>
- A first point of contact for explanations of different image related concepts and techniques. CVonline currently has about 2000 topics, 1600 of which have content.
- See list of other relevant books in syllabus.



Some Basics

- Instructor and TA do not use email as primary communication tool.
- It will be your responsibility to regularly read the Announcements on canvas.
- We don't need a laptop for the class, please keep them closed !!!!!
- Please interact, ask questions, clarifications, input to instructor and TA.
- Cell phones, you surely know.



Syllabus

- See separate syllabus (linked to web-site and included on canvas).
- [Document](#)



Goal and objectives

- To introduce the fundamental problems of computer vision.
- To introduce the main concepts and techniques used to solve those.
- To enable participants to implement solutions for reasonably complex problems.
- To enable the student to make sense of the literature of computer vision.



CV: What is the problem?

Image Formation: From World to Image

- Camera model (optics & geometry): From points in 3D scene to points on 2D image.
- Photometry: From lights and surfaces in scene to intensity (brightness) and color in image.

Vision: From Image to (Knowledge of the) World

- Reconstruct scene (**world model**) from images.
- Extract sufficient **information** for detection/control **task**.



CV: A Hard Problem

- Under-constrained inverse problem – 3D world from 2D image.
- Images are **noisy** – shadows, reflections, focus, (ego-)motion blur – and noise is hard to model.
- Appearances – shape, size, color – of objects change with pose and lighting conditions.
- Image understanding requires cognitive ability (“AI-complete”).
- Robotics & Control: massive data rate, real-time requirements.

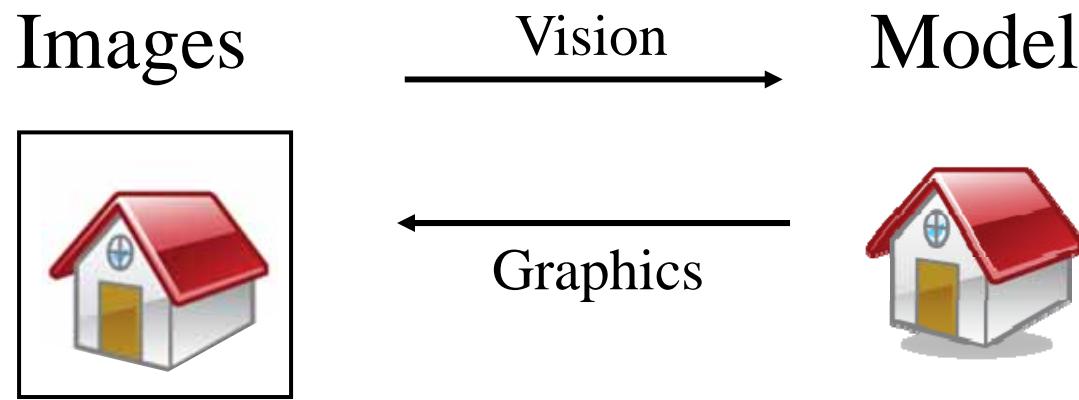


What is Computer Vision?

- Automatic understanding of images and video
 - Computing properties of the 3D world from visual data (*measurement*)
 - Algorithms and representations to allow a machine to recognize objects, people, scenes, and activities. (*perception and interpretation*)



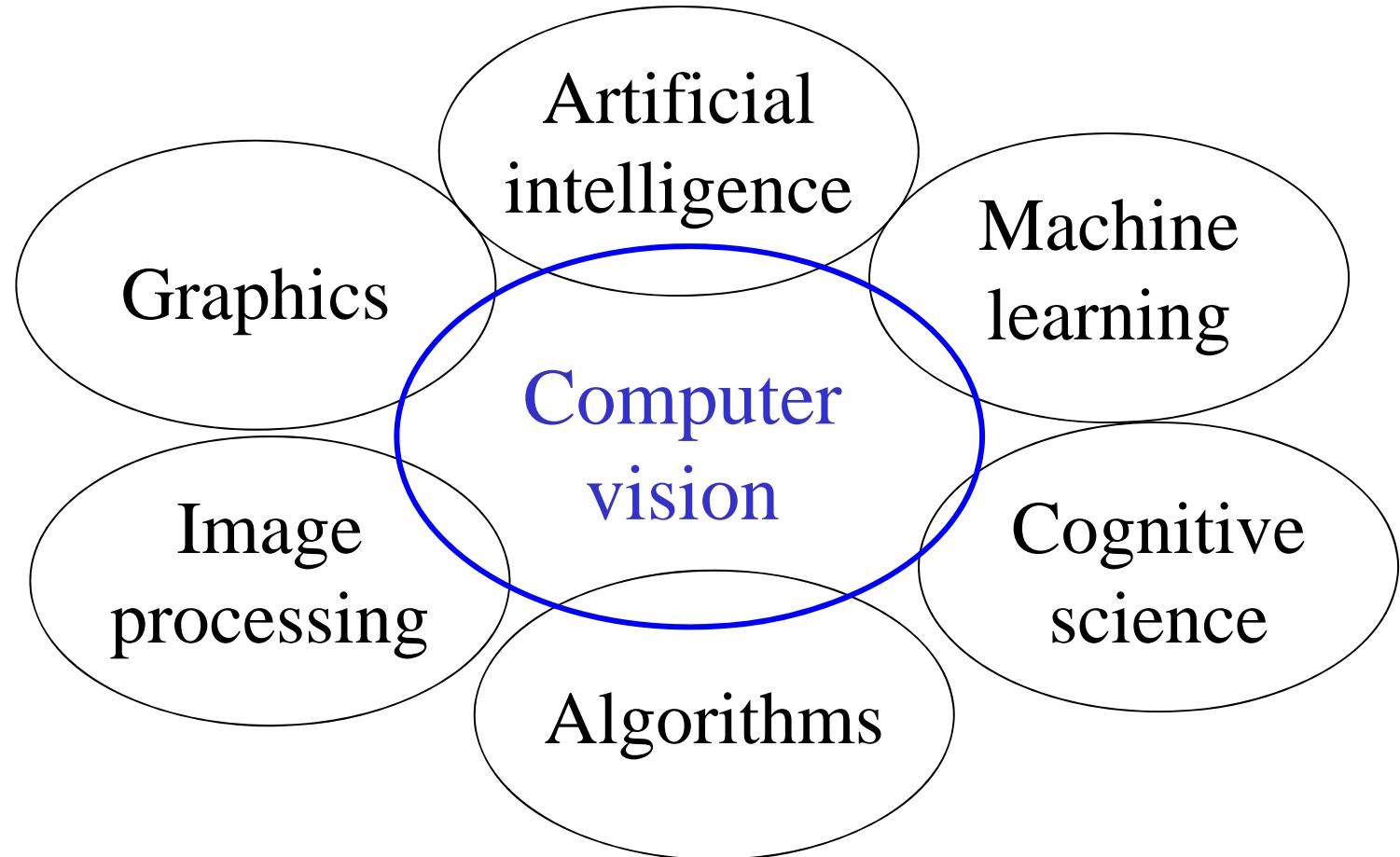
Vision and graphics



Inverse problems: analysis and synthesis.



Related disciplines





Object recognition (in mobile phones)



- This is becoming real:
 - **Lincoln** Microsoft Research
 - [Point & Find](#), [Nokia](#)
 - [SnapTell.com](#) (now amazon)

Smart cars



▶▶ manufacturer products consumer products ◀◀

Our Vision. Your Safety.

rear looking camera forward looking camera
side looking camera

EyeQ Vision on a Chip **Vision Applications** **AWS** Advance Warning System

> read more > read more

Mobileye (C) 1999-2002

- Mobileye

- Vision systems currently in high-end BMW, GM, Volvo models
- By 2010: 70% of car manufacturers.
- Video demo
- YouTube, TestMovie

News

- Mobileye Advanced Technologies Power Volvo Cars World First Collision Warning With Auto Brake System
- Volvo: New Collision Warning with Auto Brake Helps Prevent Rear-end

> all news

Events

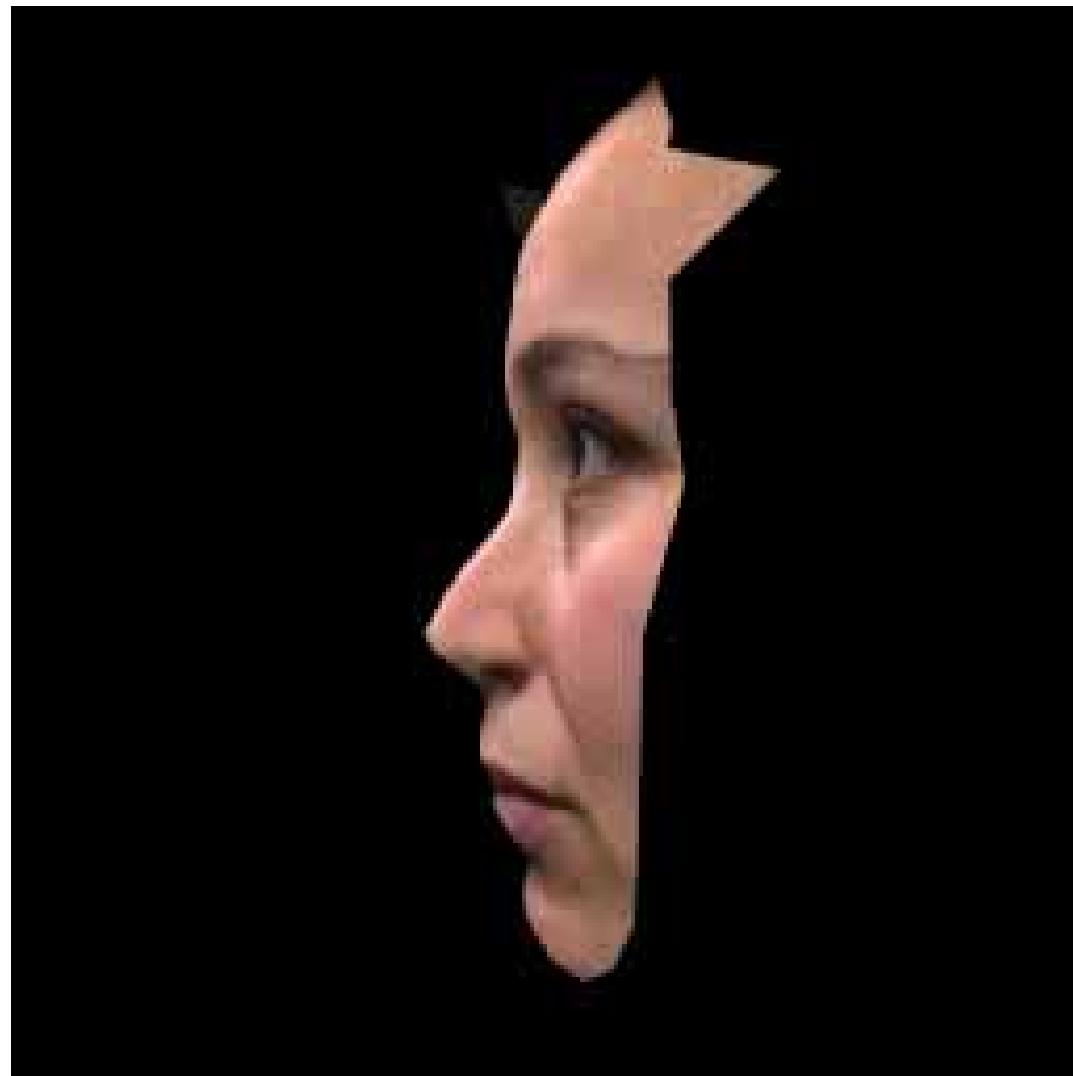
- Mobileye at Equip Auto, Paris, France
- Mobileye at SEMA, Las Vegas, NV



Slide content courtesy of Amnon Shashua

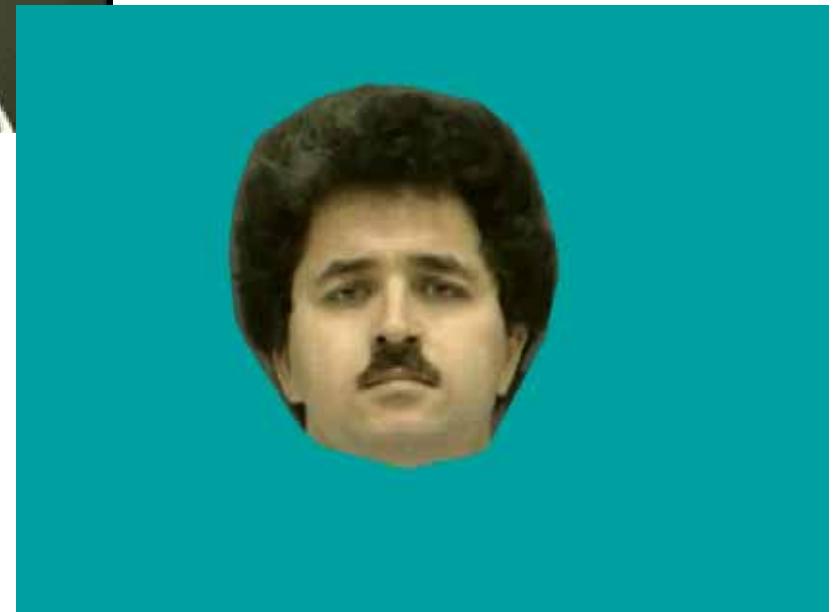
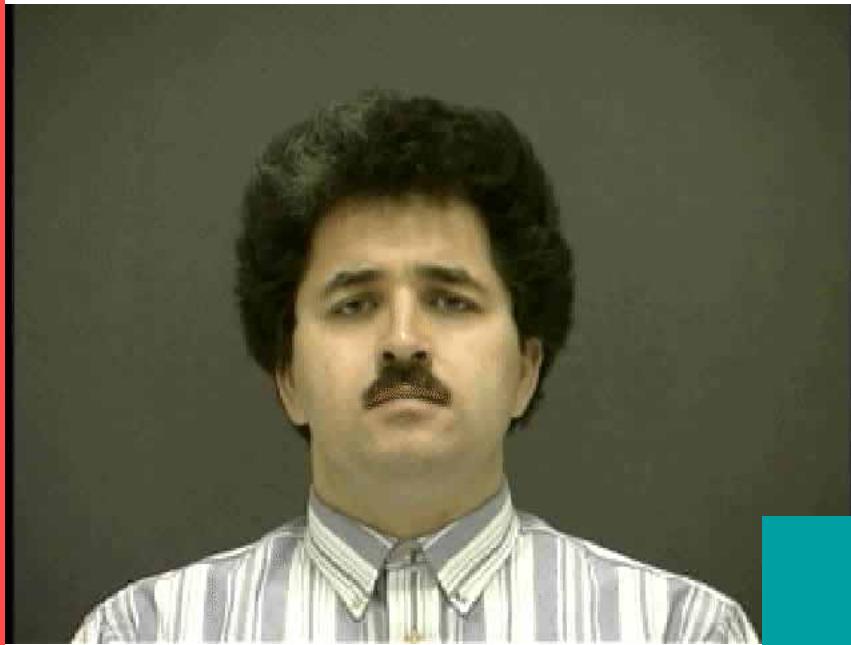


Modeling 3D Structure from Pictures or 3D Sensors





Modeling ctd.





Main topics

- Shape (and motion) recovery
“What is the 3D shape of what I see?”
- Segmentation
“What belongs together?”
- Tracking
“Where does something go?”
- Recognition
“What is it that I see?”



Why study Computer Vision?

- Images and movies are everywhere
- Fast-growing collection of useful applications
 - building representations of the 3D world from pictures
 - automated surveillance (who's doing what)
 - movie post-processing
 - CAM (computer-aided manufacturing)
 - Robot navigation
 - face finding
- Various deep and attractive scientific mysteries
 - how does object recognition work?
- Greater understanding of human vision

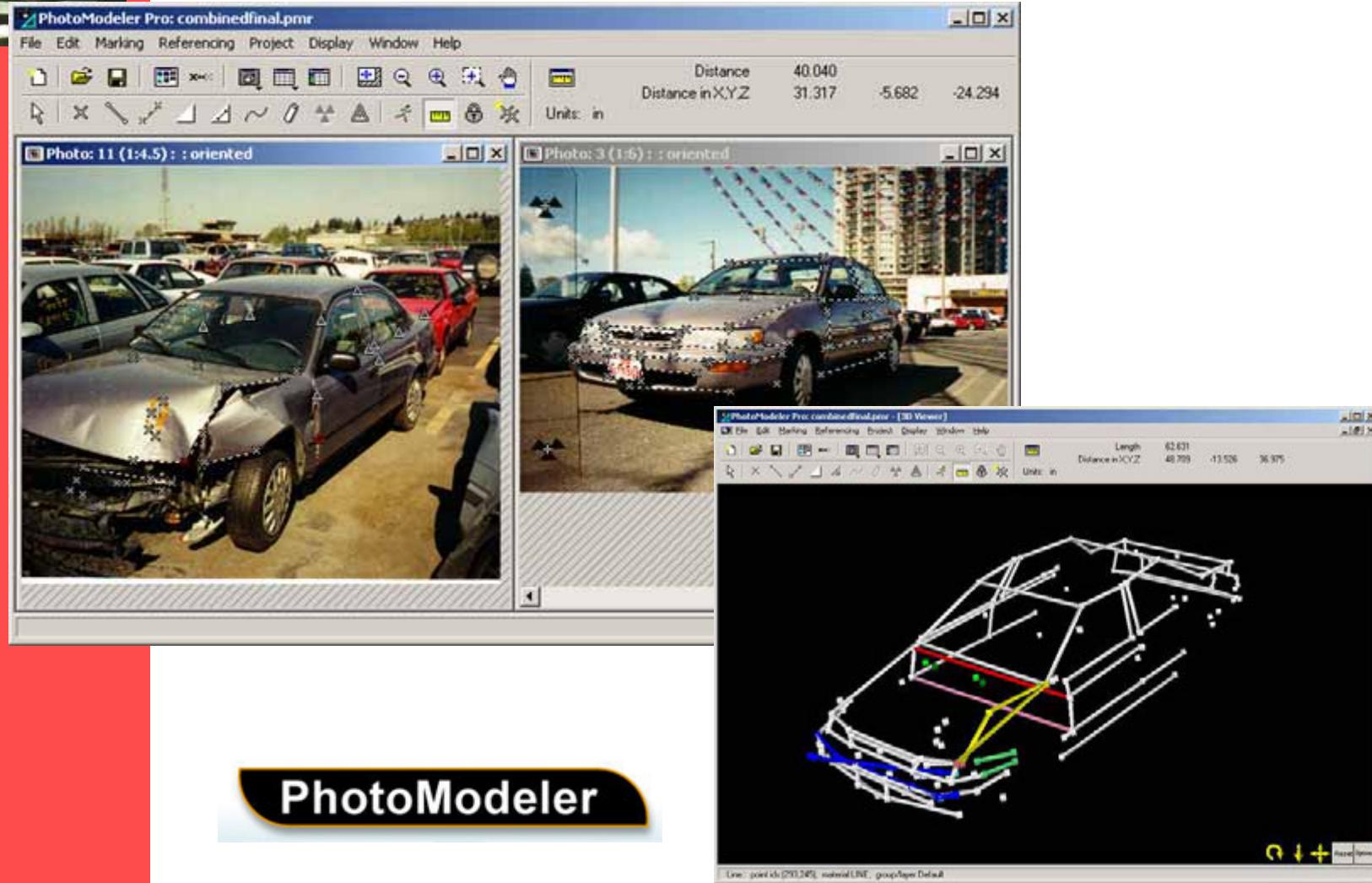


Clothing

- Scan a person, custom-fit clothing



Forensics





3D urban modeling



drive by modeling in Baltimore

Earth viewers (3D modeling)

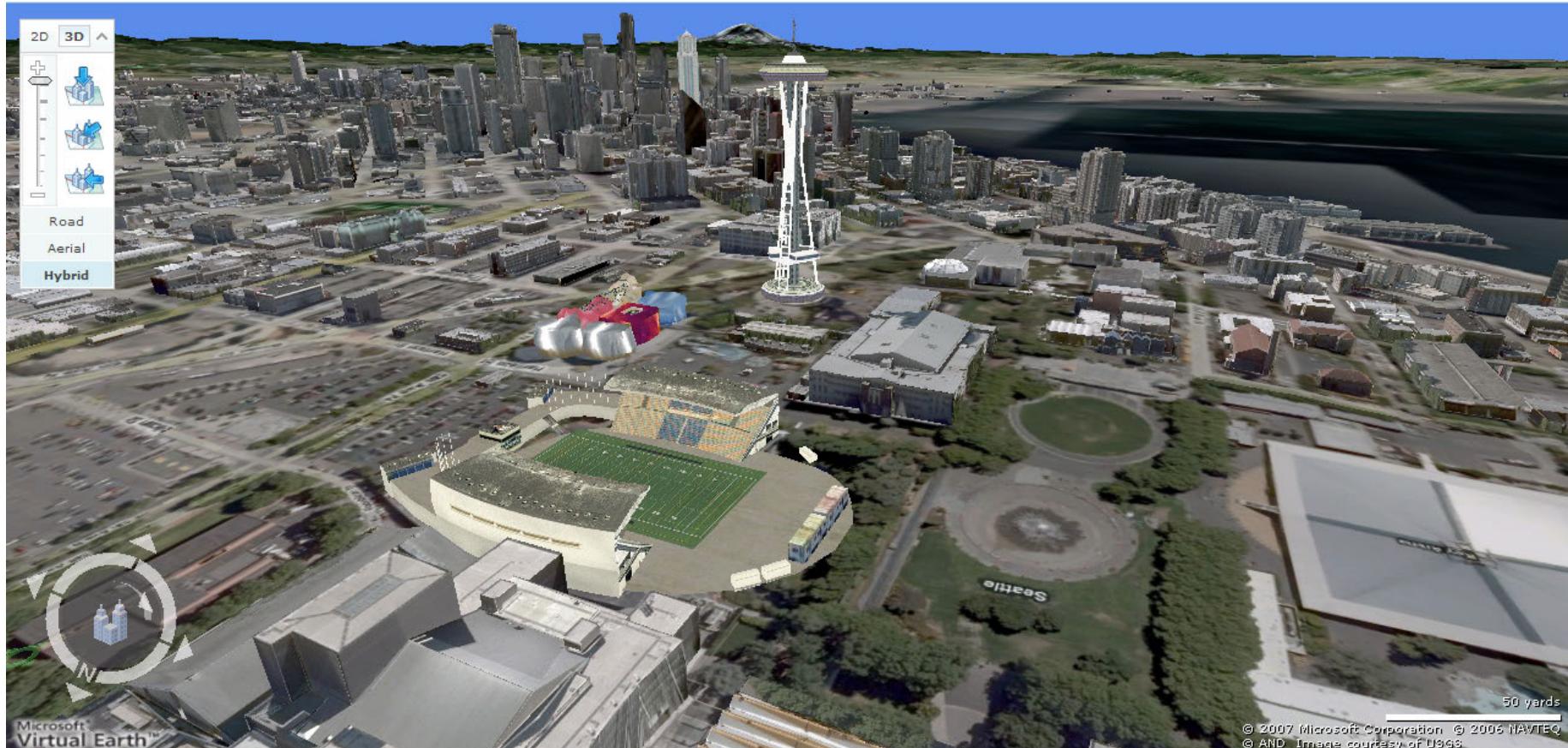
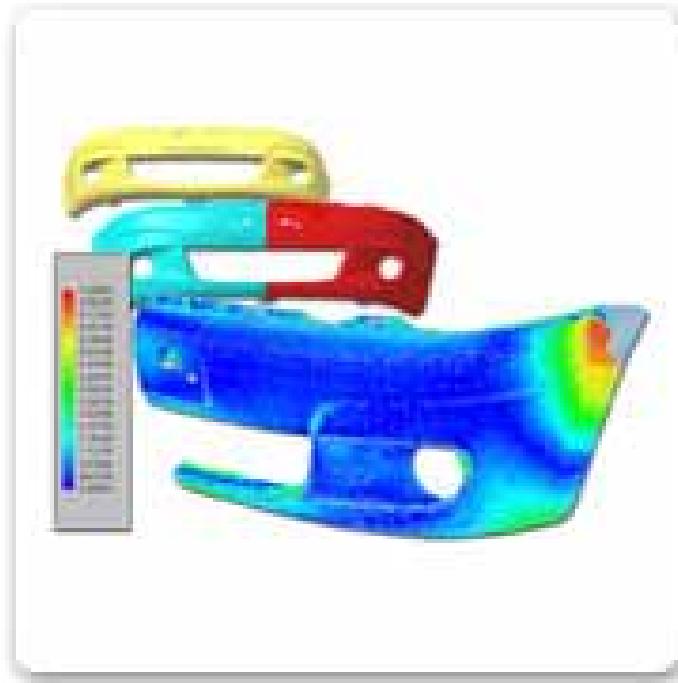


Image from Microsoft's [Virtual Earth](#)
(see also: [Google Earth](#))



Industrial inspection

- Verify specifications
- Compare measured model with CAD





Scanning industrial sites



as-build 3D model of off-shore oil platform



Leica
Geosystems

Vision in space



[NASA's Mars Exploration Rover Spirit](#) captured this westward view from atop a low plateau where Spirit spent the closing months of 2007.

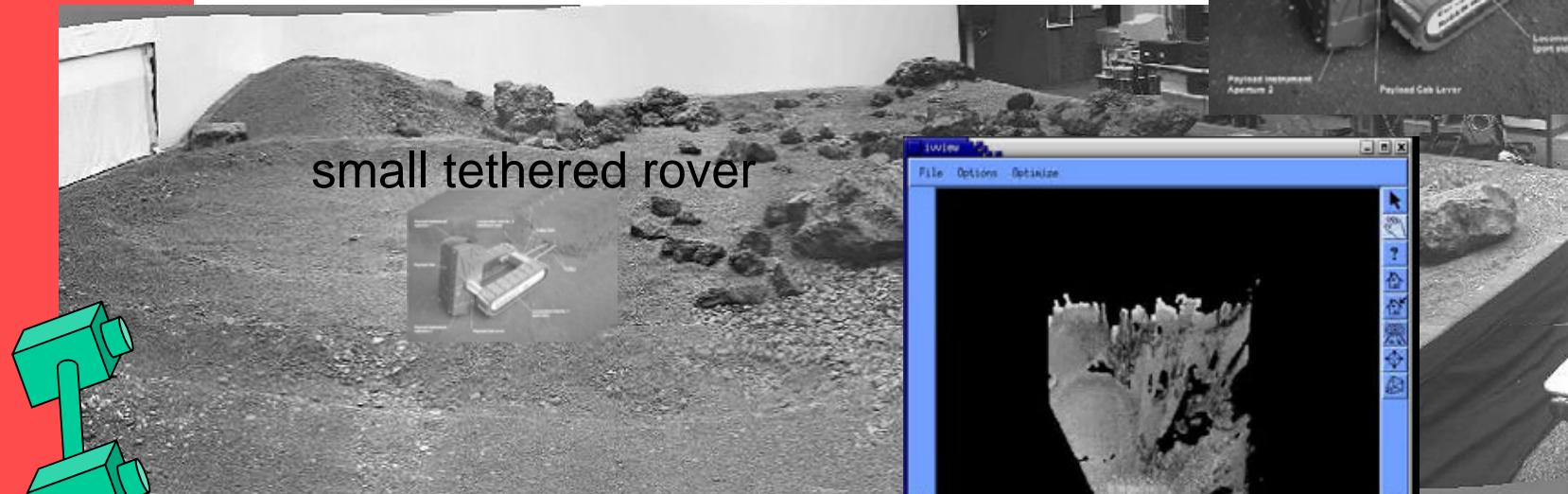
Vision systems (JPL) used for several tasks

- Panorama stitching
- 3D terrain modeling
- Obstacle detection, position tracking
- For more, read “[Computer Vision on Mars](#)” by Matthies et al.



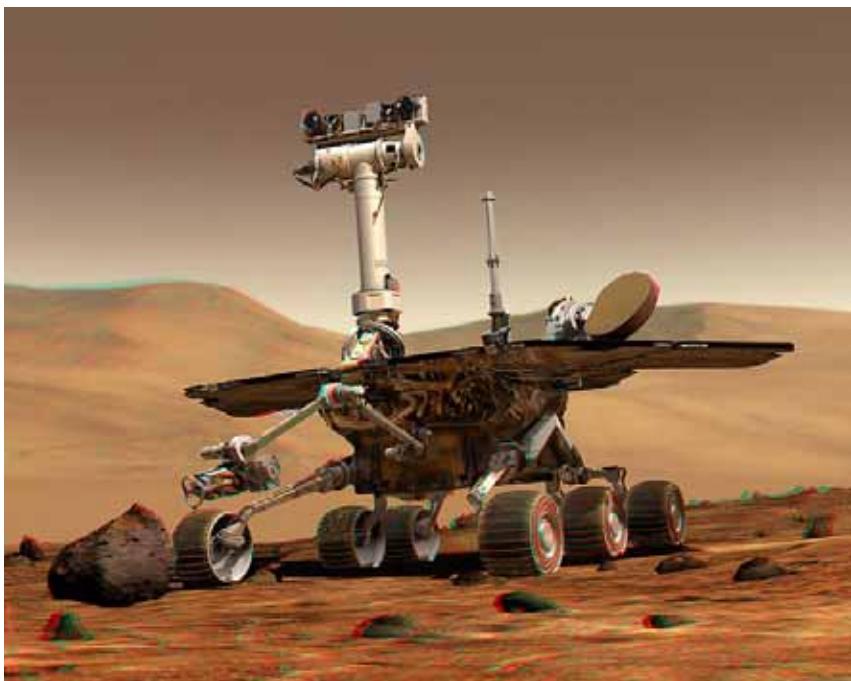
Robot navigation

ESA project
our task: Calibration + Terrain modelling +
Visualization



pan/tilt stereo head

Robotics

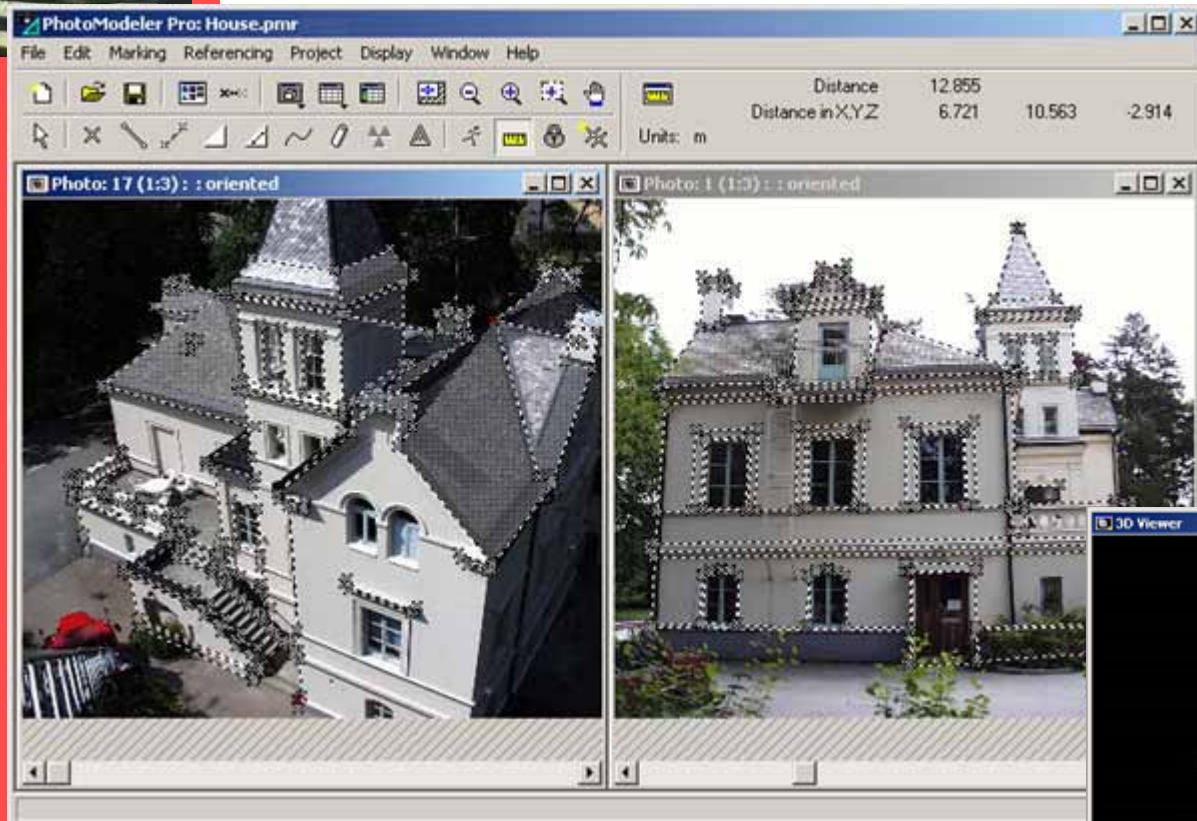


NASA's Mars Spirit Rover
http://en.wikipedia.org/wiki/Spirit_rover

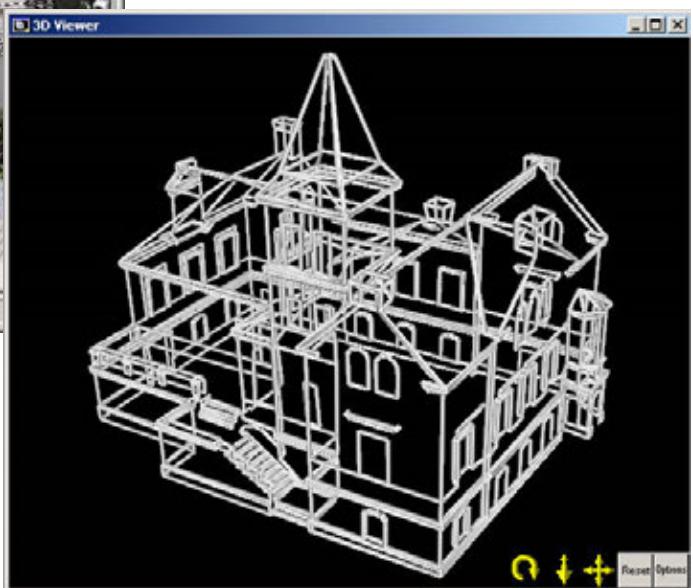


<http://www.robocup.org/>

Architecture

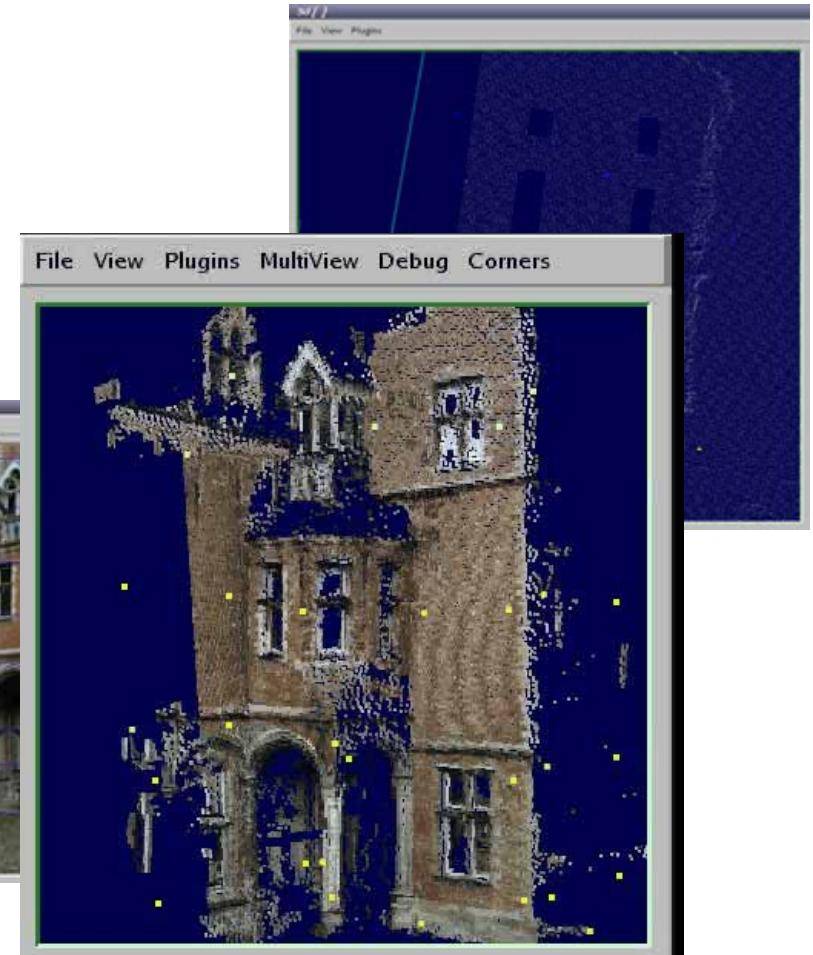
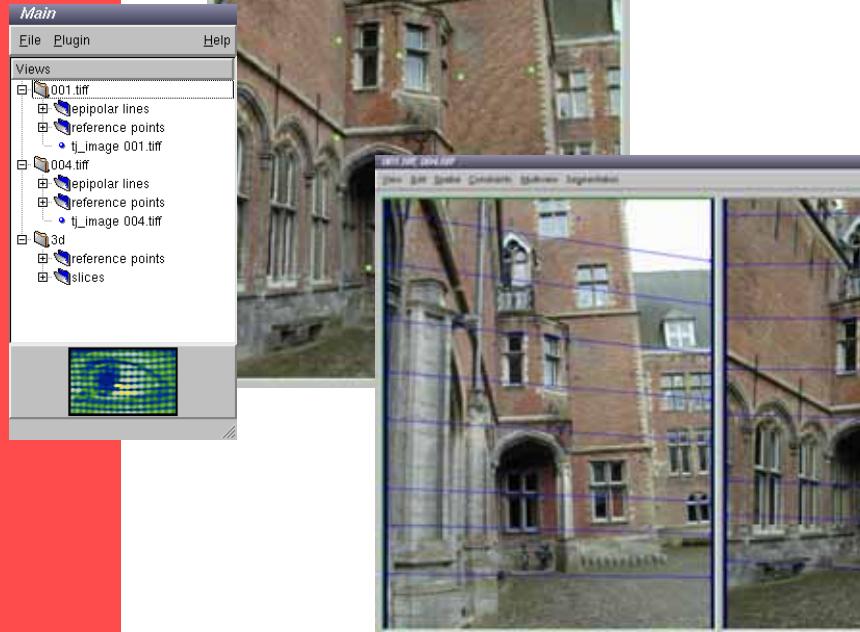


Survey
Stability analysis
Plan renovations



PhotoModeler

Architecture

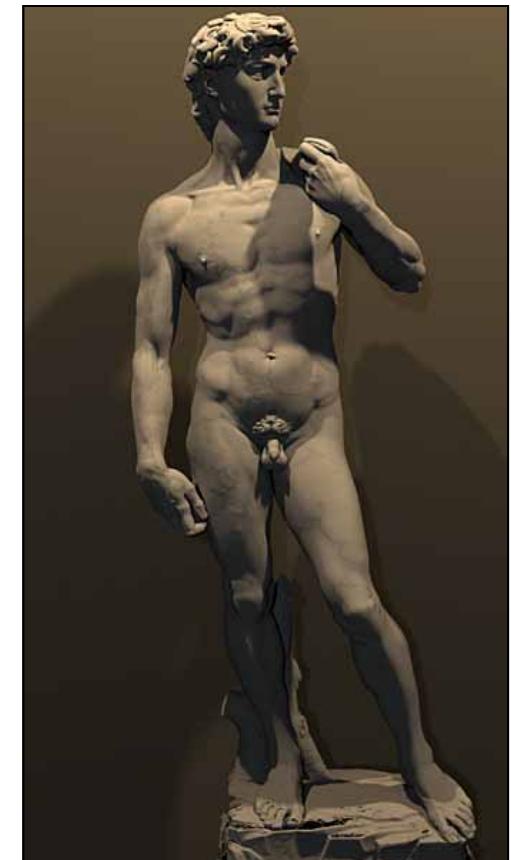
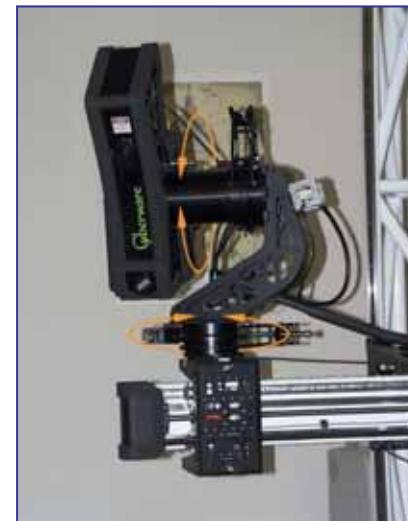


Survey
Stability analysis
Plan renovations



Cultural heritage

Stanford's Digital Michelangelo

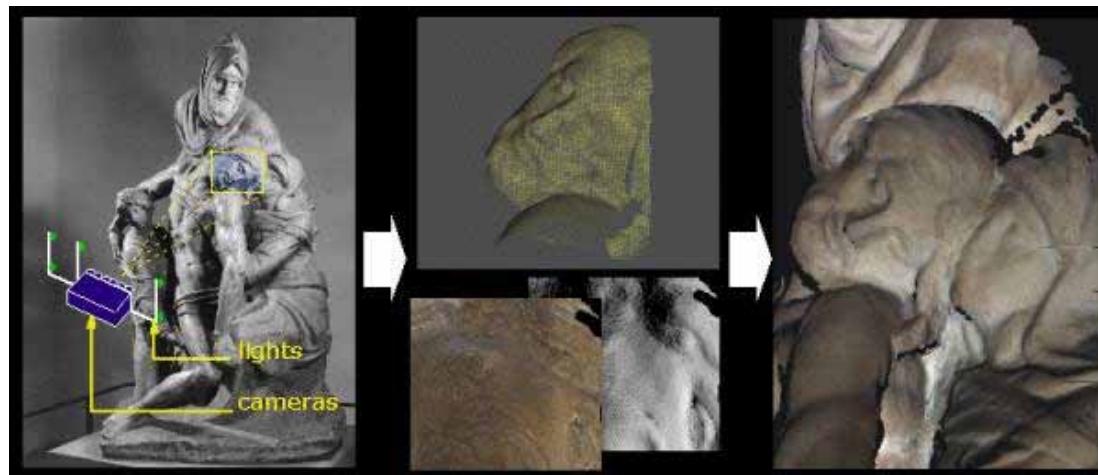


Digital archive
Art historic studies



IBM's pieta project

Photometric stereo + structured light



more info:

http://researchweb.watson.ibm.com/pieta/pieta_details.htm



Archaeology



accuracy ~1/500 from DV video
(i.e. 140kb jpegs 576x720)



Visual Cues: Stereo and Motion



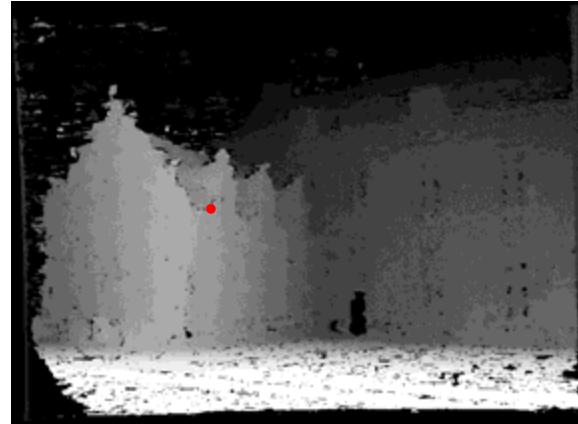
image $I(x,y)$

Disparity map from Stereo



Disparity map $D(x,y)$

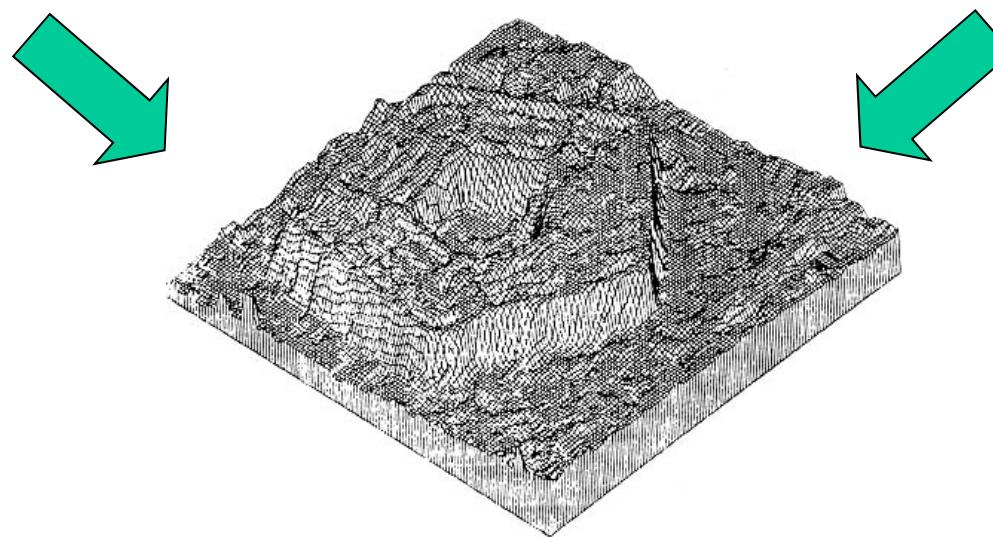
image $I'(x',y')$



$$(x', y') = (x + D(x, y), y)$$



Dynamic Programming (Ohta and Kanade, 1985)

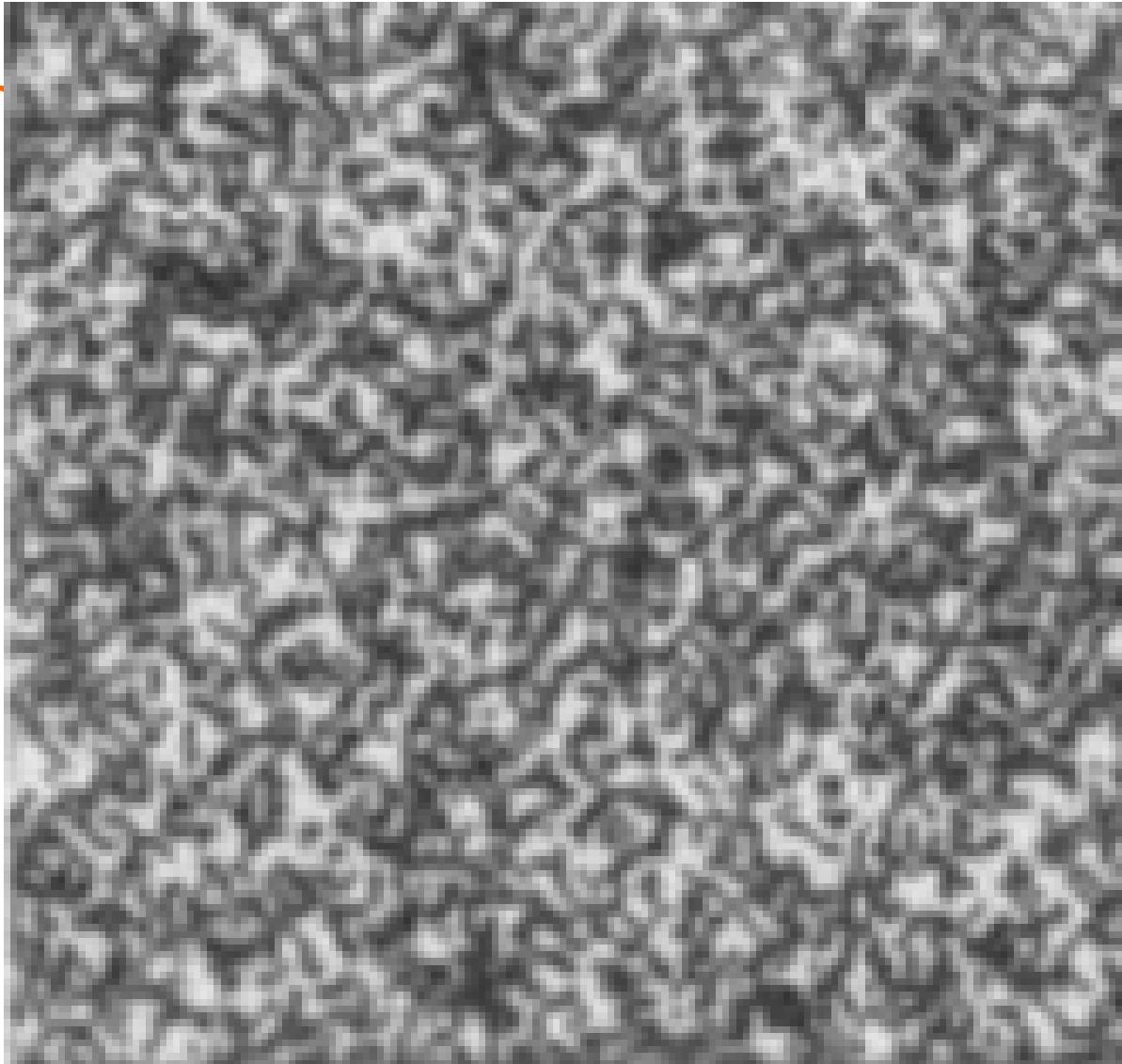


Reprinted from "Stereo by Intra- and Intet-Scanline Search," by Y. Ohta and T. Kanade, IEEE Trans. on Pattern Analysis and Machine Intelligence, 7(2):139-154 (1985). © 1985 IEEE.



Optical flow

Wh





Optical flow



Results

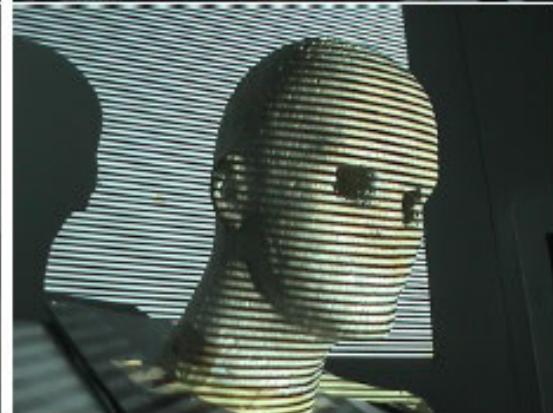
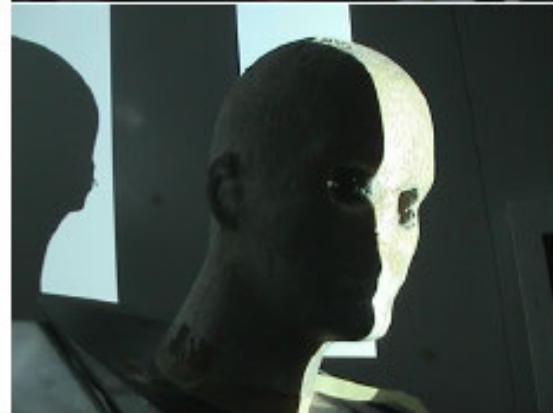




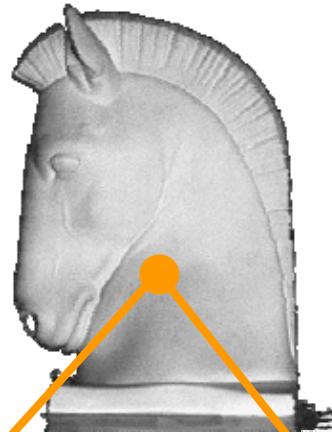
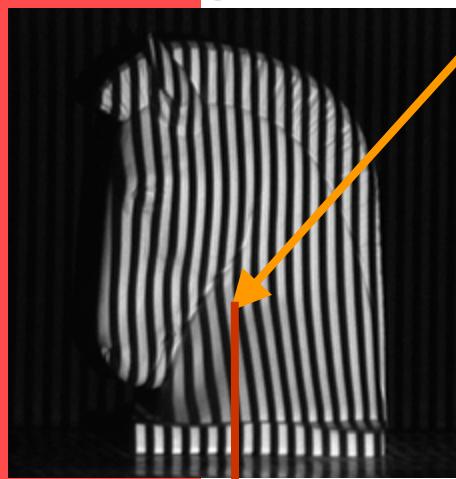
Active Vision: Structured Light



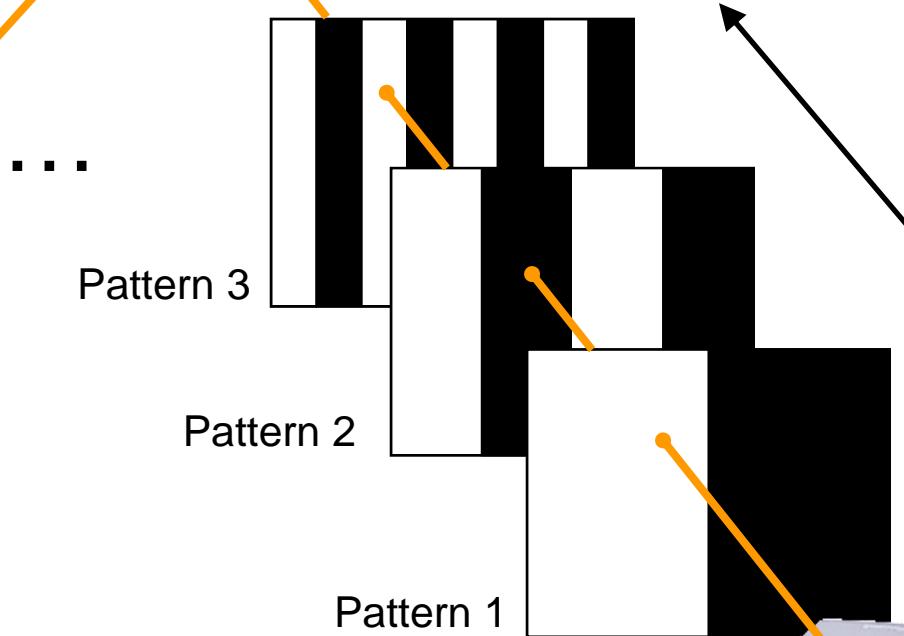
Active Vision: Structured Light



Binary Coding



Example: 7
binary patterns
proposed by
Posdamer &
Altschuler



Codeword of this pixel: 1010010 →
identifies the corresponding pattern stripe





Example:
Bouguet and
Perona,
ICCV'98

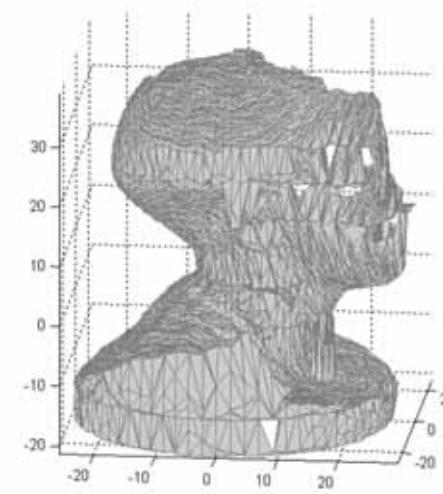
“Cheap and smart” Solution



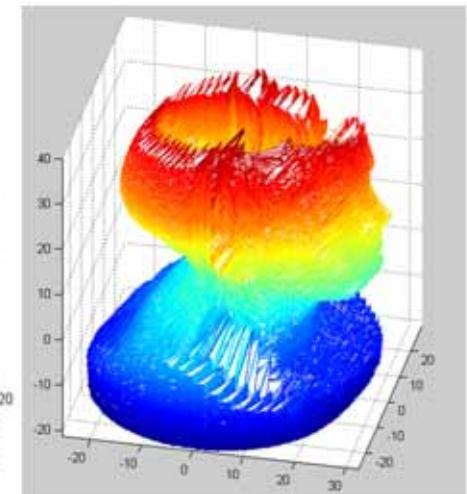


Structured Light Using a Rotating Table

James Clark, 3D CV F2009



Height Strip Mesh

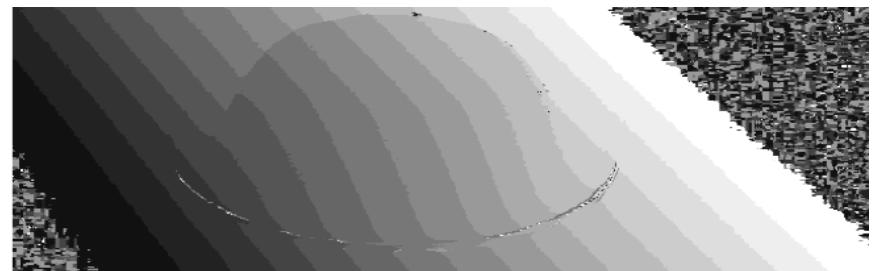
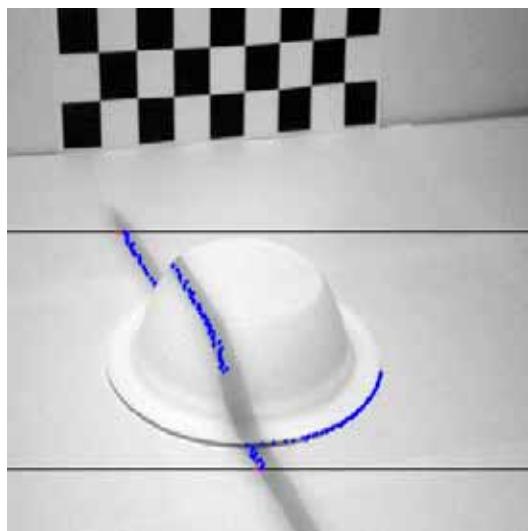


Localized Mesh



Structured Light

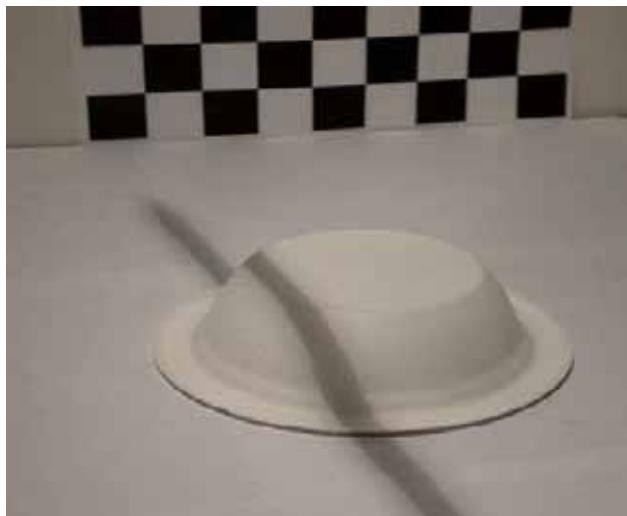
Anuja Sharma, Abishek Kumar



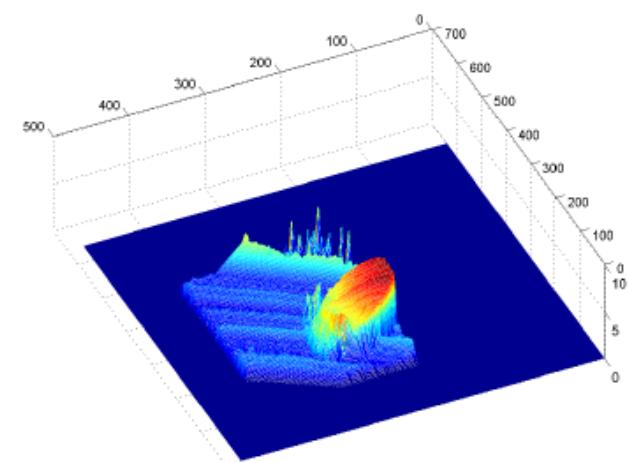


Structured Light

Anuja Sharma, Abishek Kumar



3D plot 1



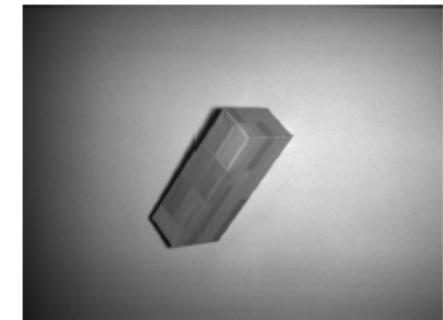
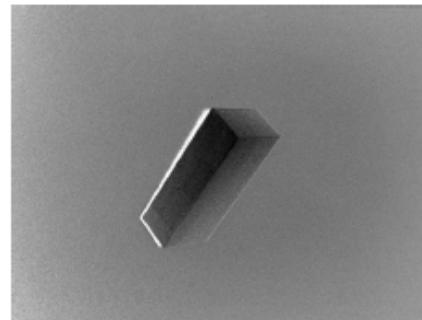


Range Sensor Data Processing to get 3D Shapes

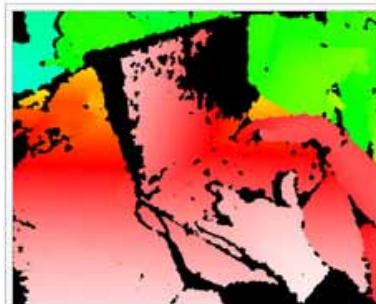
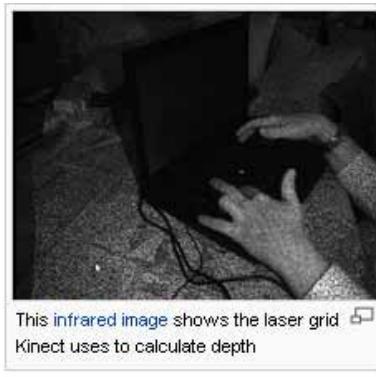




Input Data: Depth Maps

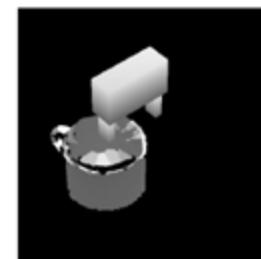


Range Image (left) and gray level image (right)



(e)

(f)



(g)

(h)

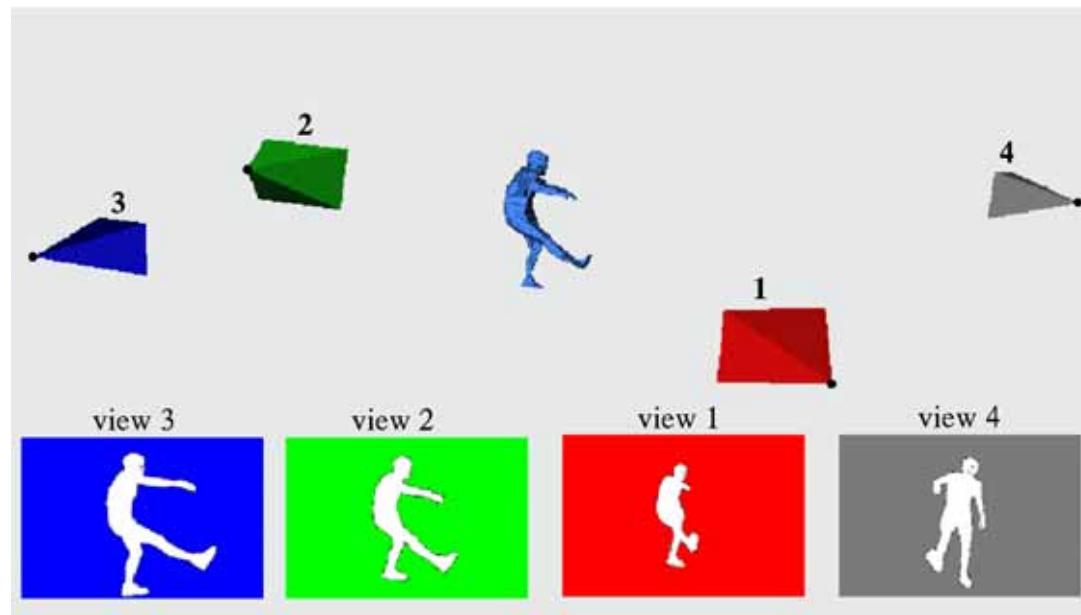
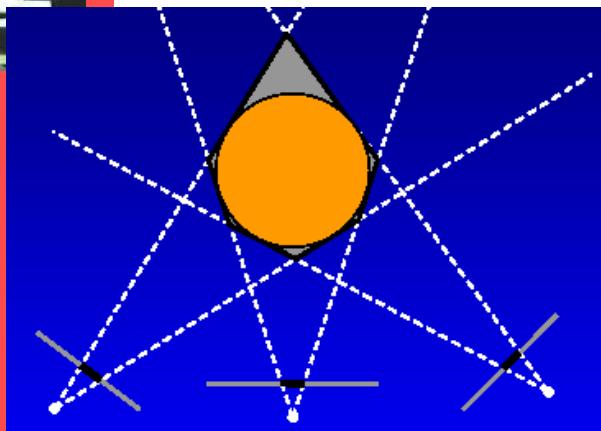
Figure 9: Continuation of the example scene consisting of four objects. (e) and (f) grasping the Scotch tape roller, and (g) and (h) grasping the coffee cup.



3D Shape Cues: Shape from Silhouettes

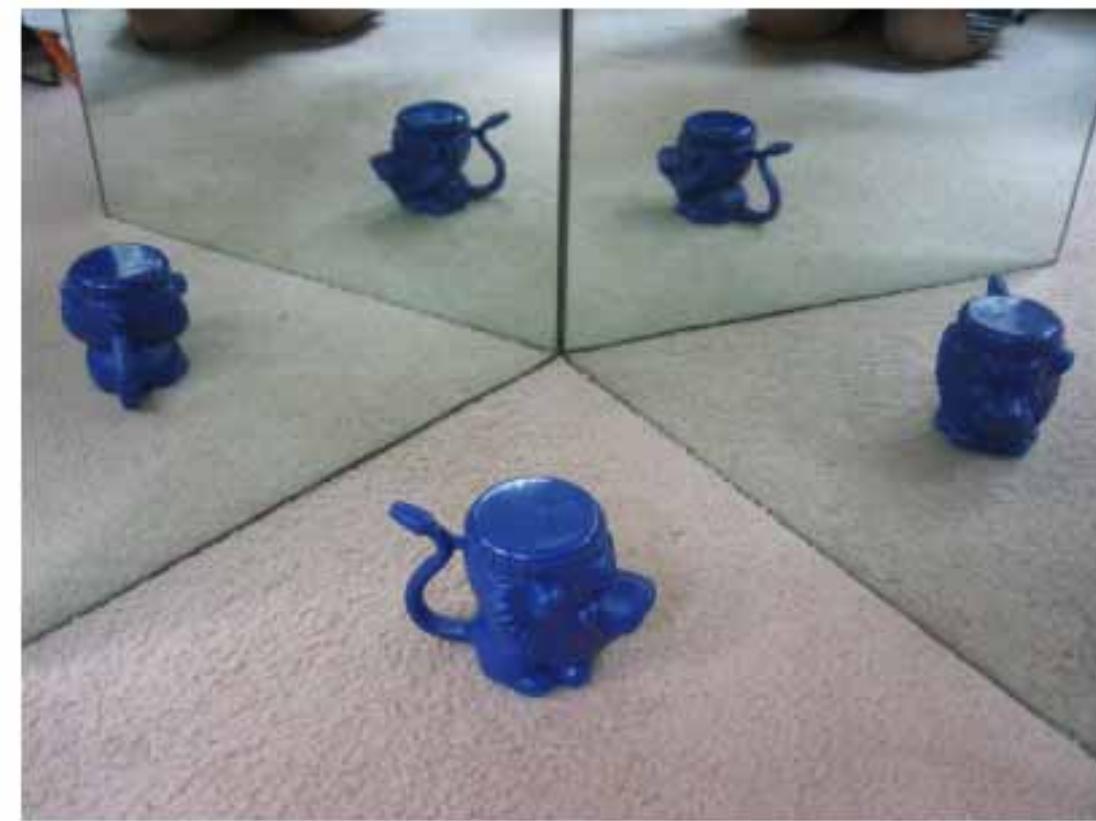


3D Shape from Silhouettes





3D shape from silhouettes: Two Mirrors and uncalibrated camera

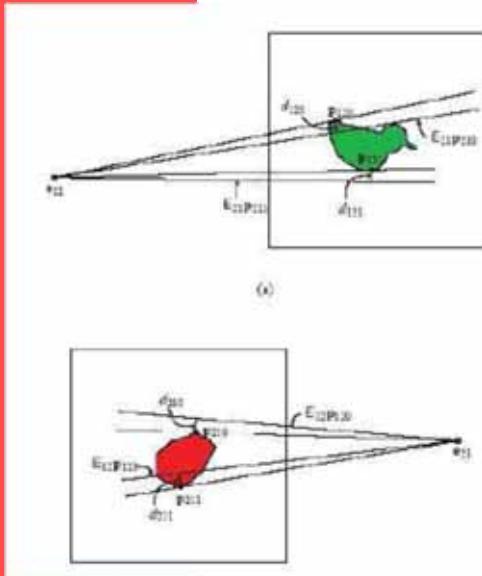


Forbes et al.,
ICCV2005

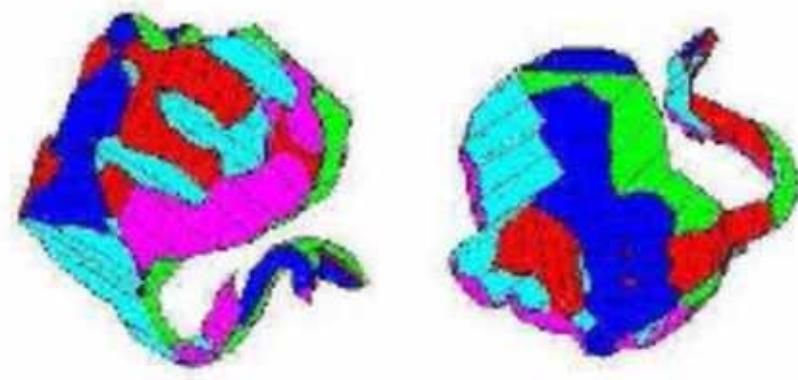
Christine Xu,
Computer Vision
Student Project



3D shape from silhouettes



Build 3D model

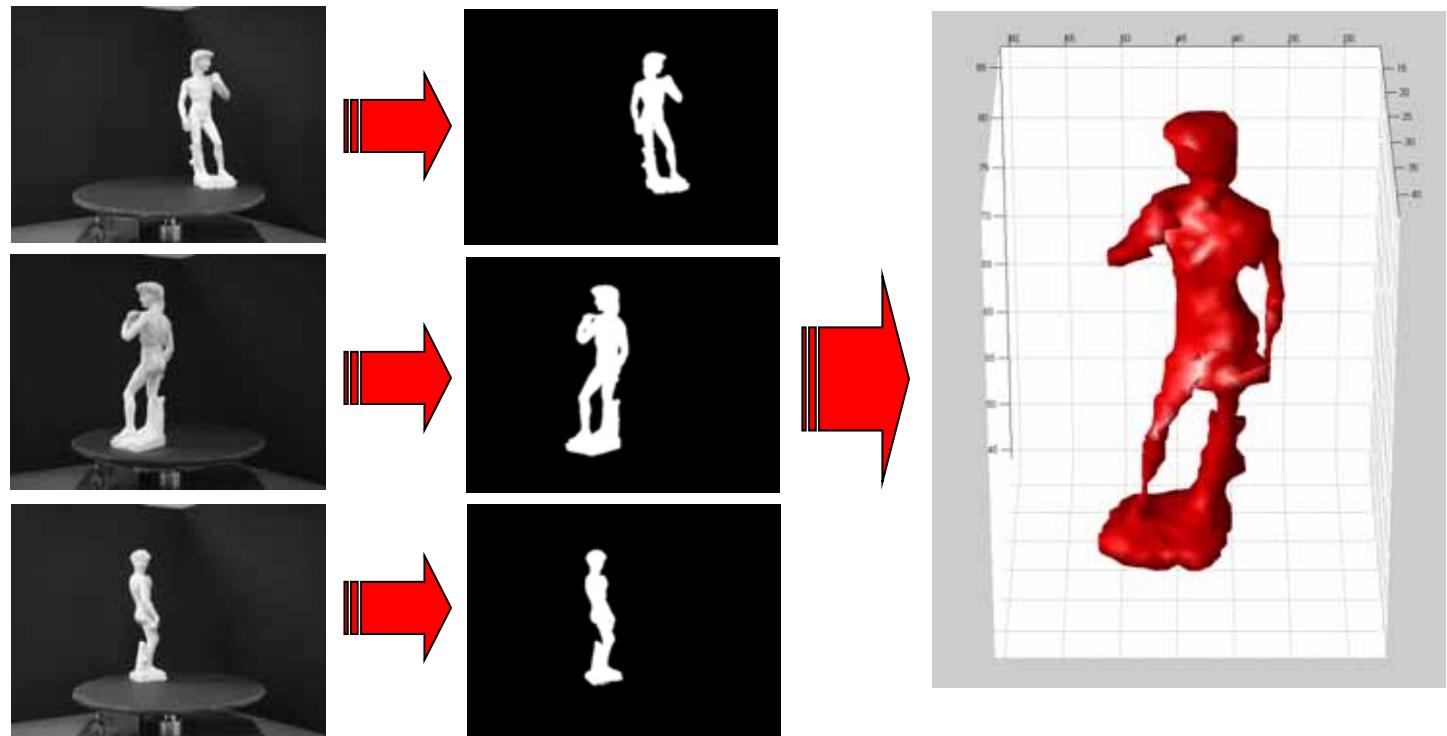


Visualize 3D model from arbitrary viewing angles



Example

- Compute visual hull with silhouette images from multiple calibrated cameras
- Compute Silhouette Image
- Volumetric visual hull computation
- Display the result





Shape from Shading



Photometric Stereo

Christopher Bireley



Bandage Dog



Imaging Setup





Preprocessing

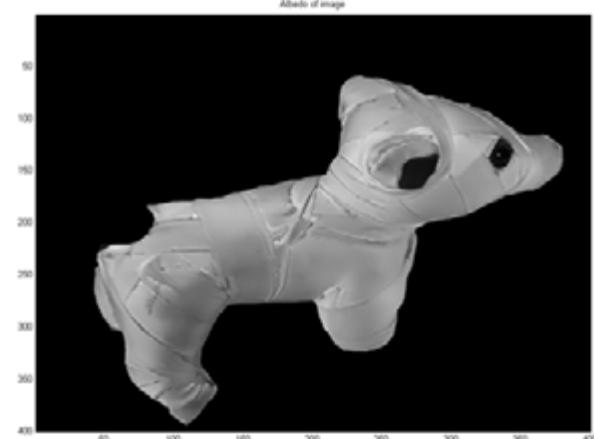
- Remove background to isolate dog
- Filter with NL Means



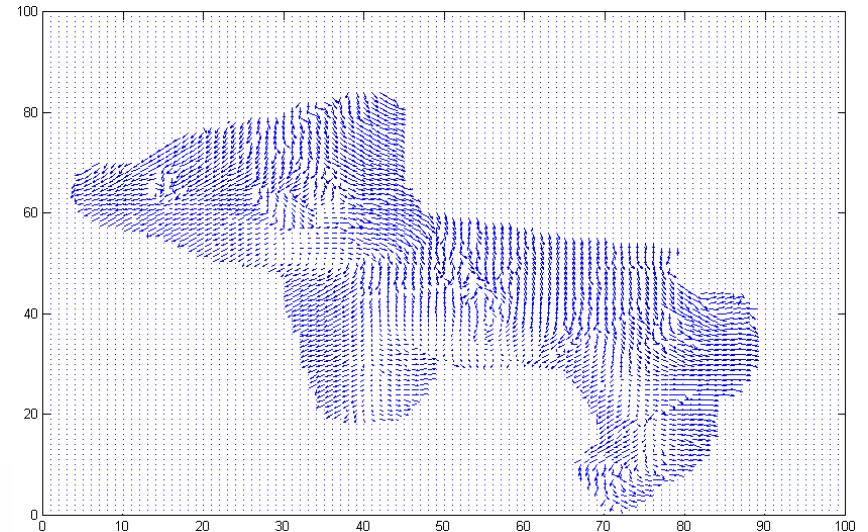


Photometric Stereo

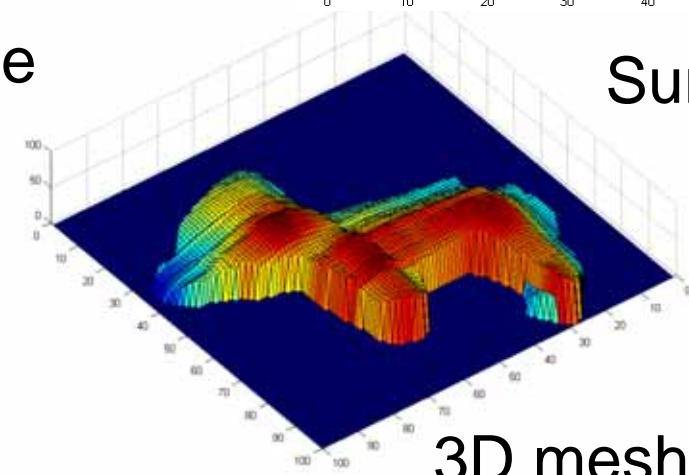
Christopher Bireley



Albedo image



Surface Normals



3D mesh



Results – Lord Buddha Images – Pre-Processed Images

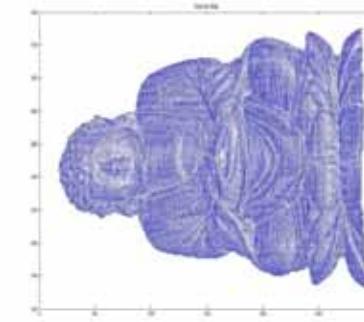
Guozhen Fan and Aman Shah



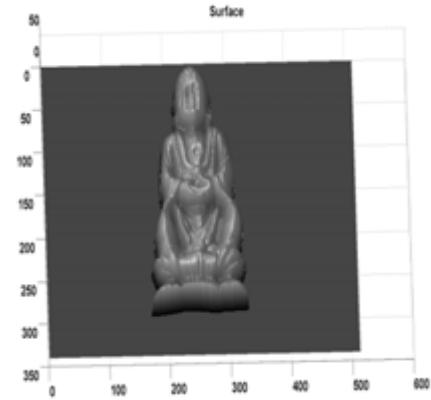
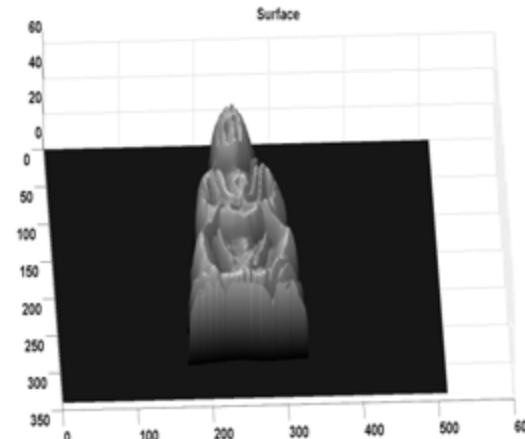
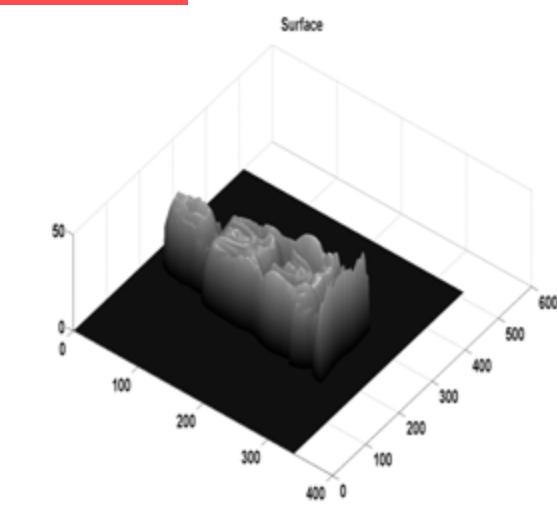
Original Image



Albedo Map



Surface Normals



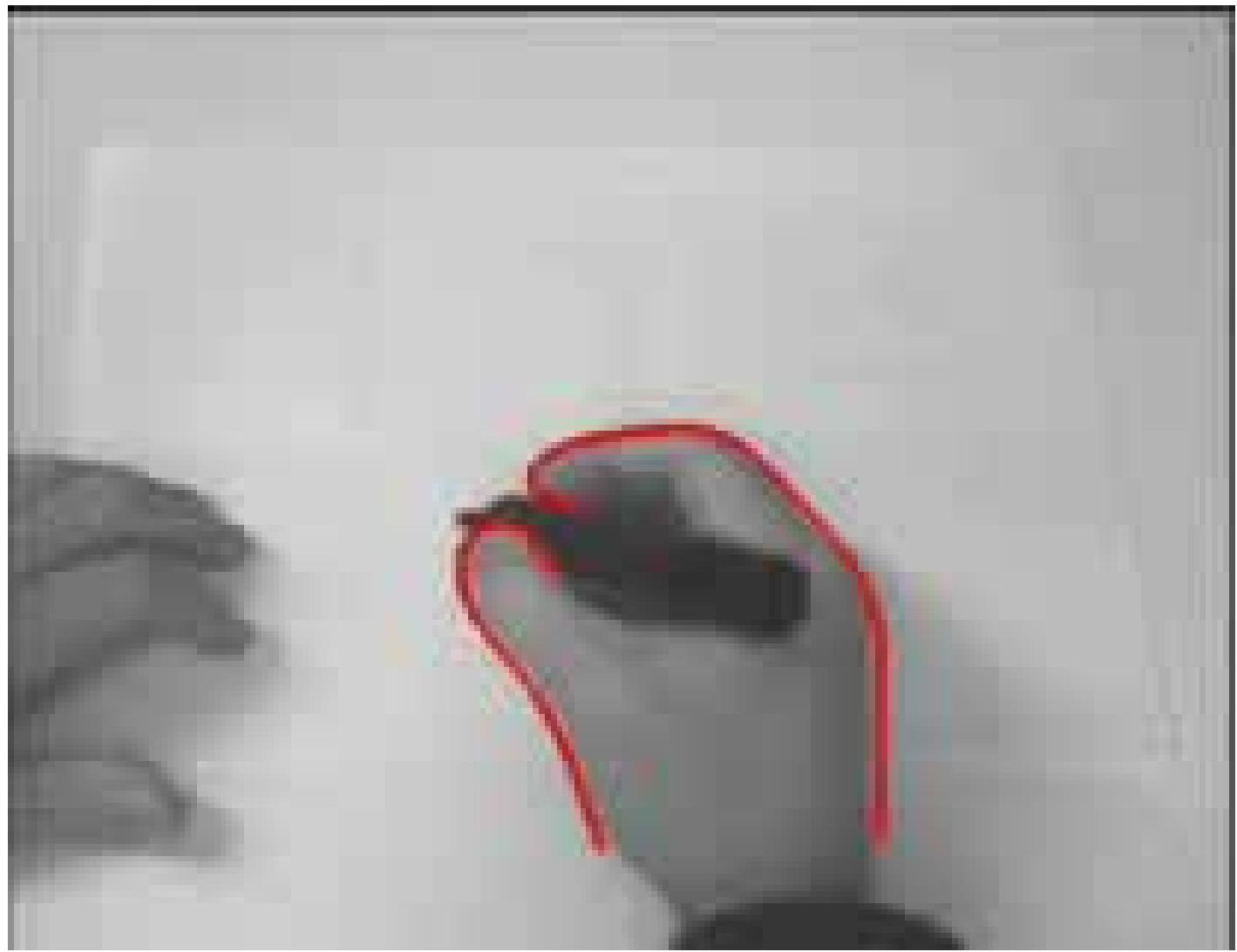
Obtained Surfaces from different angles



Object Tracking



Object Tracking: Using Deformable Models in Vision





Object Tracking: Using Deformable Models in Vision: II

**Unifying Boundary and
Region-based information for
Geodesic Active Tracking**

Object Tracking III





Computer Vision Systems



Webcam Based Virtual Whiteboard

Jon Bronson James Fishbaugh

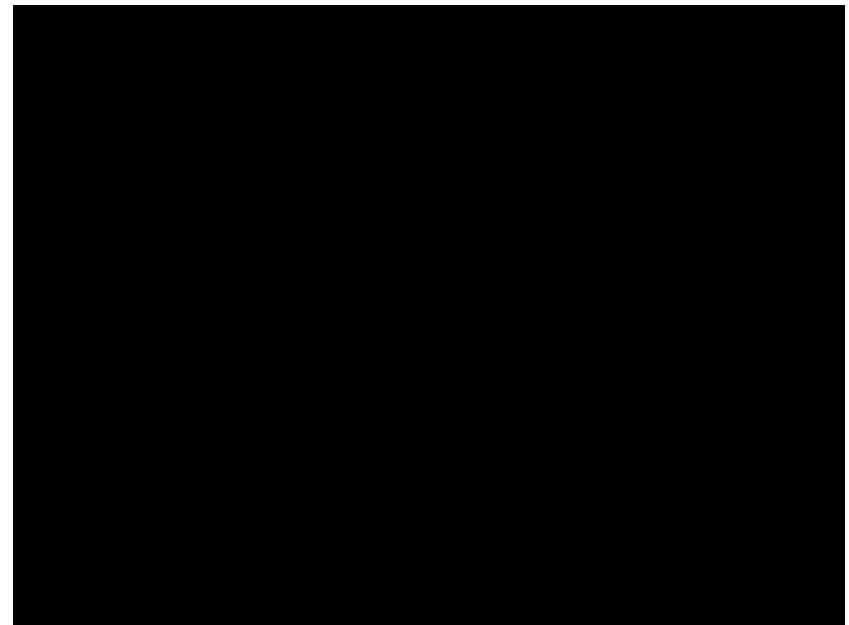
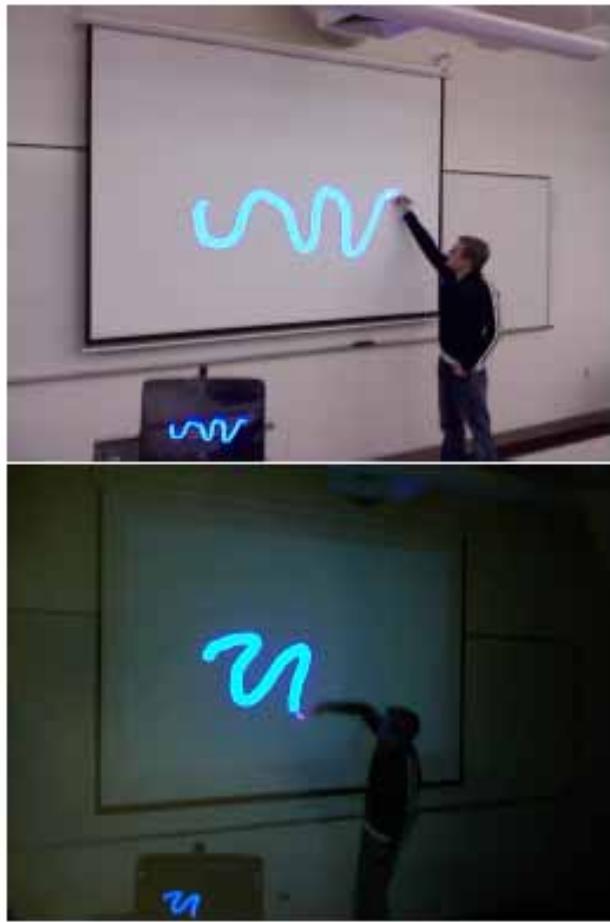
- Blackboards came first
- Whiteboards eventually followed
- Virtual Whiteboards are coming
- Basic Idea:
 - Write on any surface
 - Use no ink/chalk
 - Store all information to disk





Webcam Based Virtual Whiteboard

Jon Bronson James Fishbaugh





Real-Time 3D Glowstick Detection

Computer Vision Project 2009

Andrei Ostanin



Detecting the 3D position of glowsticks in real-time using two cameras.

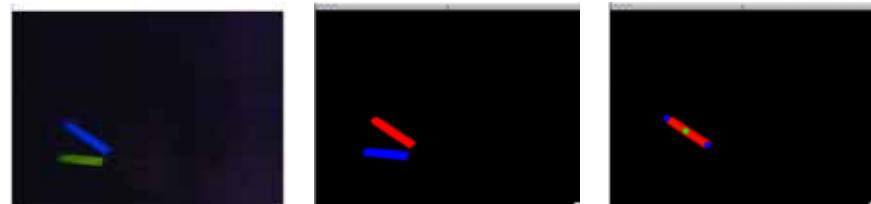
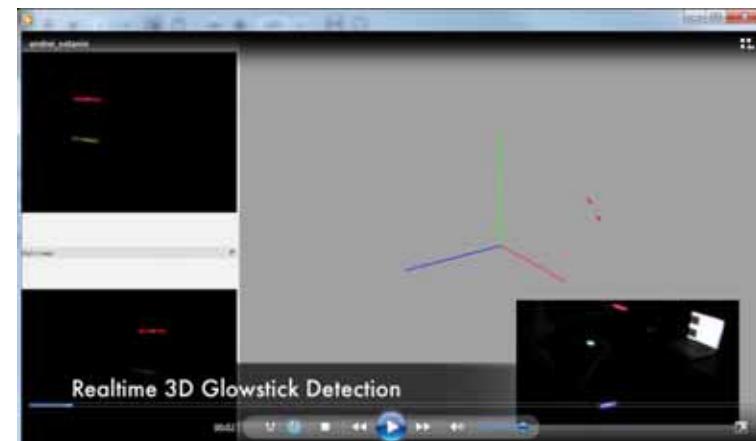


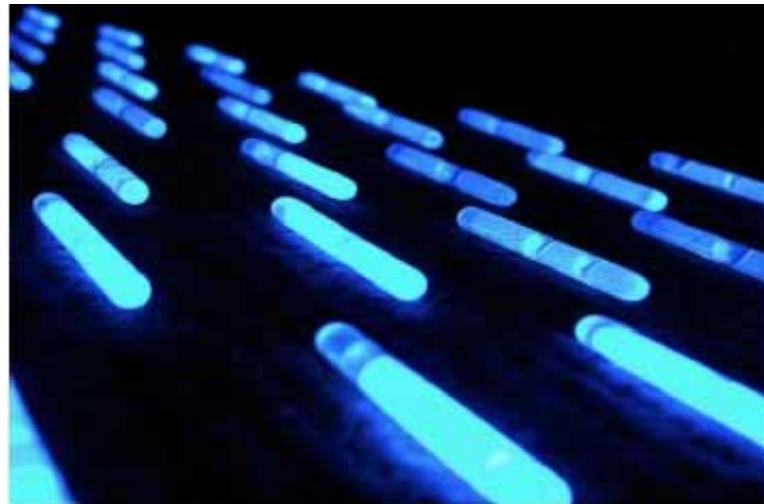
Figure 2. Feature Input Steps



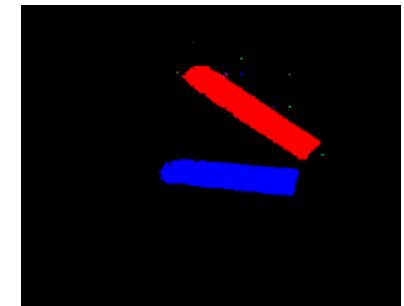


Realtime Glowstick Detection

Andrei Ostanin



- ▶ Capture the 3D position of glowsticks in real-time using two webcams
- ▶ Environment dark enough that glowsticks are easily segmented out
- ▶ Prefer speed over correctness

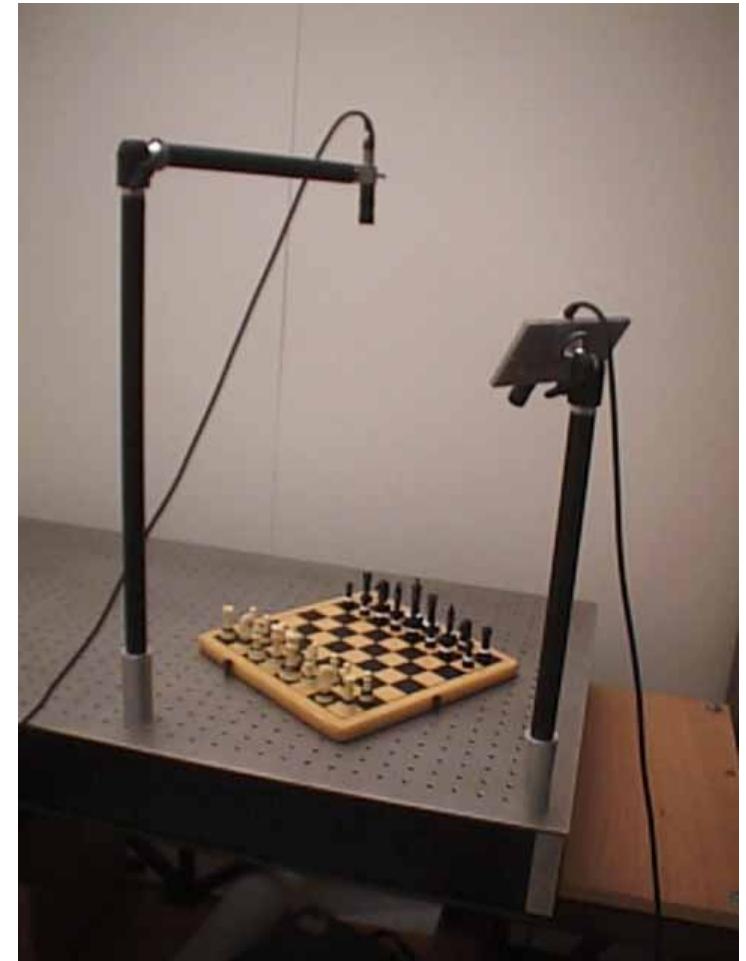


[movie](#)



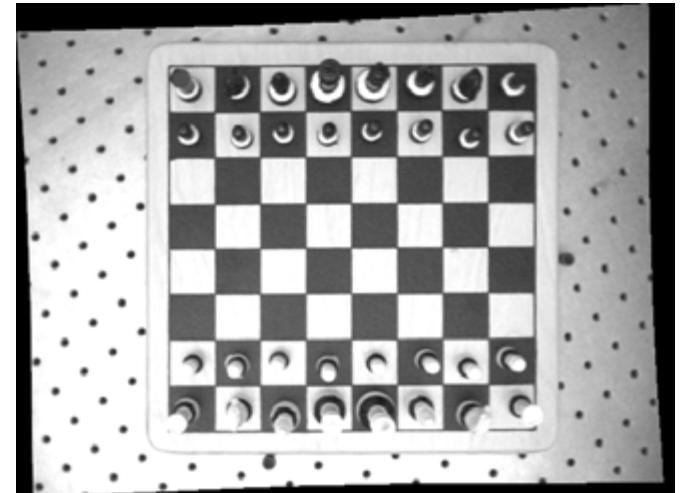
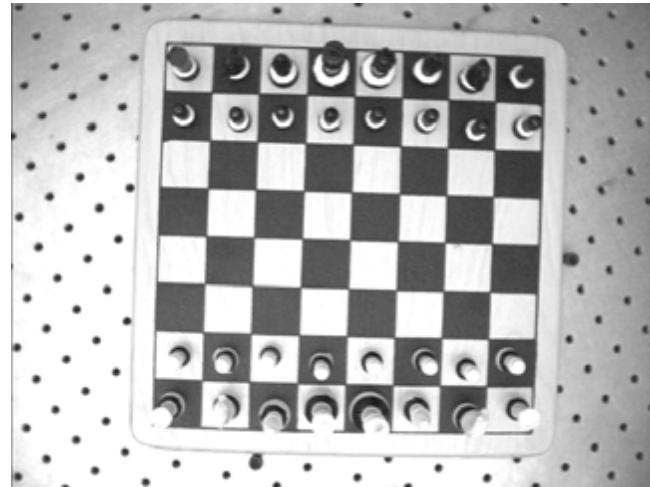
Student Project: Playing Chess, Recognition and Simulation

- Track individual chess pieces
- Maintain state of board
- Graphically represent state changes and state
- D. Allen, D. McLaurin
UNC
- Major ideas:
 - 3D from stereo
 - detect and describe changes
 - Use world knowledge (chess)

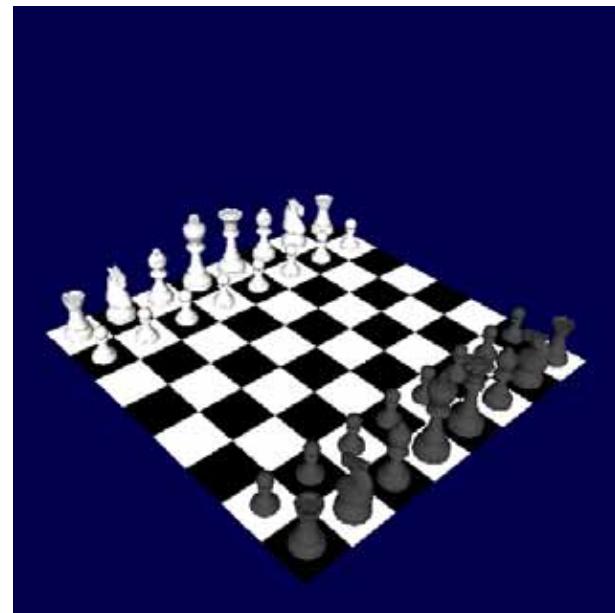




Calibration, Rendering & Replay



Movie





Goal and objectives

From Snapshots, a 3-D View

NYT, August 21, 2008, Personal Tech

<http://www.nytimes.com/2008/08/21/technology/personaltech/21pogue.html>



Stuart Goldenberg



Next class: Image Formation

Chapter 1: Cameras

- Please find pdf copies of Chapters 1&2, Forsyth&Ponce, on the website.
- Purchase the course book on your own.

Assignment:

- Read Chapter 1: Cameras, Lenses and Sensors: See Course [home page](#)

