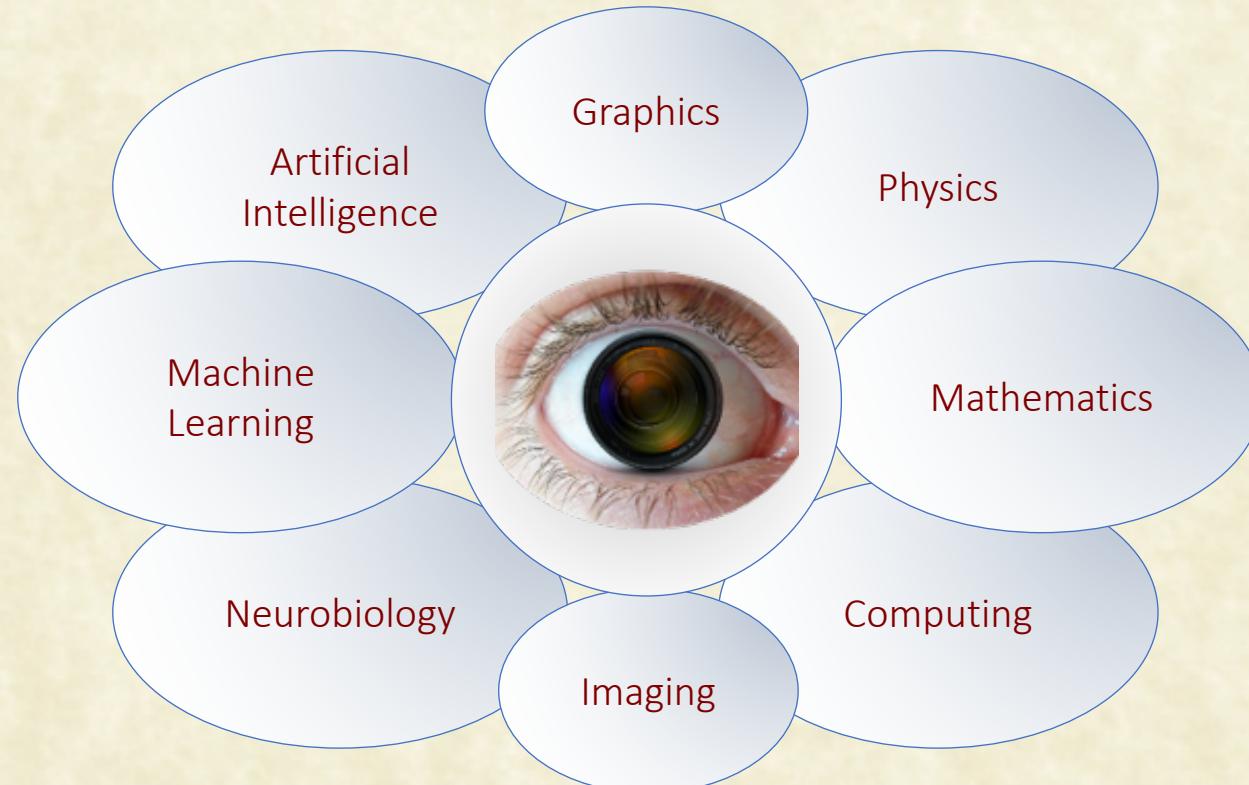




# CSE 578: Computer Vision

## Spring 2021: Introduction



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IIIT Hyderabad



# Course Outline, Topics

1

## Computer Vision

### M1: Geometry

Pinhole Camera Model

2

Proj. Geometry, Camera Matrix

Camera Calibration

2-View Geometry, Homography

Fundamental Matrix

Stereo Corr., Depth Estimation

5

SFM and Bundle Adjustment

Image Rectification

Computational Imaging

### M2: Image Grouping

Segmentation as Labelling

3

Graphcut, Binary Segmentation

MRF for Segmentation

Multi-label MRFs

Deep Learning for Segmentation

4

Face Detection

Pedestrian Detection (HoG,SVM)

Bag of Words, SURF, Others

Deformable Parts Model

Indexing and Retrieval

CNNs for Detection and Recog.

### Image-to-Image Networks

Vision and Language



# What about Deep Learning?

- DL has become the primary driving force behind most recent success in CV. However, this is the first course on Computer Vision.
- Computer vision has a strong mathematical and conceptual basis developed over 4 decades
  - Geometry
  - Optimization
  - Visual object representations
  - Optics, Lighting, Appearance models
- You need to know the basics to build on it



# Pre-Requisites for the Course

- Linear algebra and a good mathematical outlook
  - Vectors, matrices, eigenvalues, singular values
  - 2D/3D geometry
  - See course page for a more detailed list of topics
- Image/Signal processing
  - Filtering, edge detection, segmentation
  - Transforms, analysis
- Pattern Analysis, Algorithms, Programming
  - Features, classifiers
  - Training, testing, validation
  - Python/C++, OpenCV

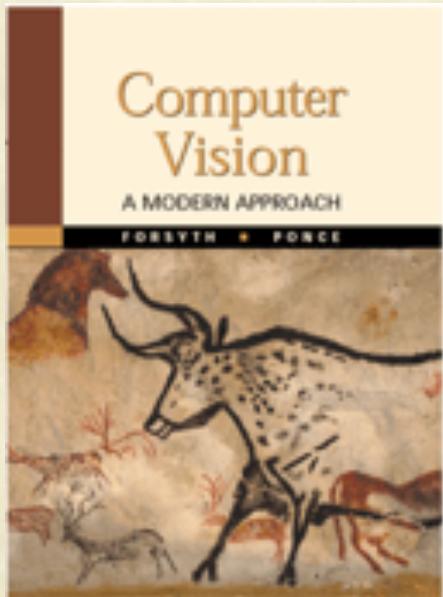
Brush up these topics if you aren't certain. A reading list of online material will be prepared for the preliminaries



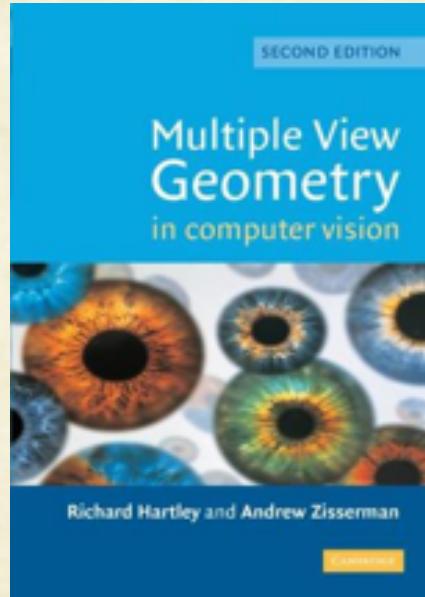
# Reference Books

No single textbook

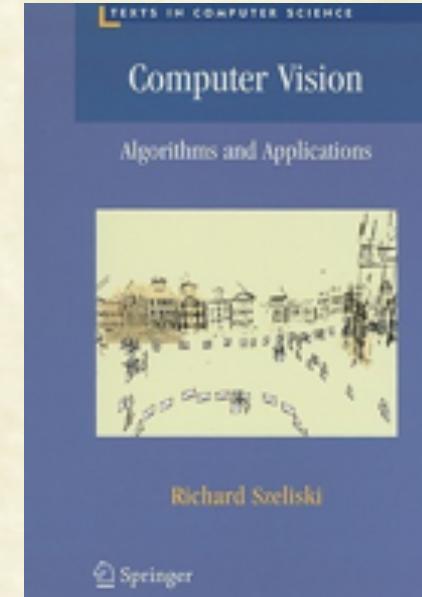
Forsyth & Ponce  
Indian Edition



Hartley & Zisserman  
Indian Edition



Rick Szeliski  
Free online version



... and read several research papers



# Administrivia

- Grade Distribution
  - In-class Quizzes: (~25%)
  - Tests/Quizzes: (~25%)
  - Homeworks/Assignments: 5 Assignments (~25%)
  - Project: In groups of 4 (~25%)
- This is an **advanced elective** that you opted for
  - We expect you to work hard to learn well.
  - Class participation lifts the level of the class
  - We don't want credit-seekers or resume-padders here
- Inverted Classes
  - Most classes will be conducted in the inverted class model
  - Content videos will be uploaded the day before.
  - Classes will start with a short quiz on the video followed by discussions and problem solving



# Class Etiquettes

- Be in the class before 2pm
  - Quiz will be available only for a fixed time starting at 2pm
- Reduce noise in the class
  - Switch off your cameras and microphones
  - Put your hand up if you have a question
  - You may also type your questions in the chat
- Watch the content video (multiple times if required) well in advance and be clear about the topic or with questions.
- If you have a doubt, ask. Others are also likely to have the same doubt.



# What is Computer Vision?

- Understanding of visual inputs (images/videos) by computers.
- Making sense out of them. Describing them.
- Does computer vision mimic the human vision?
  - Certainly in many of its goals
  - Why? Human vision is among the best!
  - Sophisticated and efficient but not understood well
- Should computers process visual inputs like humans?

**Not necessarily!**

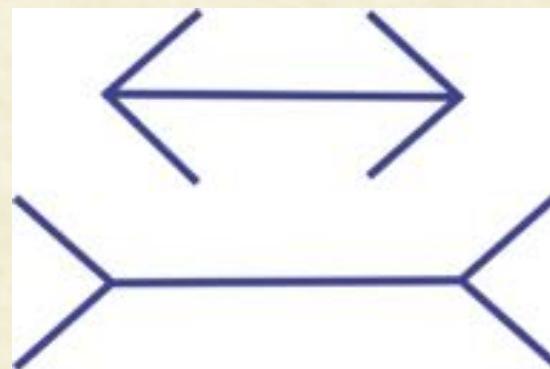
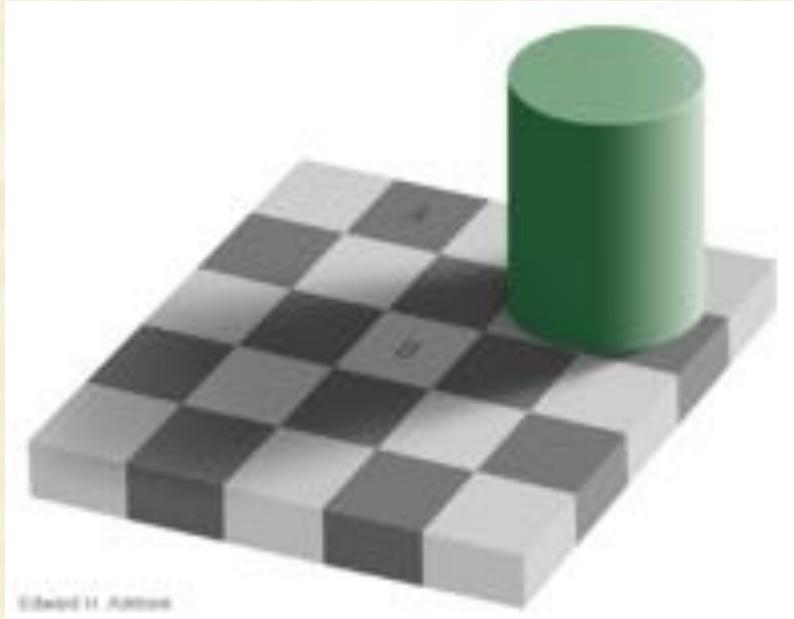
- Human visual system need not limit computer vision
- We draw inspiration from it as often as is convenient

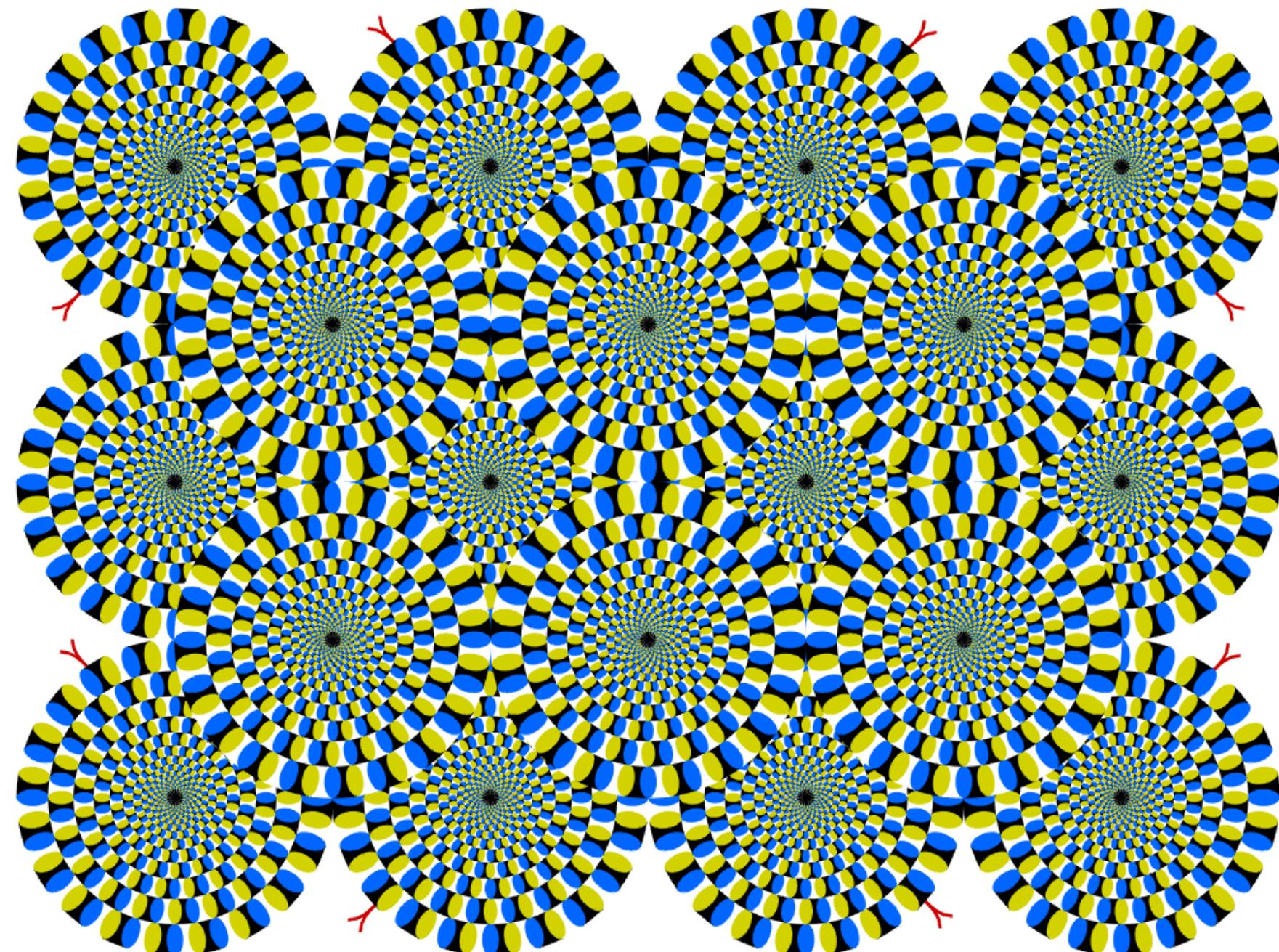


Human perception has its shortcomings...



Sinha and Poggio (Image: Ron Rensick)





Copyright [A.Kitaoka](#) 2003



# Three “Urges” on seeing a Picture\*

1. **To group** proximate and similar parts of the image into meaningful “regions”.

Called **segmentation** in computer vision.

2. **To connect to memory** to recollect previously seen “objects”.

Called **recognition** in computer vision.

3. **To measure** quantitative aspects such as number and sizes of objects, distances to/between them, etc.

Called **reconstruction** in computer vision.

\*Jitendra Malik; Mysore Park, Dec. 2011



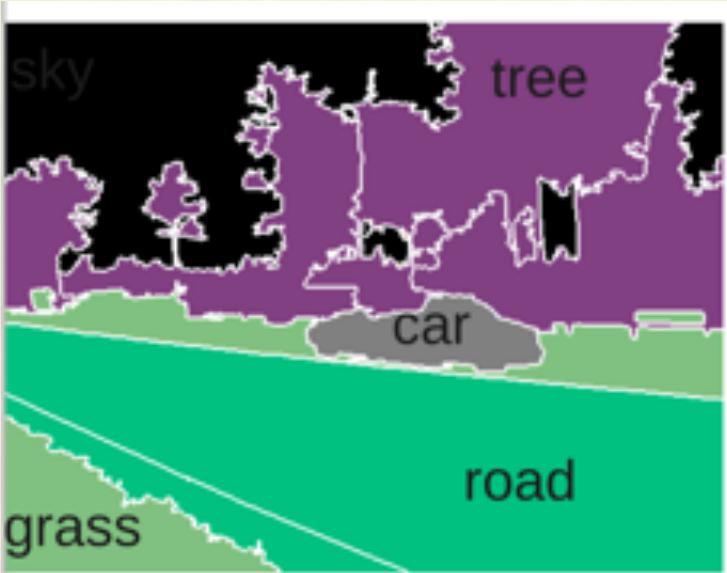
# Urge to Group



- We don't see individual pixels (like the computer does!).
- We see groups of pixels together.
- What is the basis for "correct" grouping?



# Urge to Group



- Group similar pixels together as objects.
- Group semantically meaningful pixels together as objects.
- Is appearance similarity the same as semantic similarity?



# Urge to Touch Memory



Recognizing objects from (visual) input is fundamental to human cognition of the world.



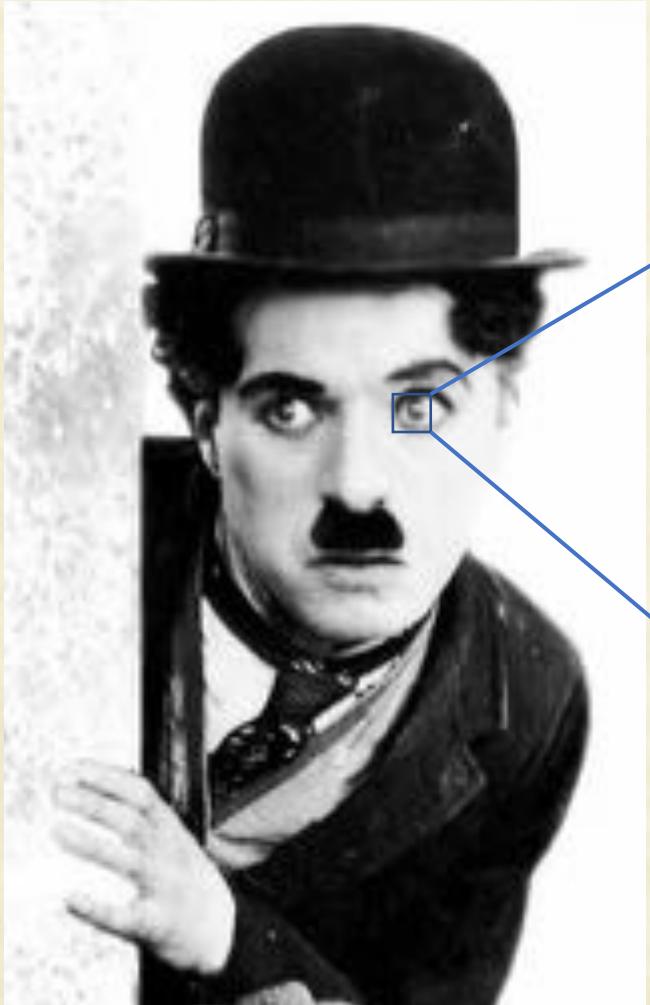
# Urge to Measure



We measure number, distance, colour, etc, from images.  
Sometimes correctly too!



# Why is it Difficult?



|     |     |     |     |     |     |     |     |
|-----|-----|-----|-----|-----|-----|-----|-----|
| 90  | 126 | 180 | 120 | 102 | 131 | 126 | 91  |
| 82  | 140 | 143 | 182 | 180 | 142 | 138 | 81  |
| 81  | 141 | 148 | 195 | 188 | 147 | 140 | 80  |
| 75  | 144 | 150 | 210 | 198 | 149 | 141 | 73  |
| 71  | 144 | 151 | 241 | 214 | 150 | 143 | 70  |
| 88  | 142 | 147 | 236 | 205 | 146 | 141 | 85  |
| 106 | 139 | 142 | 225 | 197 | 141 | 138 | 101 |
| 128 | 135 | 139 | 184 | 180 | 138 | 132 | 121 |



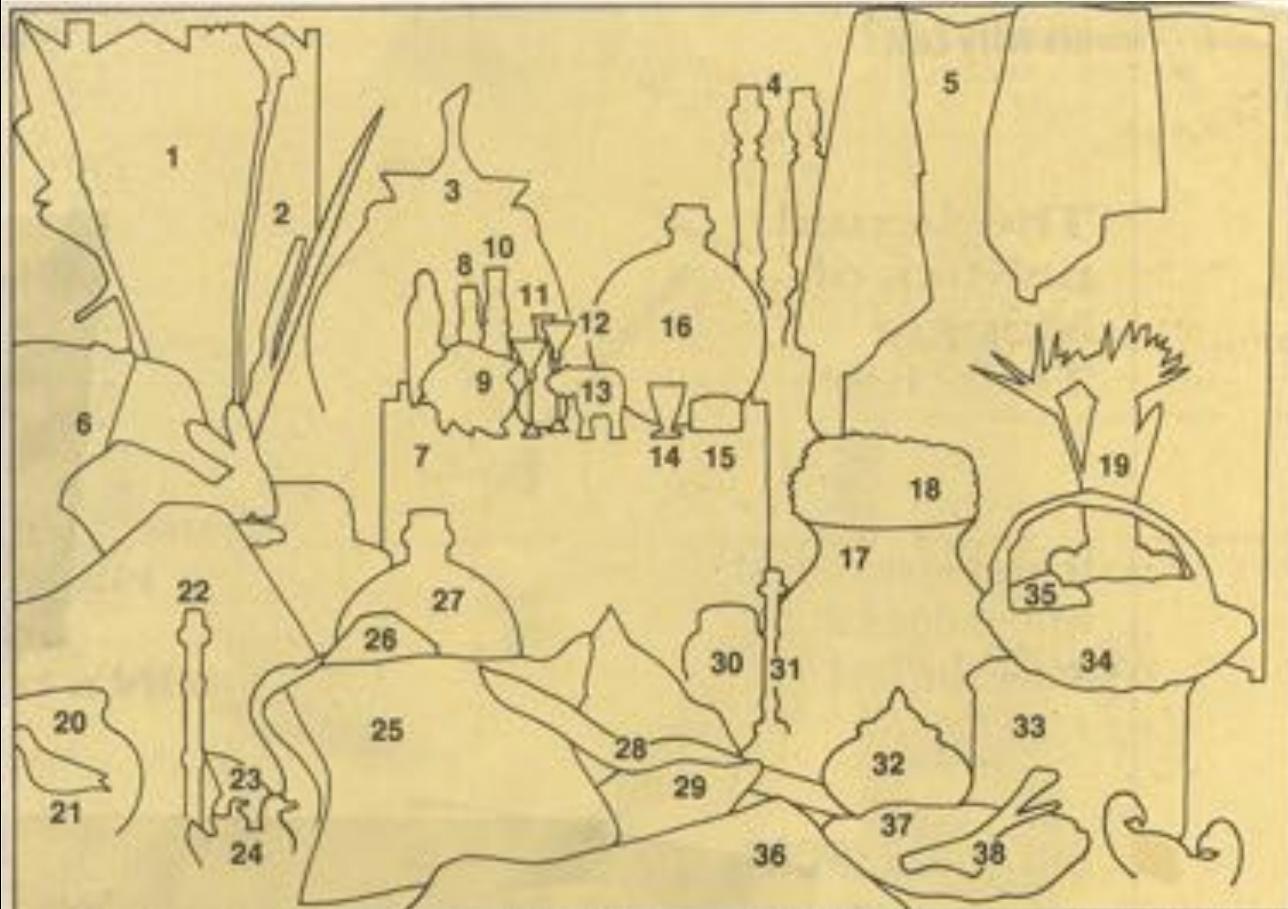
# Scene Interpretation





# Segmentation and Labeling

- 1.Hand-carved Shesham wooden screen
- 2.Wooden flowers
- 3.Wicker basket
- 4.Pair of hand-carved Thai candlesticks
- 5.Indonesian rattan screen
- 6.Dhurry covered armchair
- 7.Hand-painted chest
- 8.Striped wooden Indian candlestick
- 9.Stone terracotta Thai
- 10.Moroccan ceramic candlestick
- 11.Blue Egyptian glass decanter
- 12.Bronze goblet-shaped candlesticks
- 13.Painted wooden Indian elephant
- 14.Blue Egyptian glass goblets
- 15.Indian brass filigree box
- 16.Painted Indian oil bottle
- 17.Large African water pot
- 18.Philippino twig basket
- 19.Philippino bamboo covered urn



20. African cooking pot
21. Decoy bird
22. Painted candlestick
23. Thai wooden swan
- 24.Carved wooden duck
25. Embroidered mirror cushion covers
26. Green hexagonal Indian box
27. Painted Indian oil bottle
28. Joint wooden snake
29. Black embroidered cushion
- 30.Moroccan ceramic jar
- 31.Painted wooden candlestick
- 32.Thai pot with lid
- 33.Octagonal Indian box
- 34.Shallow twig baskets
- 35.Mexican paper mache fake fruit and veggies
- 36.Nakshe Kantha Bengali wall-hanging
- 37.Wooden shell bowl
38. Wooden servers



# Computer Vision

- Goal: Extract all possible information about a visual scene by computer processing

*What? When? Where? Who? How? Why? How many?*

- Over 50% of the brain is devoted to vision for humans.
  - Must be important to us!
- Why is it difficult?



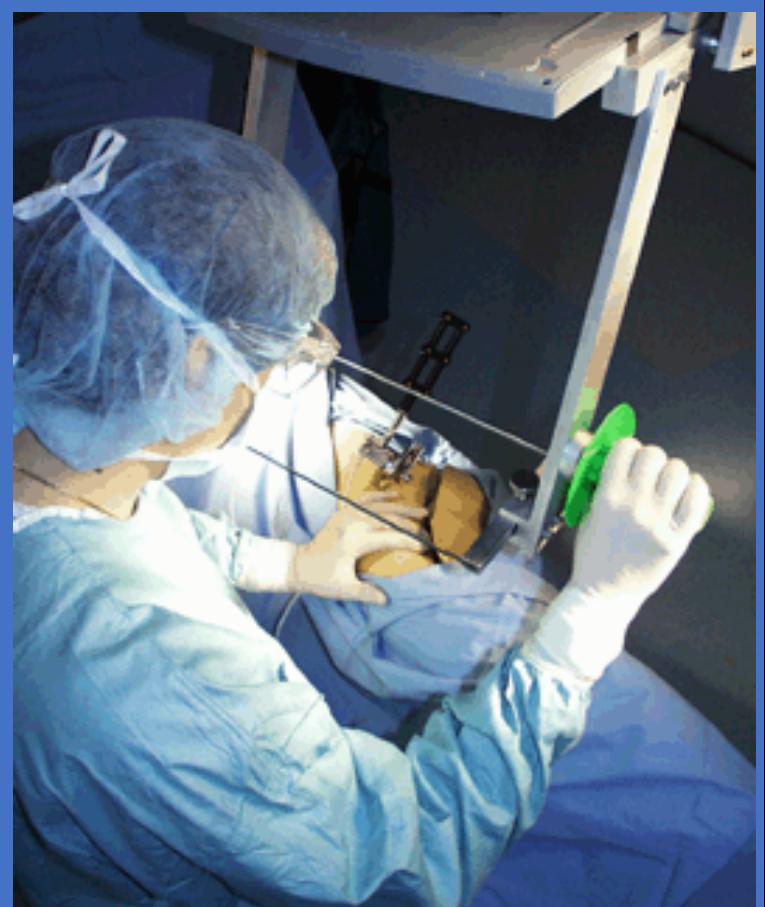
# Chairs and Chairs

- Which are chairs?
- Large intra-class variations
- How do we describe a chair?
- Basic property: Sittability!
- We infer a lot from pictures.  
Can we instruct a computer  
to do the same?
- Do we understand how we  
infer?

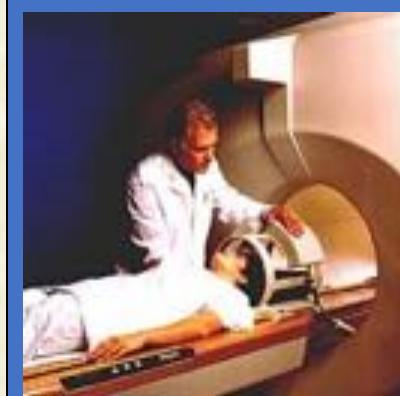




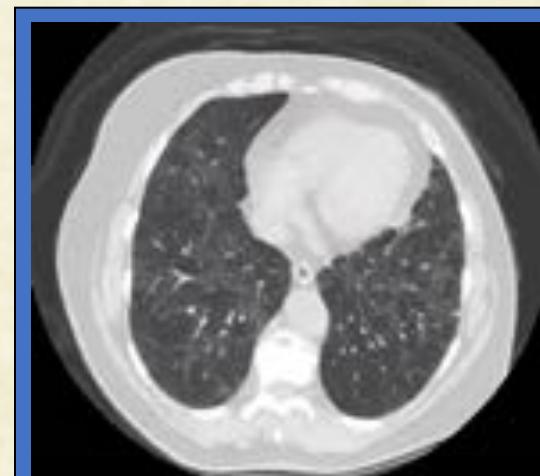
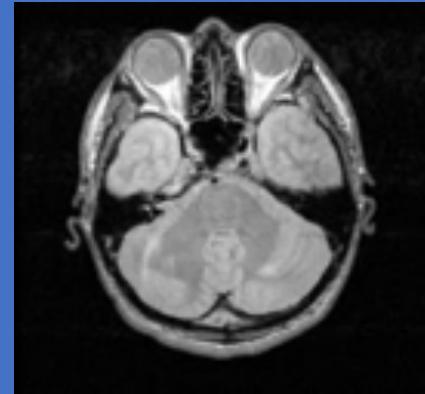
# Applications: Medical



Computer Assisted Surgery



CT Scan



Segmentation



# Applications: Space Imaging



Ikonos



Rio Negro (black) meets Amazon (blue)



# Applications: Automated Inspection



Manual PCB Inspection



Automated PCB Inspection



# Applications: Biometrics



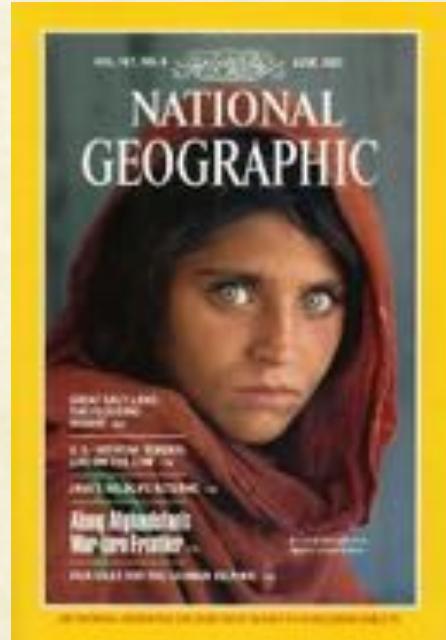
Travel



Disney Land



Computer Access

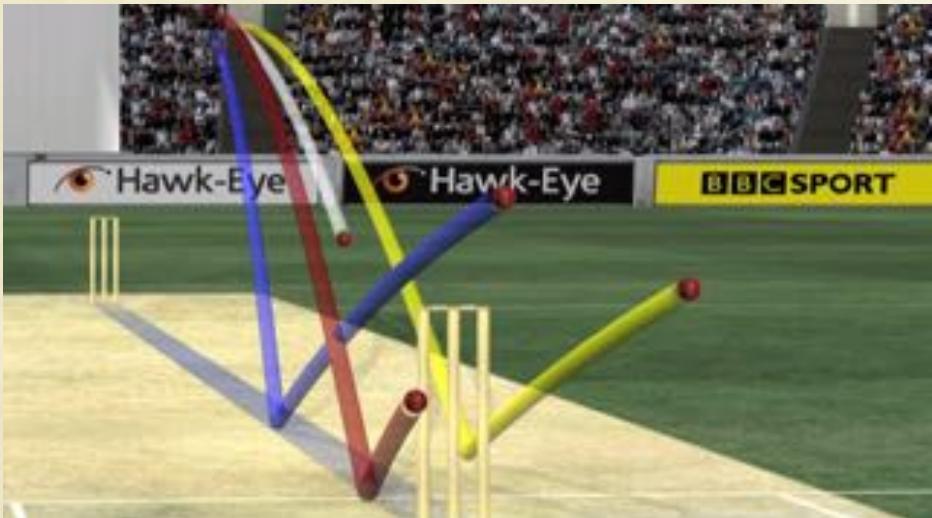




# Applications: Broadcasting



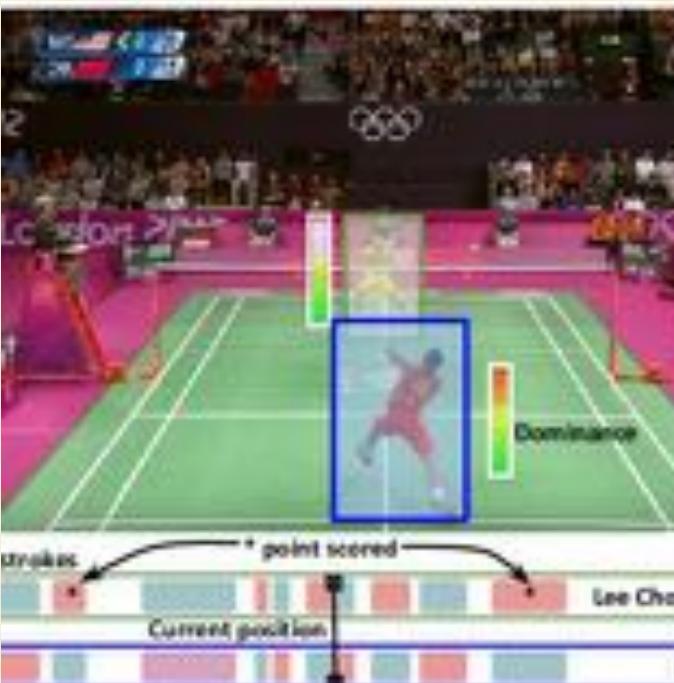
Field Understanding: Virtual Line



Ball Tracking: Hawk Eye



Chroma Keying: Replacing Backgrounds

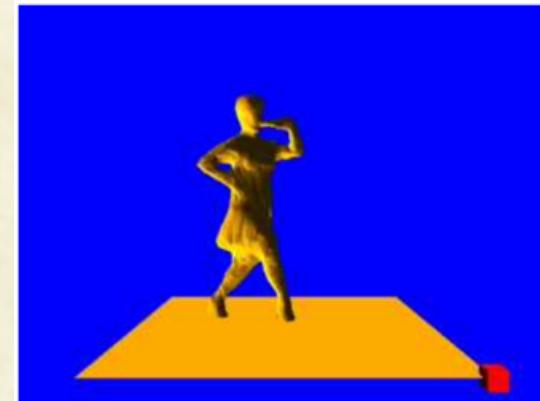


Player Tracking: CVIT, IIITH



# 3D Shape and Motion Recovery

- Structure light scanner, laser range finder
- Multi-camera stereo, structure recovery
- Reverse Engineering
- Virtualized/Augmented reality





## Applications: Others

- Surveillance
- Automated Assembly
- Mail Sorting
- Face detection (photography)
- Robot Navigation
- Content-Based Image Retrieval
- Entertainment
- And many more... with your help...





# Why Automated Vision?

1. High reliability
2. High repeatability
3. More objective evaluation
4. Lower cost
5. Higher speed
6. Ability to operate in hazardous environments

General purpose machine vision system do not exist.



# Recent: Structure from Motion



- Approximate 3D structure from an unstructured collection of images!  
[PhotoTourism, SIGGRAPH2006]
- PhotoSynth
- Autodesk 123D: Your pictures to model
- And many more to follow soon



# Recent: Natural Gaming



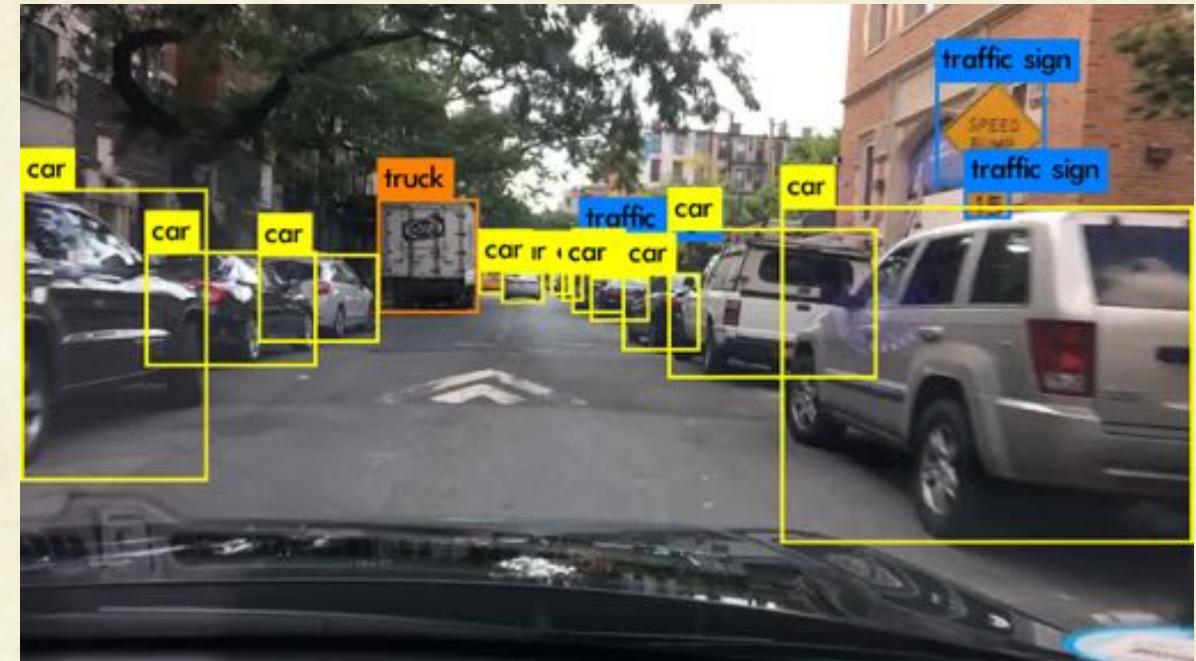
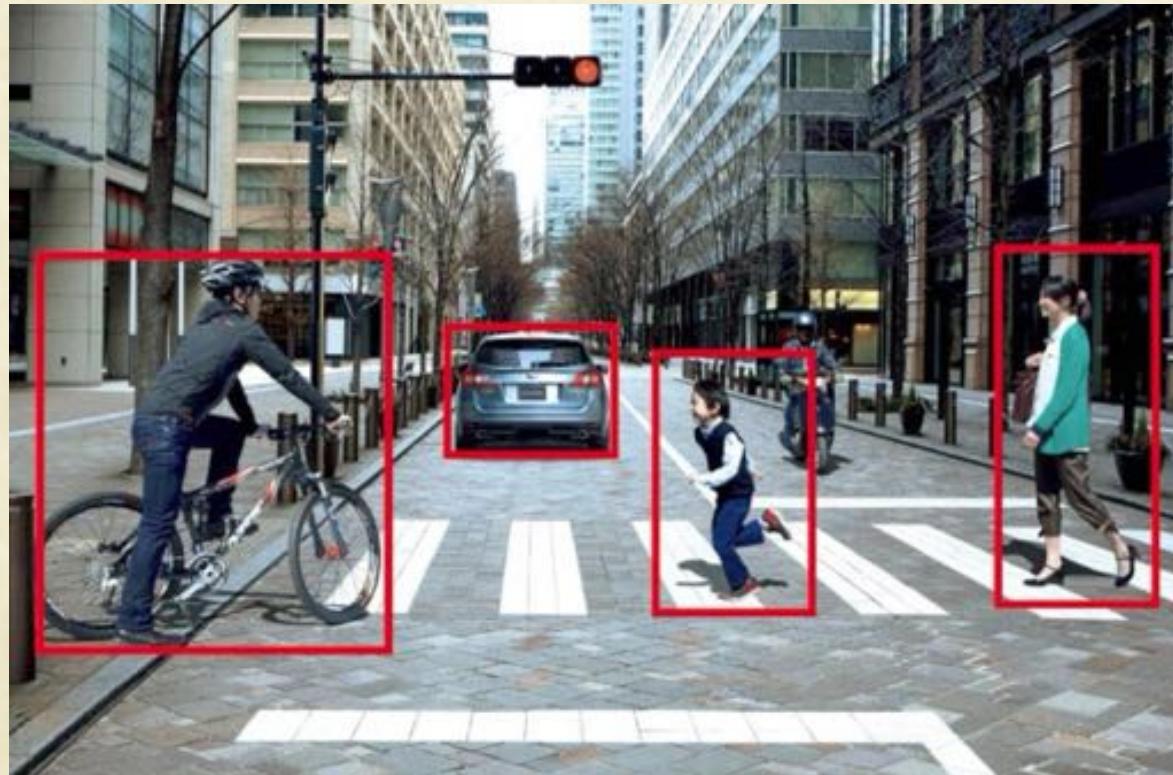
Microsoft Kinect



- You are the controller. Interact naturally with the game.
  - Fastest Selling Electronic Device Ever: 80 lakh units in 60 days!!
- Finding great use in Computer Vision, Robotics, etc.



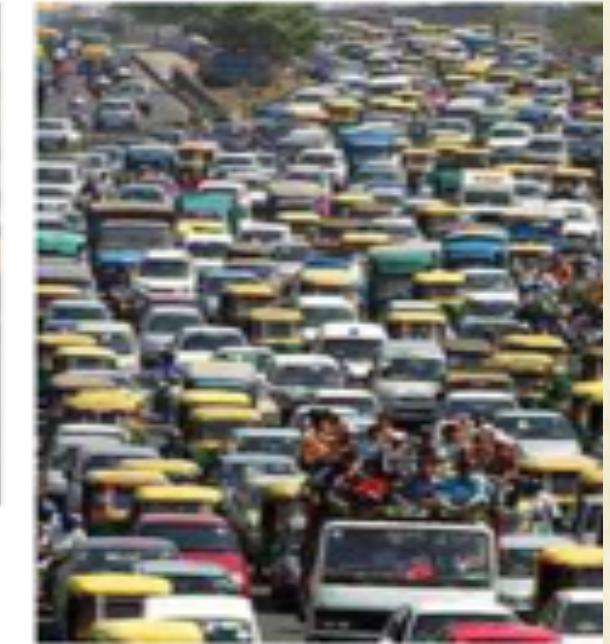
# Recent: Automotive Safety



Can help avoid accidents greatly!



# The Real Problem

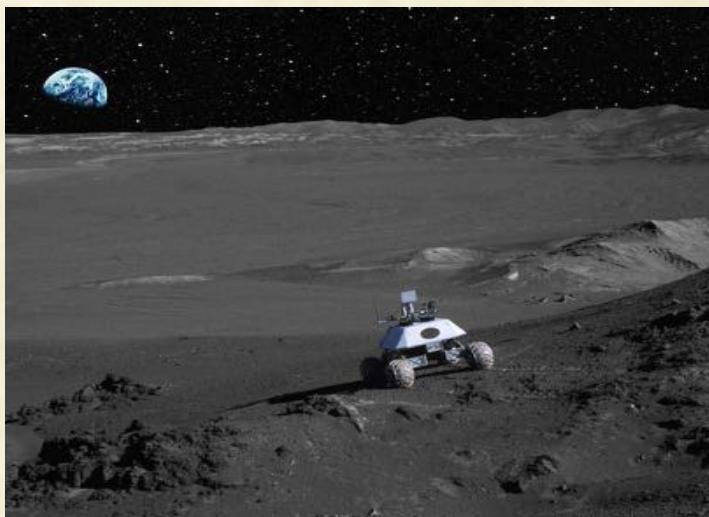


Develop something similar for Indian roads!



# What More is Possible?

- Much much more .....
- The journey has just begun for computer vision.
- Large amount of data, high computing power, machine learning algorithms continue to transform computer vision.
- Big things are yet to come.

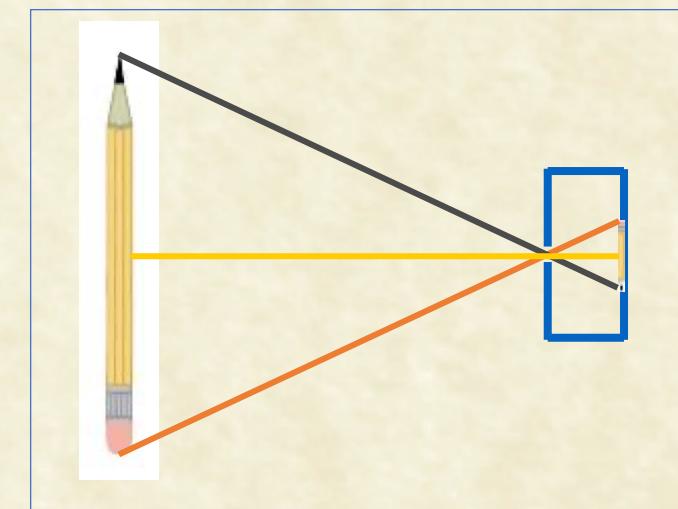




Questions?

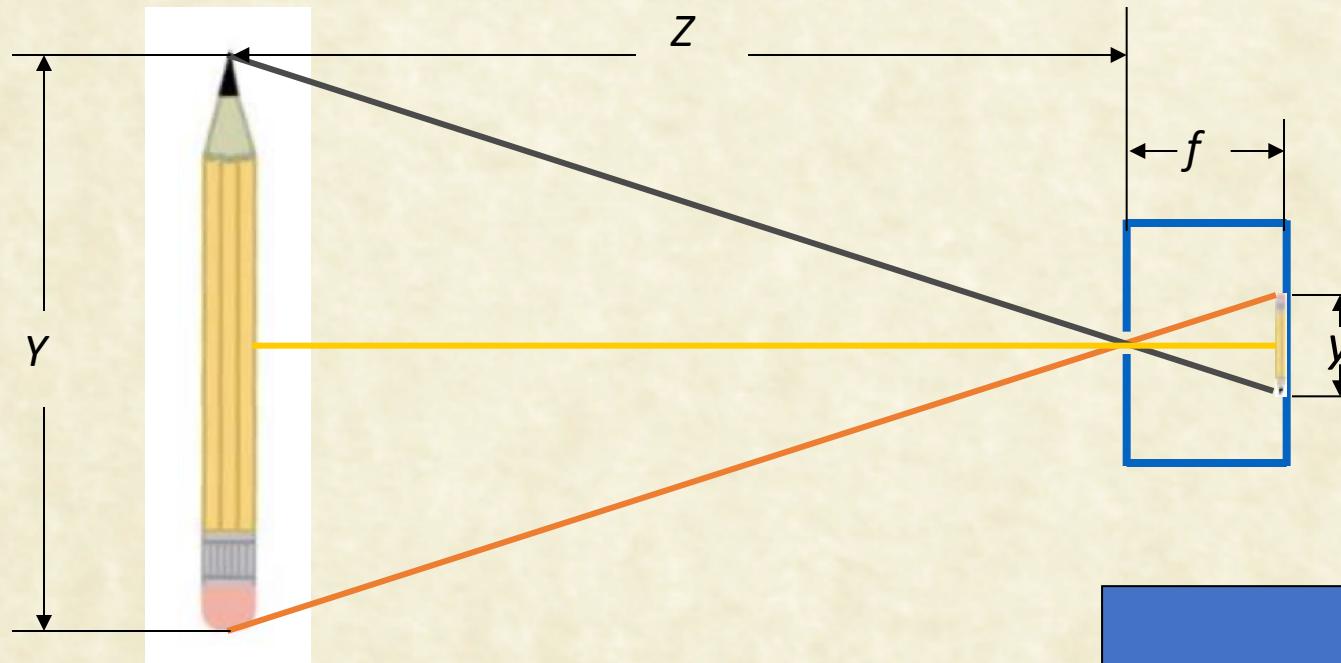


# M1 Geometry: Imaging and Camera Model





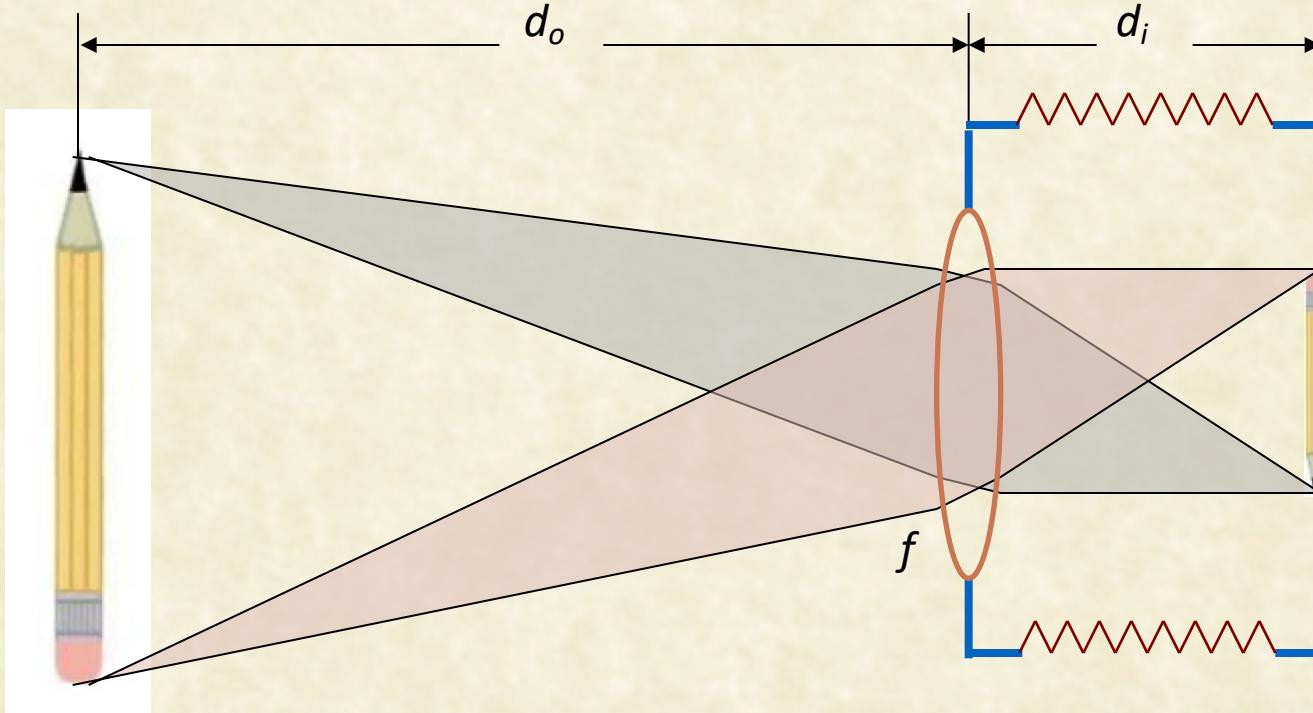
# The Pinhole Camera



$$y = f \frac{Y}{Z}$$



# Camera with Lens



Thin lens equation:  $\frac{1}{f} = \frac{1}{d_o} + \frac{1}{d_i}$

$$d_i = f \frac{d_o}{(d_o - f)}$$

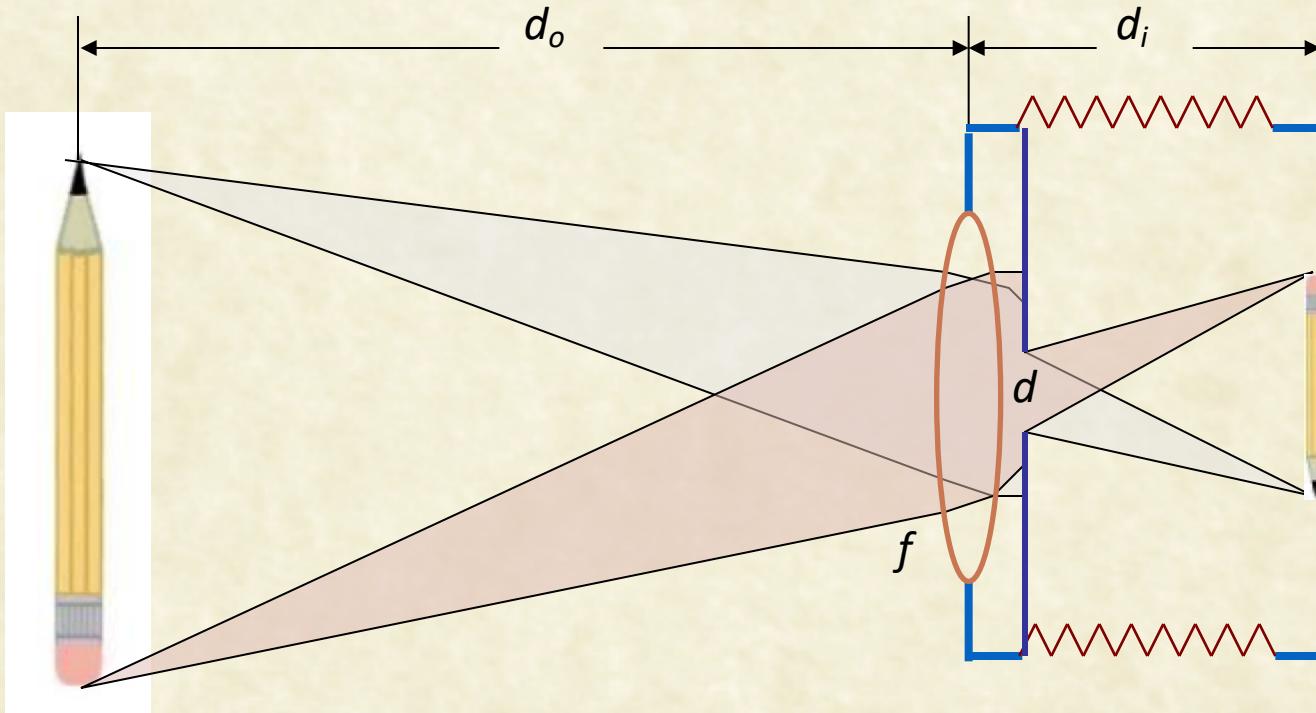


# Focus and DOF





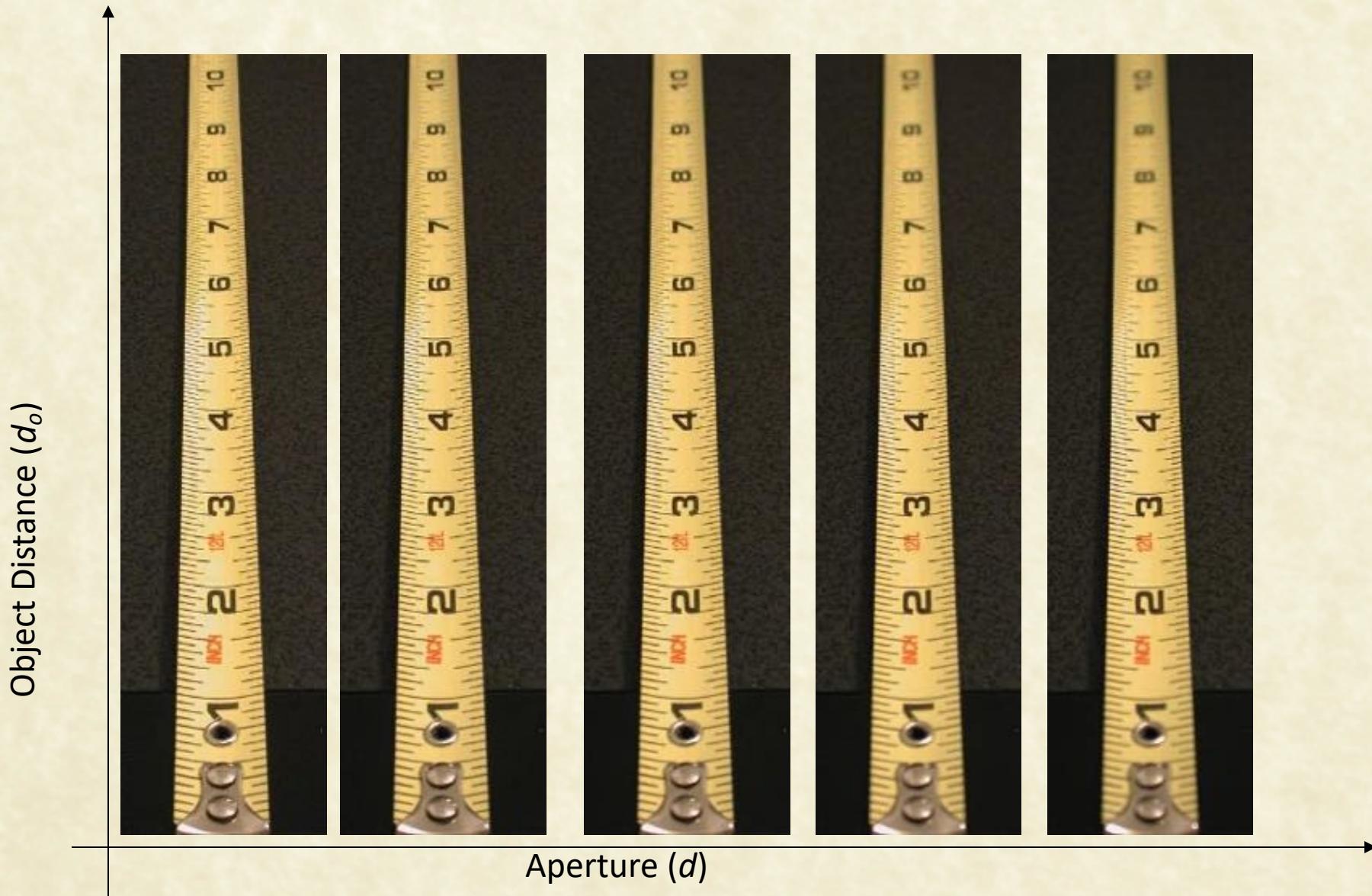
# Aperture



$$\text{Focal Ratio} = f / d$$

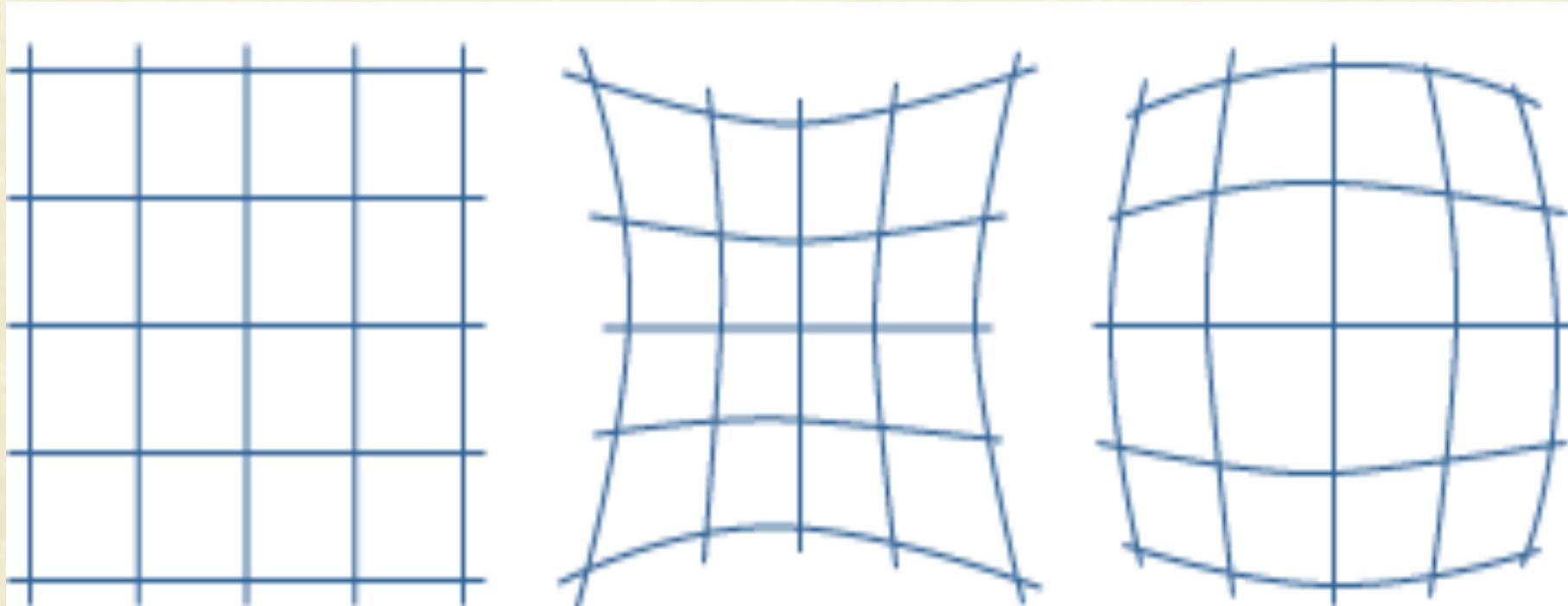


# Aperture vs. DOF





# Geometric Distortions



original

pincushion

barrel



# Geometric Distortions





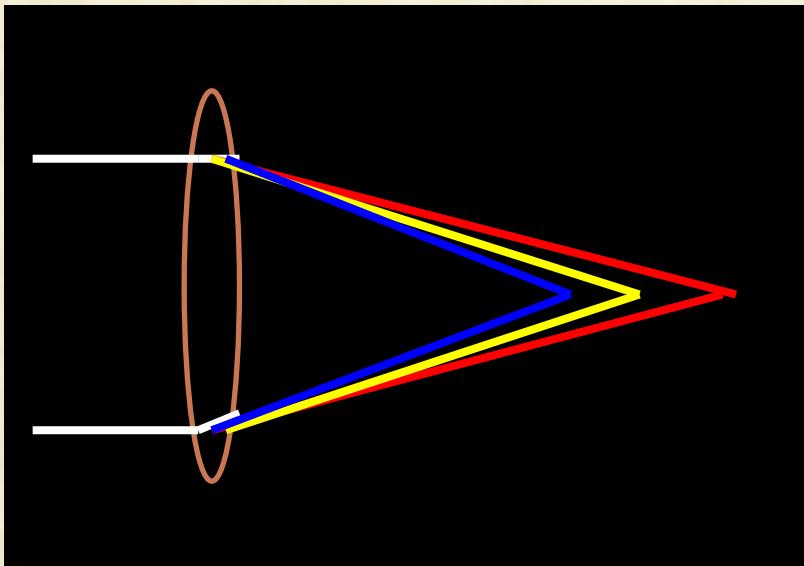
# Lens Flare





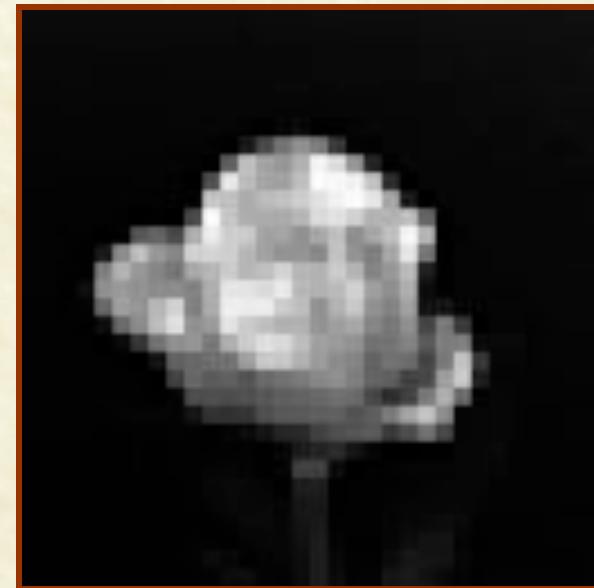
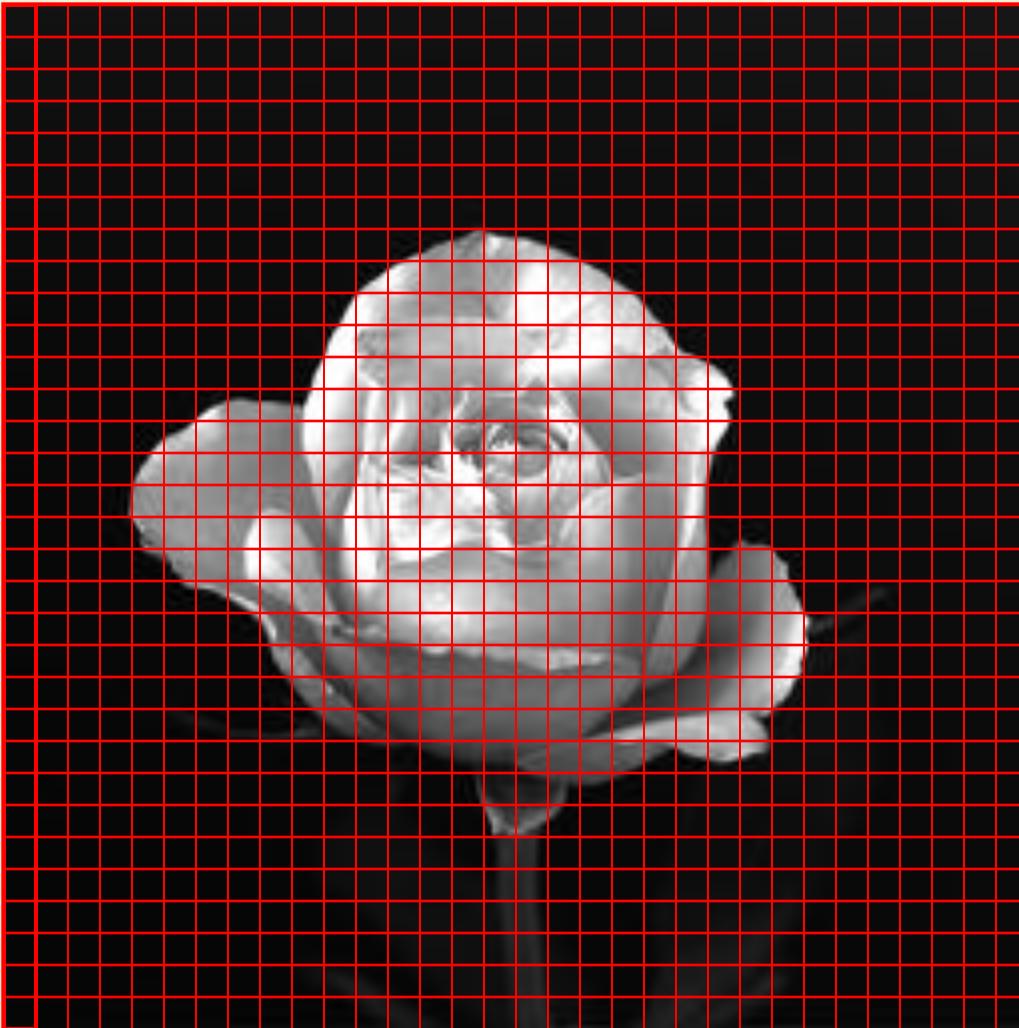
# Chromatic Aberration

Normal lenses diffract different wavelengths to different degree





# Sampling an Image: Resolution





# Resolution

- The number of samples in an image (number of sensor elements) is referred to as its resolution
- The resolution is typically represented as the product of number of samples in the horizontal and vertical directions in the image. e.g.: 32x32, 256x256, 640x480

## Common Resolutions:

|                    |                  |
|--------------------|------------------|
| NTSC:              | 648 x 486        |
| Typical Webcam:    | 1280 x 720       |
| High-end SLR:      | 11,648 × 8,736 * |
| Hubbles Telescope: | 1,600 x 1,600    |



# Camera Model: Objectives

- Mathematically model what a camera does
  - Also understand what the model means
- Getting the model for a real-world camera
  - Estimation from real world measurements
- Special imaging configurations with simpler properties
  - Simpler relationships
- General theory on fitting linear models under noisy observations
  - Techniques that work across problems



# What does a Camera do?

- Form an image on the 2D image plane of the 3D world visible to it.
- Image is *behind* the lens; the scene is in front.
- 3D world is **projected** down to a 2D plane.
- Significant loss of information as one dimension is dropped.
- Mathematical depiction of this projection ...





Questions?