

# Introduction

Introduction to Computer Vision  
CSE 152  
Lecture 1

# What is Computer Vision?

- Trucco and Verri (Text): Computing properties of the 3-D world from one or more digital images
- Sockman and Shapiro: To make useful decisions about real physical objects and scenes based on sensed images
- Ballard and Brown: The construction of explicit, meaningful description of physical objects from images.
- Forsyth and Ponce: Extracting descriptions of the world from pictures or sequences of pictures”

# Why is this hard?



- What is in this image?
1. A hand holding a man?
  2. A hand holding a mirrored sphere?
  3. An Escher drawing?

- Interpretations are ambiguous
- The forward problem (graphics) is well-posed
- The “inverse problem” (vision) is not

# We all make mistakes

“640K ought to be enough for anybody.” – Bill Gates, 1981

“...” – Marvin Minsky

# What do you see?

- ▣ Changing viewpoint
- ▣ Moving light source
- ▣ Deforming shape



# What was happening

- ▣ Changing viewpoint
- ▣ Moving light source
- ✗ Deforming shape



## Should Computer Vision follow from our understanding of Human Vision?

### Yes & No

- Who would ever be crazy enough to even try creating machine vision?
  - Human vision “works”, and copying is easier than creating.
  - Secondary benefit – in trying to mimic human vision, we learn about it.
- Why limit oneself to human vision when there is even greater diversity in biological vision
  - Why limit oneself to biological when there may be greater diversity in sensing mechanism?
  - Biological vision systems evolved to provide functions for “specific” tasks and “specific” environments. These may differ for machine systems
  - Implementation – hardware is different, and synthetic vision systems may use different techniques/methodologies that are more appropriate to computational mechanisms

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## Why study Computer Vision?

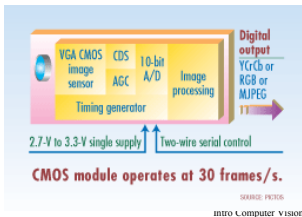
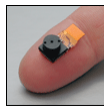
- Images and movies are everywhere
- Fast-growing collection of useful applications
  - building representations of the 3D world from pictures
  - automated surveillance (who’s doing what)
  - Hollywood special effects
  - face recognition
- Various deep and attractive scientific mysteries
  - how does object recognition work?
  - Beautiful marriage of math, biology, physics, engineering
- Greater understanding of human vision

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## The Near Future: Ubiquitous Vision

- Five years from now, digital cameras will cost 1 cent (sensor cost).
- Digital video will be a widely available commodity embedded in cell phones, PDA’s, doorbells, bridges, security systems, cars, etc.
- 99.9% of digitized video won’t be seen by a person.
- That doesn’t mean that only 0.1% is important!



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## Applications: touching your life

- Football
- Movies
- Surveillance
- HCI – hand gestures, American Sign Language
- Face recognition & Biometrics
- Road monitoring
- Industrial inspection
- Robotic control
- Autonomous driving
- Space: planetary exploration, docking
- Medicine – pathology, surgery, diagnosis
- Microscopy
- Military
- Remote Sensing

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## Related Fields

- Image Processing
- Computer Graphics
- Pattern Recognition
- Perception
- Robotics
- AI

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## Image Interpretation - Cues

- Variation in appearance in multiple views
  - stereo
  - motion
- Shading & highlights
- Shadows
- Contours
- Texture
- Blur
- Geometric constraints
- Prior knowledge

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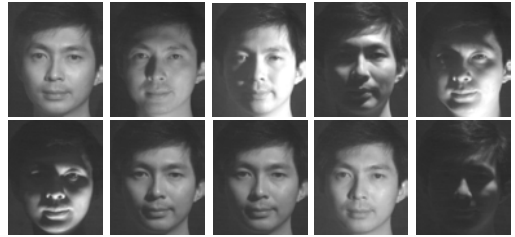
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## Shading and lighting

Shading as a result of differences in lighting is

1. A source of information
2. An annoyance

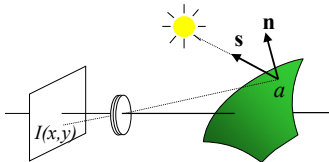
## Illumination Variability



“The variations between the images of the same face due to illumination and viewing direction are almost always larger than image variations due to change in face identity.”

-- Moses, Adini, Ullman, ECCV '94

## Image Formation



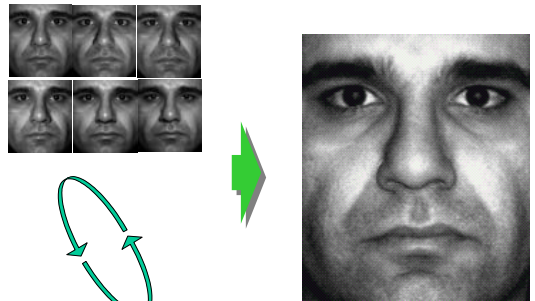
At image location  $(x,y)$  the intensity of a pixel  $I(x,y)$  is

$$I(x,y) = a(x,y) \mathbf{n}(x,y) \cdot \mathbf{s}$$

where

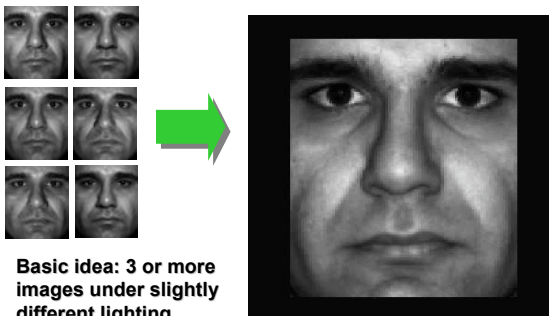
- $a(x,y)$  is the albedo of the surface projecting to  $(x,y)$ .
- $\mathbf{n}(x,y)$  is the unit surface normal.
- $\mathbf{s}$  is the direction and strength of the light source.

## Lighting variation



Single Light Source

## Shading reveals shape



**Basic idea: 3 or more images under slightly different lighting**

## The course

- Part 1: The Physics of Imaging
- Part 2: Early Vision (Segmentation)
- Part 3: Reconstruction (Shape-from-X)
- Part 4: Recognition

## Part I of Course: The Physics of Imaging

- How images are formed
  - Cameras
    - What a camera does
    - How to tell where the camera was located
  - Light
    - How to measure light
    - What light does at surfaces
    - How the brightness values we see in cameras are determined
  - Color
    - The underlying mechanisms of color
    - How to describe it and measure it

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## Cameras, lenses, and sensors



Figure 1.16 The first photograph on record, *la table servie*, obtained by Nicéphore Niepce in 1822. Collection Harlinge-Viollet.

From *Computer Vision*, Forsyth and Ponce, Prentice-Hall, 2002.

- Pinhole cameras
- Lenses
- Projection models
- Geometric camera parameters

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## Color



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## Part II: Early Vision in One Image

- Representing small patches of image
  - For three reasons
    - Sharp changes are important in practice --- known as “edges”
    - Representing texture by giving some statistics of the different kinds of small patch present in the texture.
      - Tigers have lots of bars, few spots
      - Leopards are the other way
    - We wish to establish correspondence between (say) points in different images, so we need to describe the neighborhood of the points

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## Segmentation

- Which image components “belong together”?
- Belong together  $\cong$  lie on the same object
- Cues
  - similar color
  - similar texture
  - not separated by contour
  - form a suggestive shape when assembled

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## Texture Patterns

[Leung, Malik]



- Regular texture pattern, repeated texture elements
- Segment image based on texture
- Surface shape from texture pattern

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## Boundary Detection



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## Boundary Detection: Local cues



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## Gradients

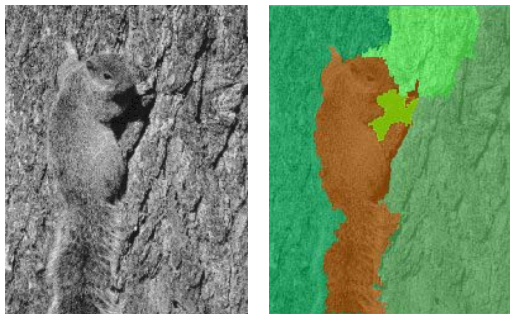


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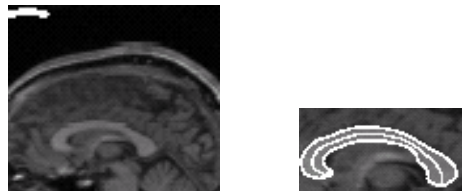
(Sharon, Balun, Brandt, Basri)

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## Boundary Detection



Finding the Corpus Callosum

(G. Hamarneh, T. McInerney, D. Terzopoulos)

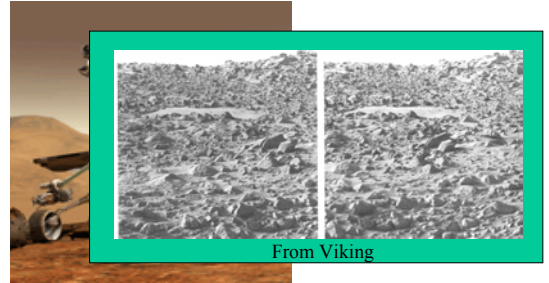
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### Part 3: Reconstruction from Multiple Images

- Photometric Stereo
  - What we know about the world from lighting changes.
- The geometry of multiple views
- Stereopsis
  - What we know about the world from having 2 eyes
- Structure from motion
  - What we know about the world from having many eyes
  - or, more commonly, our eyes moving.

### Mars Rover

Spirit



Façade (Debevec, Taylor and Malik, 1996)  
Reconstruction from multiple views, constraints, rendering

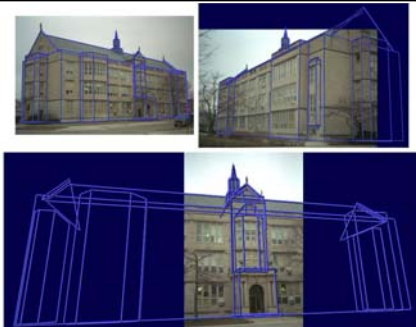


Architectural modeling:

- photogrammetry;
- view-dependent texture mapping;
- model-based stereopsis.

Reprinted from "Modeling and Rendering Architecture from Photographic: A Hybrid Geometry- and Image-Based Approach,"  
By P. Debevec, C.J. Taylor, and J. Malik,  
Proc. SIGGRAPH (1996). © 1996 ACM, Inc.  
Included here by permission.

### Images with marked features



Recovered model edges reprojected through recovered camera positions into the three original images

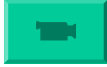
### Resulting model & Camera Positions





## Façade

- The Camponile Movie



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## Video-Motion Analysis

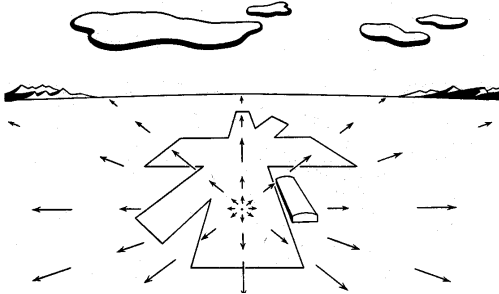


- Where “things” are moving in image – segmentation.
- Determining observer motion (egomotion)
- Determining scene structure
- Tracking objects
- Understanding activities & actions

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## Forward Translation & Focus of Expansion [Gibson, 1950]



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## Tracking

- Use a model to predict next position and refine using next image
- Model:
  - simple dynamic models (second order dynamics)
  - kinematic models
  - etc.
- Face tracking and eye tracking now work rather well

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## Visual Tracking



### Main Challenges

1. 3-D Pose Variation
2. Occlusion of the target
3. Illumination variation
4. Camera jitter
5. Expression variation etc.

[ Ho, Lee, Kriegman ]

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## Part 4: Recognition



Given a database of objects and an image determine what, if any of the objects are present in the image.

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## Recognition Challenges

- Within-class variability
  - Different objects within the class have different shapes or different material characteristics
  - Deformable
  - Articulated
  - Compositional
- Pose variability:
  - 2-D Image transformation (translation, rotation, scale)
  - 3-D Pose Variability (perspective, orthographic projection)
- Lighting
  - Direction (multiple sources & type)
  - Color
  - Shadows
- Occlusion – partial
- Clutter in background -> false positives

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## Face Detection: First Step



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## Why is Face Recognition Hard?

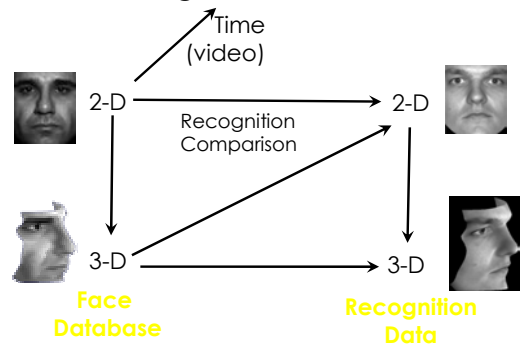
### Many faces of Madonna



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## Face Recognition: 2-D and 3-D



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## Object Recognition: 2-D Image-based

- Some objects are 2D patterns
  - e.g. faces
- Build an explicit pattern matcher
  - discount changes in illumination by using a parametric model
  - changes in background are hard
  - changes in pose are hard



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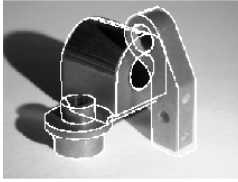
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[http://www.ri.cmu.edu/projects/project\\_271.html](http://www.ri.cmu.edu/projects/project_271.html)

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## Model-Based Vision

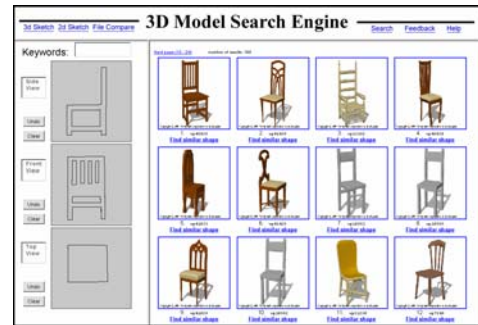


- Given 3-D models of each object
- Detect image features (often edges, line segments, conic sections)
- Establish correspondence between model & image features
- Estimate pose
- Consistency of projected model with image.

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## Object Classes: Chairs



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(Funkhouser, Min, Kazhdan, Chen, Halderman, Dobkin, Jacobs)

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## Announcements

- Class Web Page is up:
  - <http://www.cs.ucsd.edu/classes/sp05/cse152/>
- Assignment 0: “**Getting Started with Matlab**” (to be posted soon), due 4/7/05
- Read Chapters 1 Trucco & Verri

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## The Syllabus

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