

## IMAGE FORMATION

From 3-D physical world to 2-D image:

- Analog vs digital images
- Camera geometry
- Radiometry and sensing

## ANALOG IMAGES

An image on film can be understood a two-dimensional light intensity function  $f(x,y)$  where:

- $x$  and  $y$  are spatial coordinates
  - The value of  $f$  at any point  $(x, y)$  is proportional to the brightness or gray value of the image at that point.
- Cannot be stored as such on a digital computer.

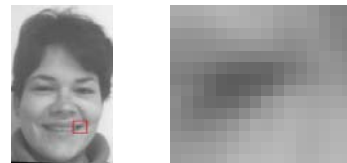
## DIGITAL IMAGES

A digitized image is one in which:

- Spatial and grayscale values have been made discrete.
- Intensities measured across a regularly spaced grid in  $x$  and  $y$  directions are sampled to
  - 8 bits (256 values) per point for black and white,
  - 3x8 bits per point for color images.

They are stored as a two dimensional arrays of gray-level values. The array elements are called pixels and identified by their  $x, y$  coordinates.

## PIXELS



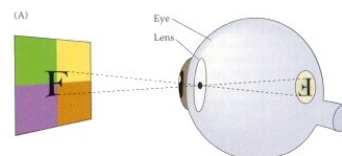
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236 234 361 220 362 368 271 273 273 271 266 228 227 225
232 245 236 230 251 249 253 254 254 261 263 263 229 231
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246 245 241 245 245 245 241 241 236 236 236 236 236 233
233 233 228 228 228 236 240 240 240 236 236 236 236 233
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266 266 270 268 268 268 270 270 270 270 270 270 270 270 270
268 270 270 270 270 270 270 270 270 270 270 270 270 270 270
263 270 270 270 270 270 270 270 270 270 270 270 270 270 270
261 262 260 270 260 260 260 260 260 270 270 270 270 270
    
```

## IMAGE FORMATION

1. Light from world surfaces into the lens of the camera.
  2. Photons hit CCD array that produce electric charges.
  3. Charges read as voltages.
  4. Voltages sampled by a digitizer (or frame grabber)
- Array of pixel values

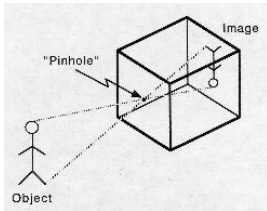
## CAMERAS



Projection from surfaces to 2-D sensor.

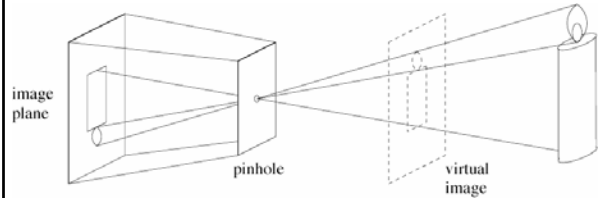
- Where: Geometry
- How bright: Radiometry
- Stored how: Sensing

## PINHOLE CAMERA MODEL



- Idealized model that defines perspective projection:
- All rays go through a hole and form a star of lines
  - The hole acts as a selector of rays that allows the formation of an inverted image.

## VIRTUAL IMAGE



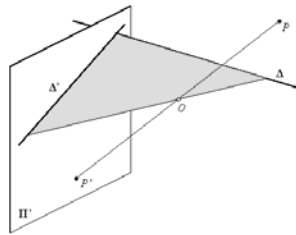
## GEOMETRIC PROPERTIES

In General

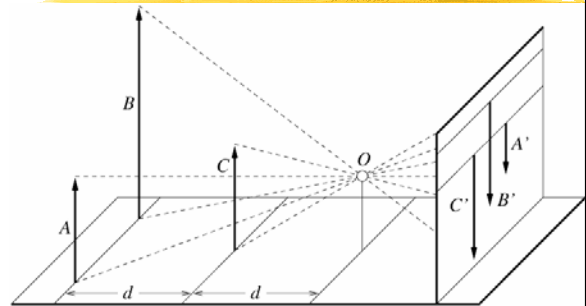
- Points go to points
- Lines go to lines
- Planes go to whole image
- Polygons go to polygons

Degenerate cases

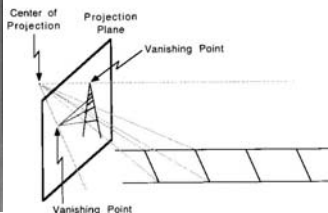
- Lines through focal point go to point
- Planes through focal point go to line



## DISTANT OBJECTS APPEAR SMALLER

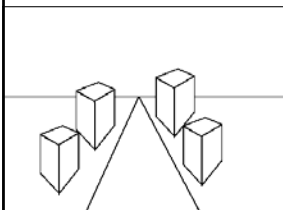


## PARALLEL LINES MEET



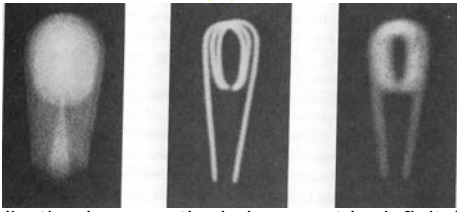
Parallel lines in 3-D project to a pencil of 2-D lines that meet at one point.

## VANISHING POINTS



- Each set of parallel lines meets at a different point
- Sets of parallel lines on the same plane lead to *collinear* vanishing points.
- Good ways to spot faked images
- Scale and perspective don't match
- Vanishing points behave badly

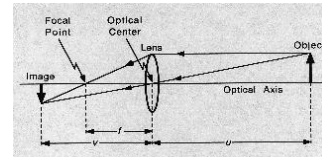
## LIMITATIONS



Idealization because the hole cannot be infinitely small

- Image would be infinitely dim
  - Diffraction effects
- Use of Lenses.

## THIN LENSES

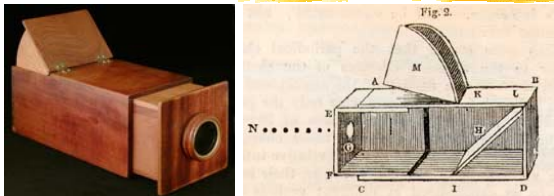


Thin lens Equation:

$$\frac{1}{u} + \frac{1}{v} = \frac{1}{f}$$

→ Lens with focal distance  $f$  equivalent to pinhole camera with similar focal distance but larger aperture.

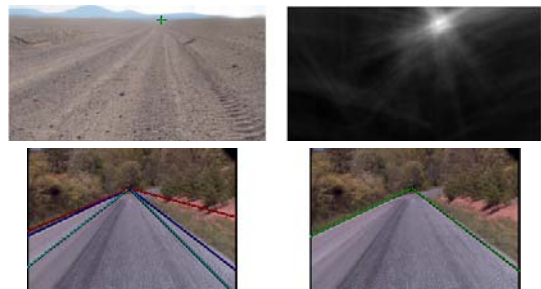
## CAMERA OBSCURA



- Used by painters since the Renaissance to produce perspective projections.
- Direct ancestors to the first film cameras.

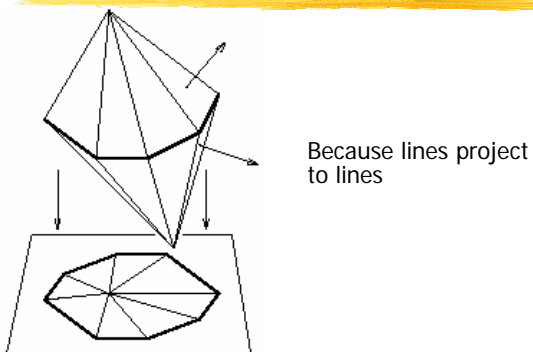
Art

## ROAD DETECTION

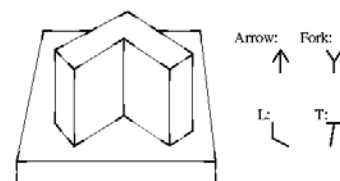


C. Rasmussen, Texture-Based Vanishing Point Voting for Road Shape Estimation, In *British Machine Vision Conference*, Kingston, UK, 2004.

## POLYHEDRA PROJECT TO POLYGONS



## JUNCTIONS ARE CONSTRAINED

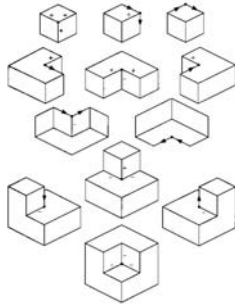


In theory such a drawing, can be interpreted as the projection of a 3—D object:

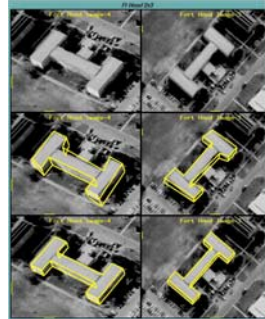
- In theory, one looks for consistent sets of labels.
- In practice, hard to get the lines and junctions to label from real images

## THE BLOCKS WORLD

- Computer Vision started in 1965 at MIT as a short term project.
  - Perfect data and strong assumptions.
- The real world is not like that!

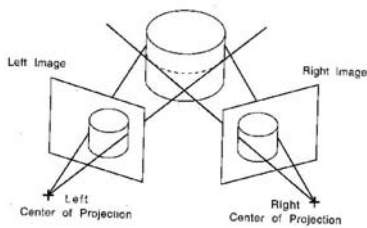


## DEFORMABLE MODELS



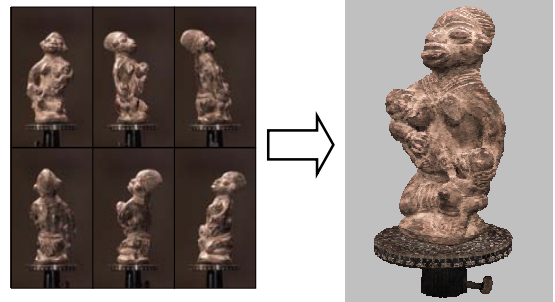
The deformable model encodes the endpoints of the segments.

## CURVED SURFACES PRODUCE OCCLUDING CONTOURS



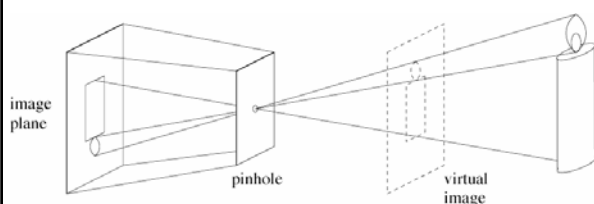
- Occluding contour is the set of points where the viewing direction is tangent to the surface
- This is a projection of a space curve, which varies from view to view of the surface

## MODELING FROM MANY PHOTOGRAPHS

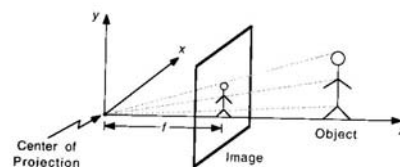


C. Hernandez, PhD ENST, 2004

## VIRTUAL IMAGE



## PERSPECTIVE PROJECTION

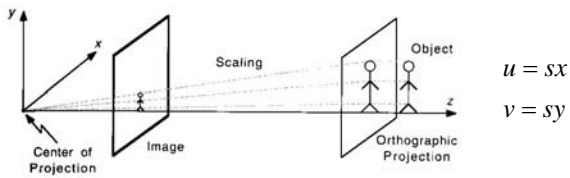


$$u = f \frac{x}{z}$$

$$v = f \frac{y}{z}$$

Pinhole geometry without image reversal

## ORTHOGRAPHIC PROJECTION



Special case of perspective projection:

- Large  $f$
  - Objects close to the optical axis
- Parallel lines mapped into parallel lines.

## PROJECTIVE DISTORTIONS



Orthographic and parallel to image plane.

Orthographic but not parallel to image plane.

Full perspective.

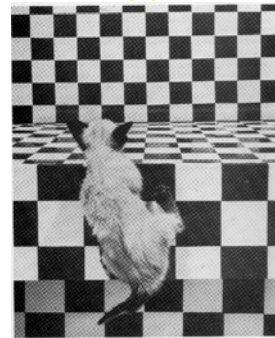
## PROJECTIVE DISTORTIONS



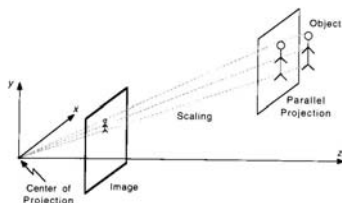
Perspective

Orthographic

## SHAPE FROM TEXTURE



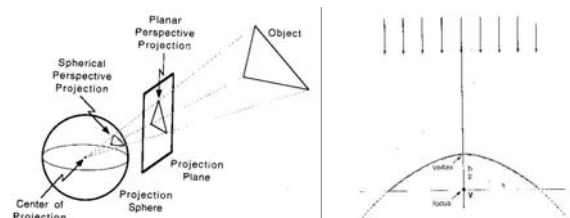
## PARAPERSPECTIVE PROJECTION



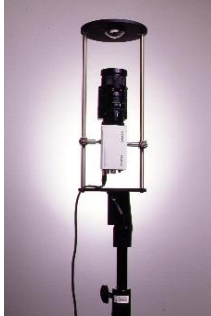
Generalization of the orthographic projection:

- Object dimensions small wrt distance to the center of projection.
- Parallel Projection followed by scaling

## SPHERICAL PROJECTION



## OMNI DIRECTIONAL CAMERA



## SPHERICAL TO PROJECTIVE

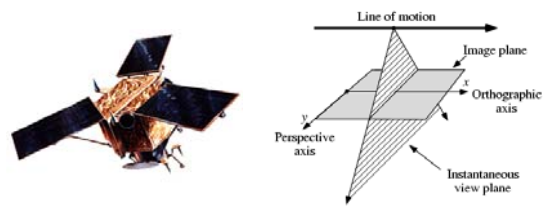


## MOBILE ROBOTS



Clodbuster, Grasp Lab, U. Penn.

## PUSHBROOM CAMERAS



$$u = sx$$

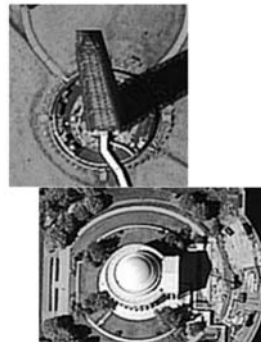
$$v = f \frac{y}{z}$$

-> Straight lines project to hyperbolas

## IKONOS 1999

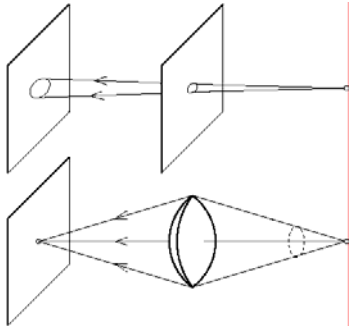


## WASHINGTON MONUMENTS SEEN FROM SPACE



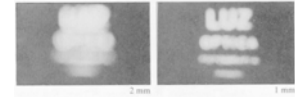
- Altitude 700 km
- Ground sampling distance < 1m

## IMAGING WITH A LENS

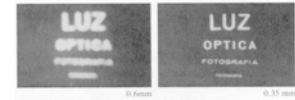


## FROM BLUR TO BLUR

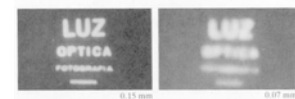
Pinhole too big:  
Many directions are averaged, blurring the image



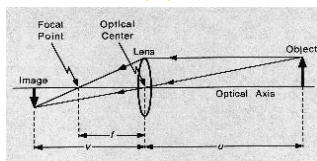
Pinhole too small:  
Diffraction effects blur the image



In general, pinhole-camera images are *dark* because only a very small set of rays from any particular point hits the screen.



## THIN LENSES

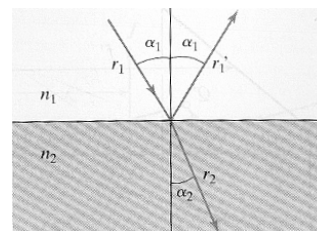


Thin lens Equation:

$$\frac{1}{u} + \frac{1}{v} = \frac{1}{f}$$

→ Lens with focal distance  $f$  equivalent to pinhole camera with similar focal distance but larger aperture.

## REFRACTION



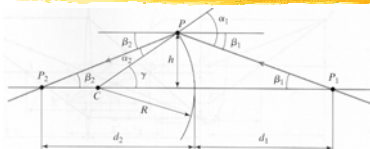
Snell's law :

$$n_1 \sin \alpha_1 = n_2 \sin \alpha_2$$

where  $n_1$  and  $n_2$  are the indices of refraction.

Forsyth & Ponce, Chap 1.2

## PARAXIAL OPTICS



$$\alpha_1 = \gamma + \beta_1 \approx h \left( \frac{1}{R} + \frac{1}{d_1} \right) \text{ and } \alpha_2 = \gamma + \beta_2 \approx h \left( \frac{1}{R} + \frac{1}{d_2} \right)$$

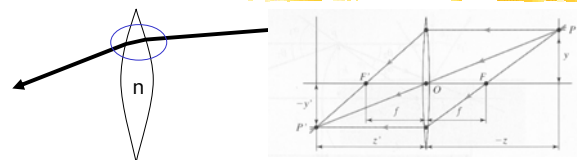
Therefore

$$n_1 \alpha_1 \approx n_2 \alpha_2 \Rightarrow \frac{n_1}{d_1} + \frac{n_2}{d_2} = \frac{n_2 - n_1}{R}$$

•  $d_1$  and  $d_2$  do not depend on  $\beta_1$  and  $\beta_2$ .

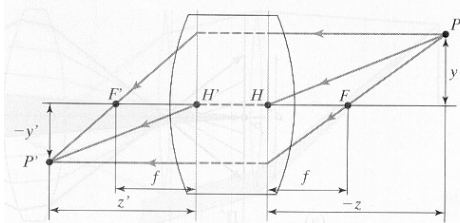
• still holds if some of the values of  $d_1$ ,  $d_2$ , and  $R$  change sign.

## THIN LENS PROPERTIES



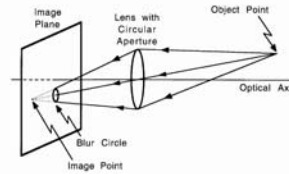
- Two spherical surfaces form a thin lens if a ray entering refracted at its right boundary if immediately refracted at its left boundary.
- Rays going through the optical center are not refracted.
- Its focal length is  $f = \frac{R}{2(n-1)}$

## THICK LENSES



Same as thin lenses except for an offset  
 → The only undeflected ray is along the optical axis

## DEPTH OF FIELD VS APERTURE



### Large Aperture:

- Large blur circles
- Shallow depth of field

### Small Aperture:

- Low intensity
- Long exposure time

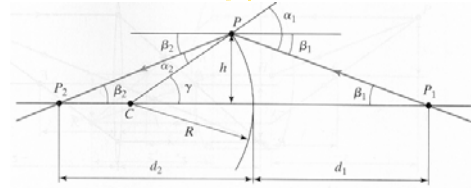
## DISTORTIONS



The lens is not exactly a "thin lens:"

- Different wave lengths refracted differently
- Barrel Distortion

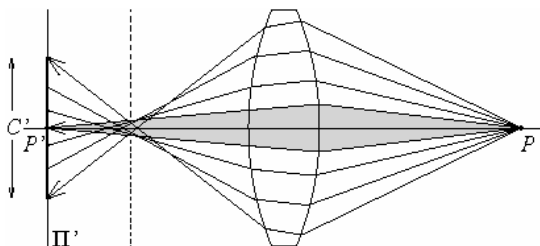
## PARAXIAL OPTICS REVISITED



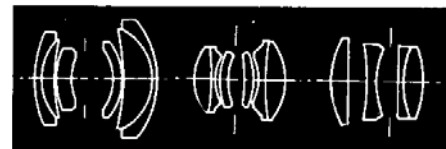
$$\frac{n_1}{d_1} + \frac{n_2}{d_2} = \frac{n_2 - n_1}{R} + h^2 \left[ \frac{n_1}{2d_1} \left( \frac{1}{R} + \frac{1}{d_1} \right)^2 + \frac{n_2}{2d_2} \left( \frac{1}{R} - \frac{1}{d_2} \right)^2 \right]$$

→ Distortion increases with distance away from the optical axis.

## SPHERICAL ABERRATION



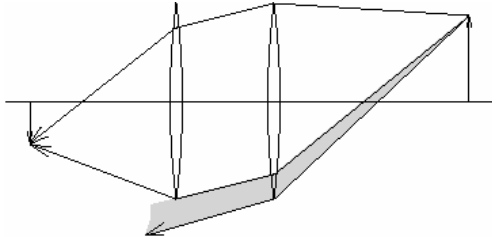
## LENS SYSTEMS



Aberrations can be minimized by aligning several lenses with well chosen

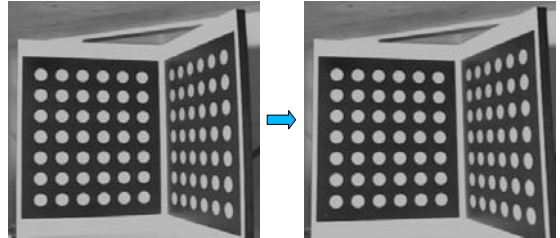
- Shapes,
- Refraction indices.

## VIGNETTING

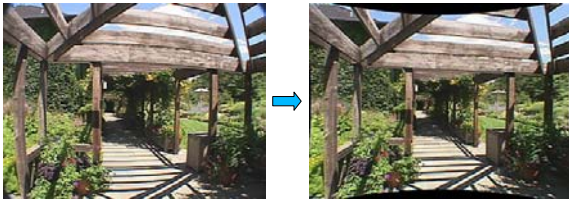


Images can get darker towards their edges because some of the light does not go through all the lenses.

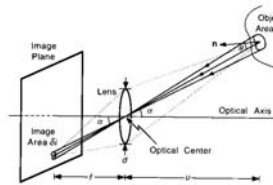
## UNDISTORTING



## UNDISTORTING



## RADIOMETRY



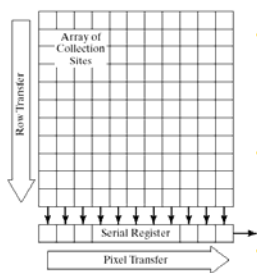
**Scene Radiance:** Amount of light radiation from a surface point (Watt / m<sup>2</sup> / Steradian)

**Image Irradiance:** Amount of light incident at the image of the surface point. (Watt / m<sup>2</sup>)

Fundamental Radiometric Equation:

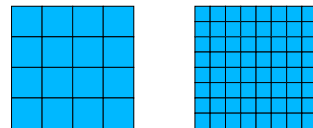
$$Irr = \frac{\pi}{4} \left( \frac{d}{f} \right)^2 \cos^4(\alpha) Rad$$

## CHARGE COUPLED DEVICE



- Photons free up electrons that are then captured by a potential well.
- Charges are transferred row by row wise to a register.
- Pixel values are read from the register.

## SENSING



Conversion of the "optical image" into an "electrical image":

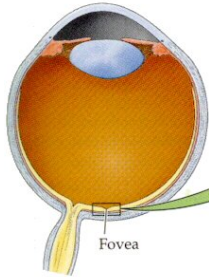
$$E(x, y) = \iint Irrad(x, y, t, \lambda) s(\lambda) \tau(t - t_0) d\lambda dt$$

$$I(m, n) = Quantize(\iint E(x, y) \omega(x - m, y - n) dx dy)$$

→ Quantization in

- Time
- Space

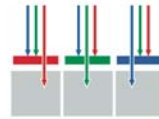
## HUMAN EYE



## MOSAIC CAPTURE



In conventional systems, color filters are applied to a single layer of pixels in a tiled mosaic pattern.

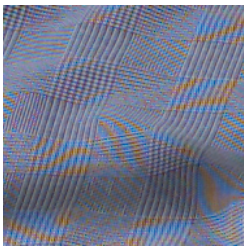


The filters let only one wavelength of light—red, green, or blue—pass through to any given pixel, allowing it to record only one color.

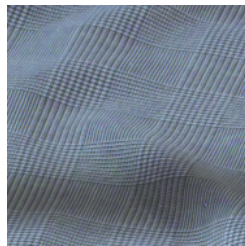


As a result, mosaic sensors capture only 25% of the red and blue light, and just 50% of the green.

## COLOR ARTIFACTS

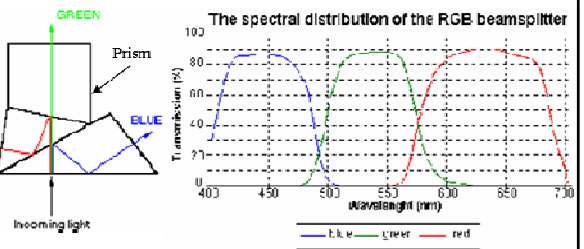
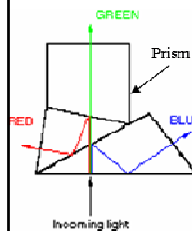


Color interpolation creates artifacts.



Artifacts go away when using three CCDs.

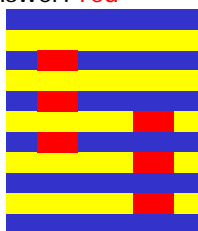
## BEAM SPLITTER



## COLOR

Question: what color is [255,0,0]?

Answer: red



How do you capture, encode, and transmit the appearance of this red?

Shevell, 2000

## COLORED SPIRALS

