

# Sensing and the Imaging Process (IV)

**Introduction to Computational and Biological Vision**

CS 202-1-5261

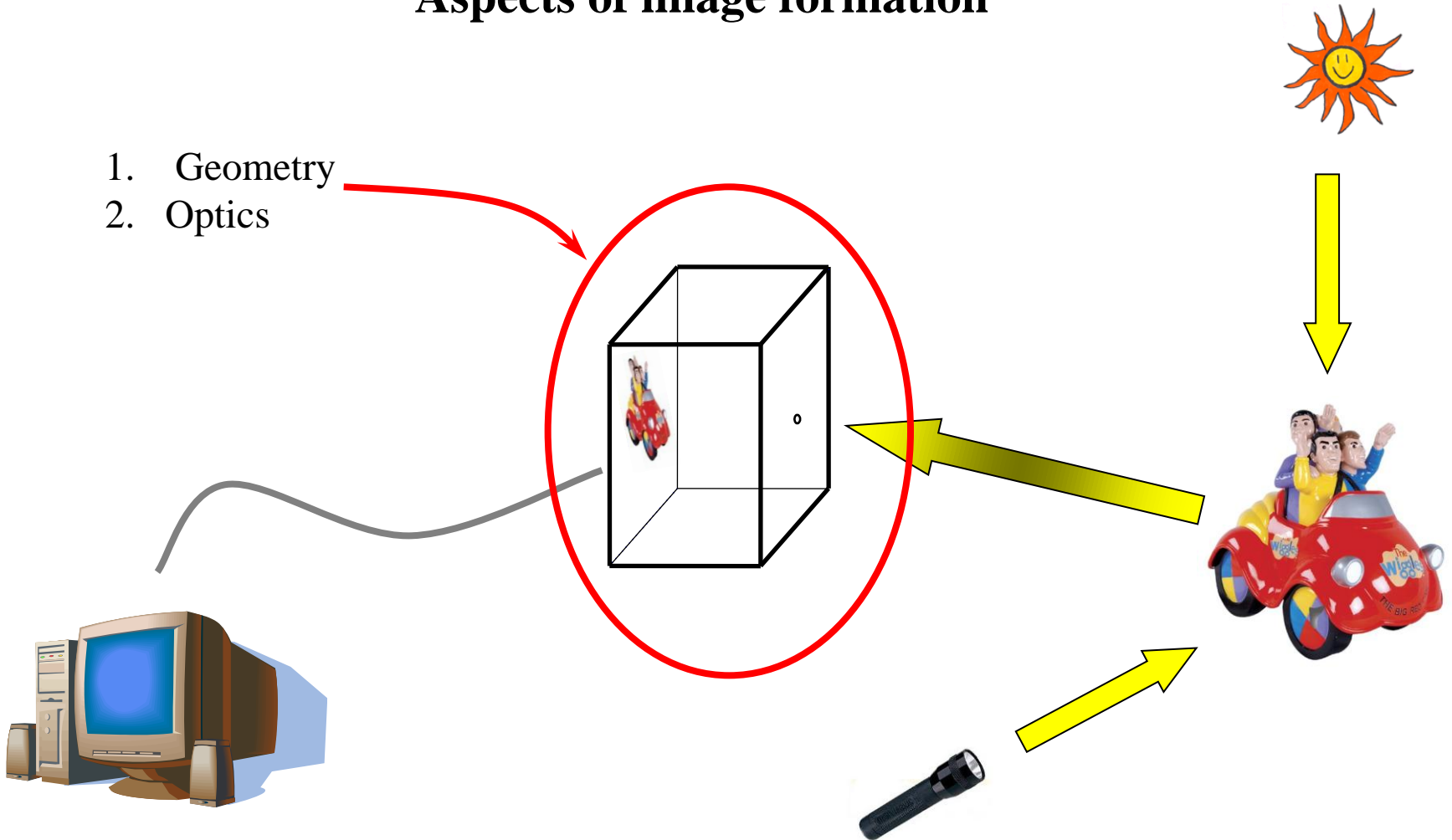
Computer Science Department, BGU

Ohad Ben-Shahar

# *Image formation and representation*

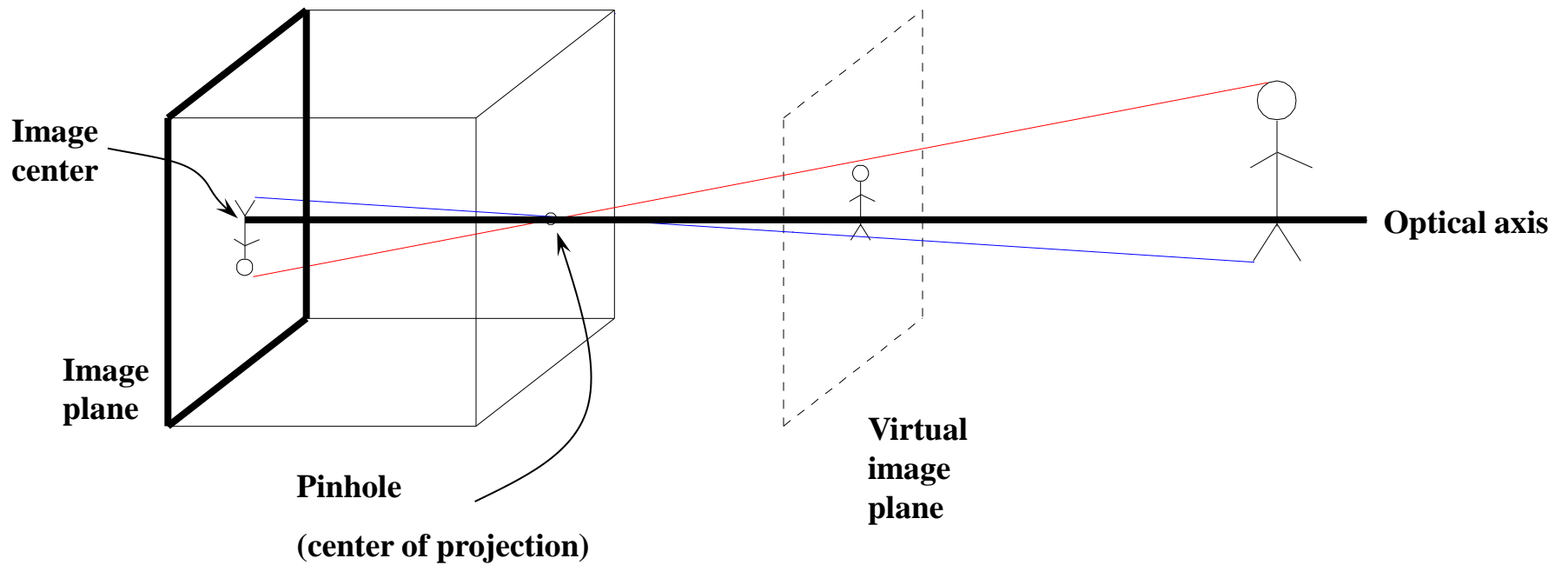
## Aspects of image formation

1. Geometry
2. Optics



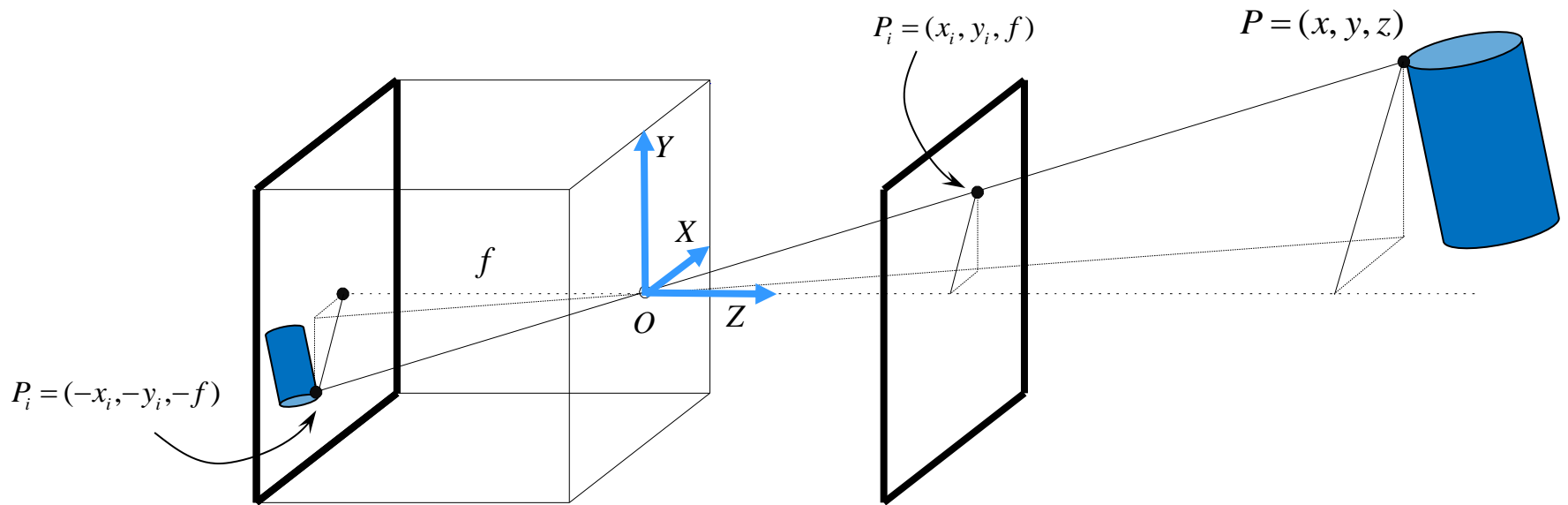
# *Image formation and representation*

## **Pinhole camera model**



# *Image formation and representation*

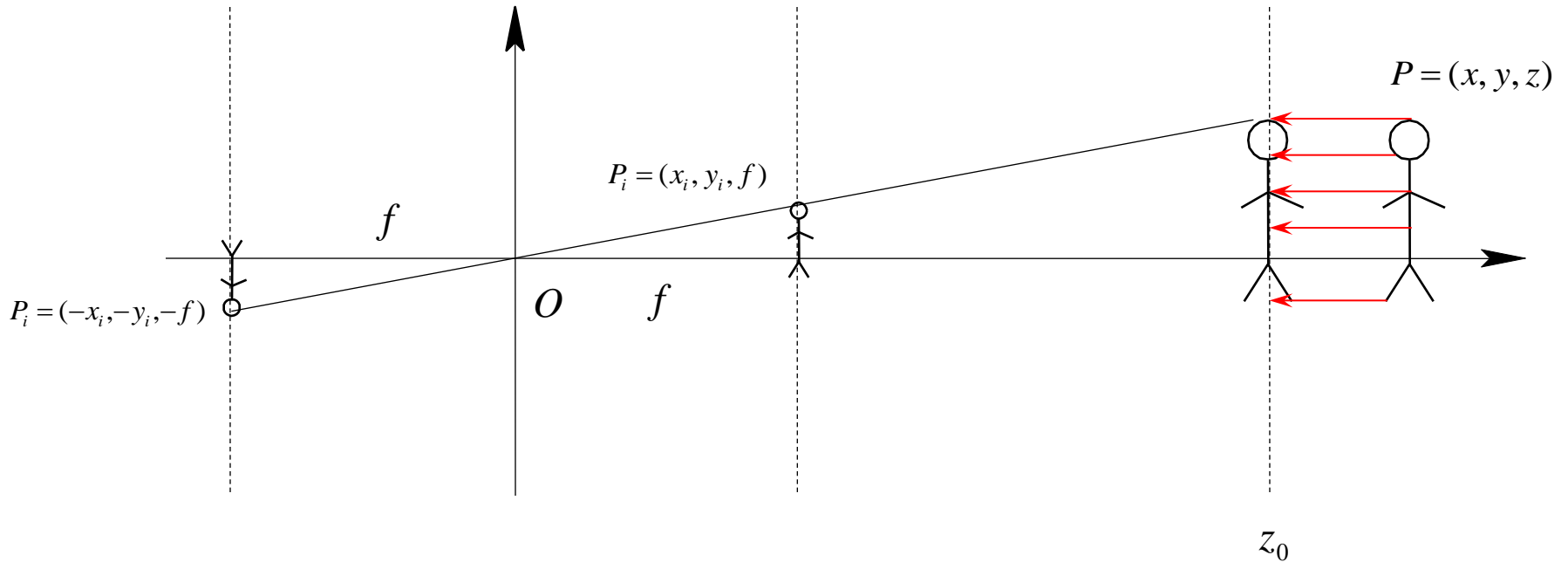
## **Pinhole camera model: Perspective projection**



$$\overrightarrow{OP_i} = \lambda \cdot \overrightarrow{OP} \quad \Rightarrow \quad \lambda = \frac{x_i}{x} = \frac{y_i}{y} = \frac{f}{z} \quad \Rightarrow \quad \begin{cases} x_i = f \cdot \frac{x}{z} \\ y_i = f \cdot \frac{y}{z} \end{cases}$$

# *Image formation and representation*

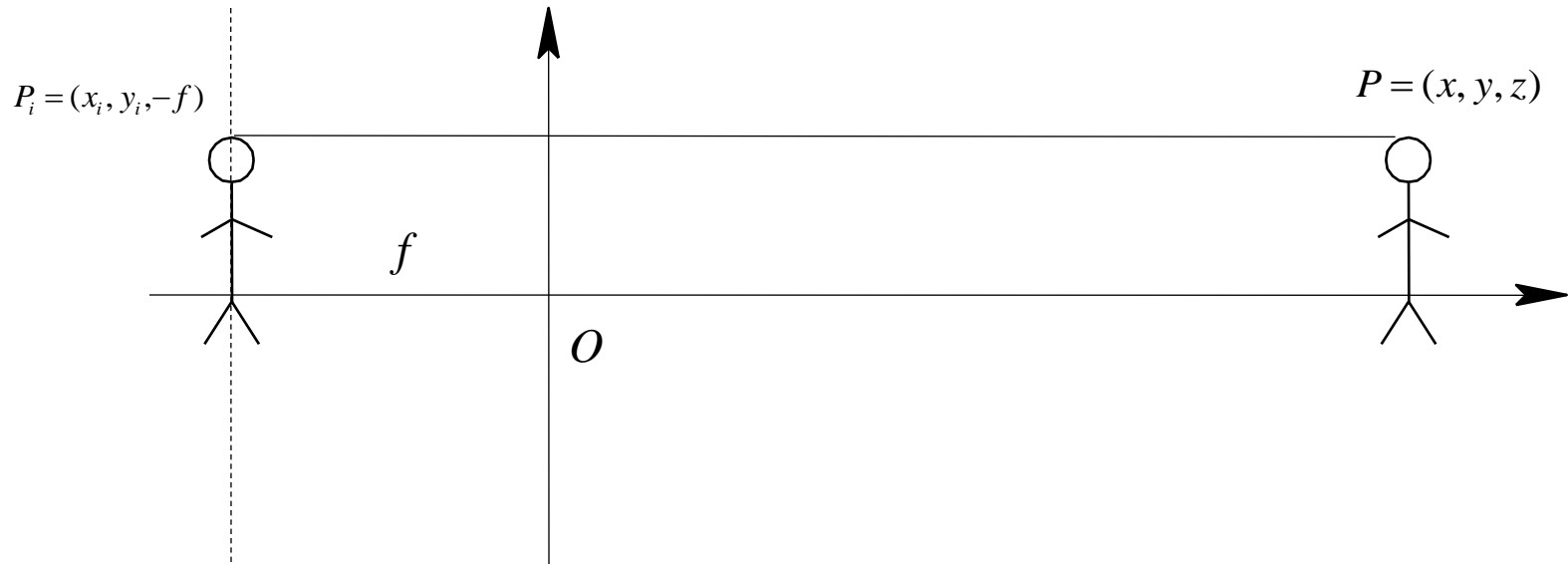
## **Linear approximation: Weak perspective projection**



$$\begin{cases} x_i = s \cdot x \\ y_i = s \cdot y \end{cases}$$

# *Image formation and representation*

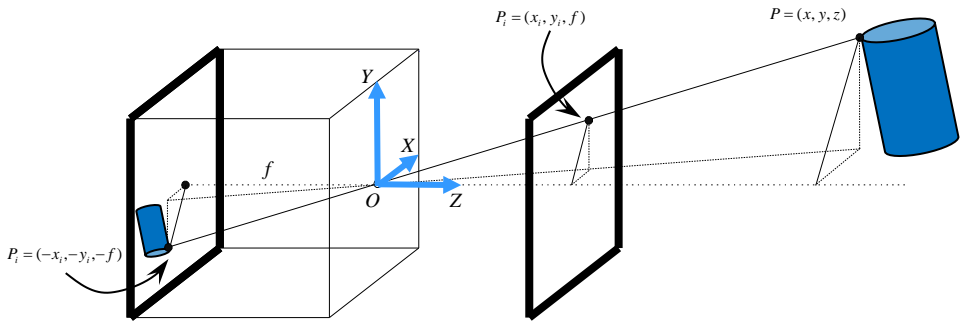
## **Linear approximation: Orthographic projection**



$$\begin{cases} x_i = x \\ y_i = y \end{cases}$$

# Image formation and representation

## Homogeneous coordinates



$$\begin{aligned} (x, y) &\Leftrightarrow [x \cdot w, y \cdot w, w] & w \neq 0 \\ (x, y, z) &\Leftrightarrow [x \cdot w, y \cdot w, z \cdot w, w] & w \neq 0 \end{aligned}$$

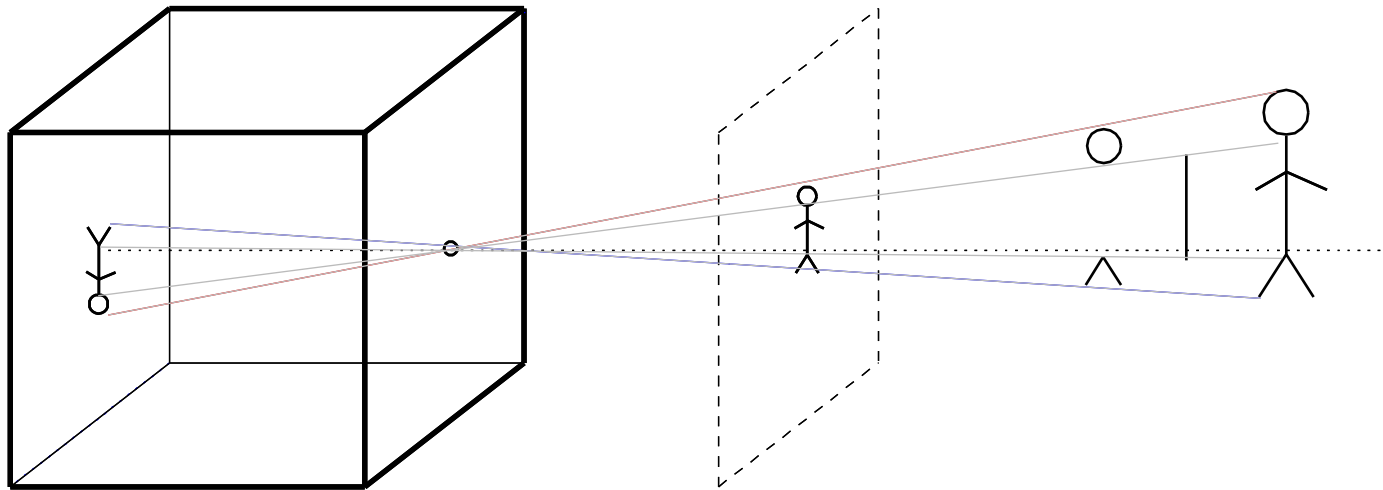
most often  $w$  is set as  $w = 1$

$$\left. \begin{aligned} x_i &= f \cdot \frac{x}{z} \\ y_i &= f \cdot \frac{y}{z} \end{aligned} \right\} \Leftrightarrow \begin{pmatrix} x_i \\ y_i \end{pmatrix} = \begin{bmatrix} x_i \\ y_i \\ 1 \end{bmatrix} = \frac{1}{z} \begin{bmatrix} f & 0 & 0 & 0 \\ 0 & f & 0 & 0 \\ 0 & 0 & 1 & 0 \end{bmatrix} \cdot \begin{bmatrix} x \\ y \\ z \\ 1 \end{bmatrix}$$

$$\left. \begin{aligned} x_i &= f \cdot \frac{x}{z} \\ y_i &= f \cdot \frac{y}{z} \end{aligned} \right\} \Leftrightarrow \begin{pmatrix} x_i \\ y_i \\ f \end{pmatrix} = \begin{bmatrix} x \\ y \\ z \\ z/f \end{bmatrix} = \begin{bmatrix} 1 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 \\ 0 & 0 & 1 & 0 \\ 0 & 0 & 1/f & 0 \end{bmatrix} \cdot \begin{bmatrix} x \\ y \\ z \\ 1 \end{bmatrix}$$

# *Image formation and representation*

**The main problem of vision – recovery of structure is ill defined**

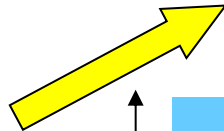
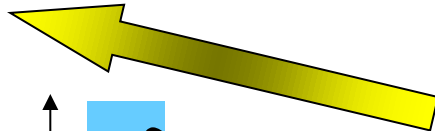
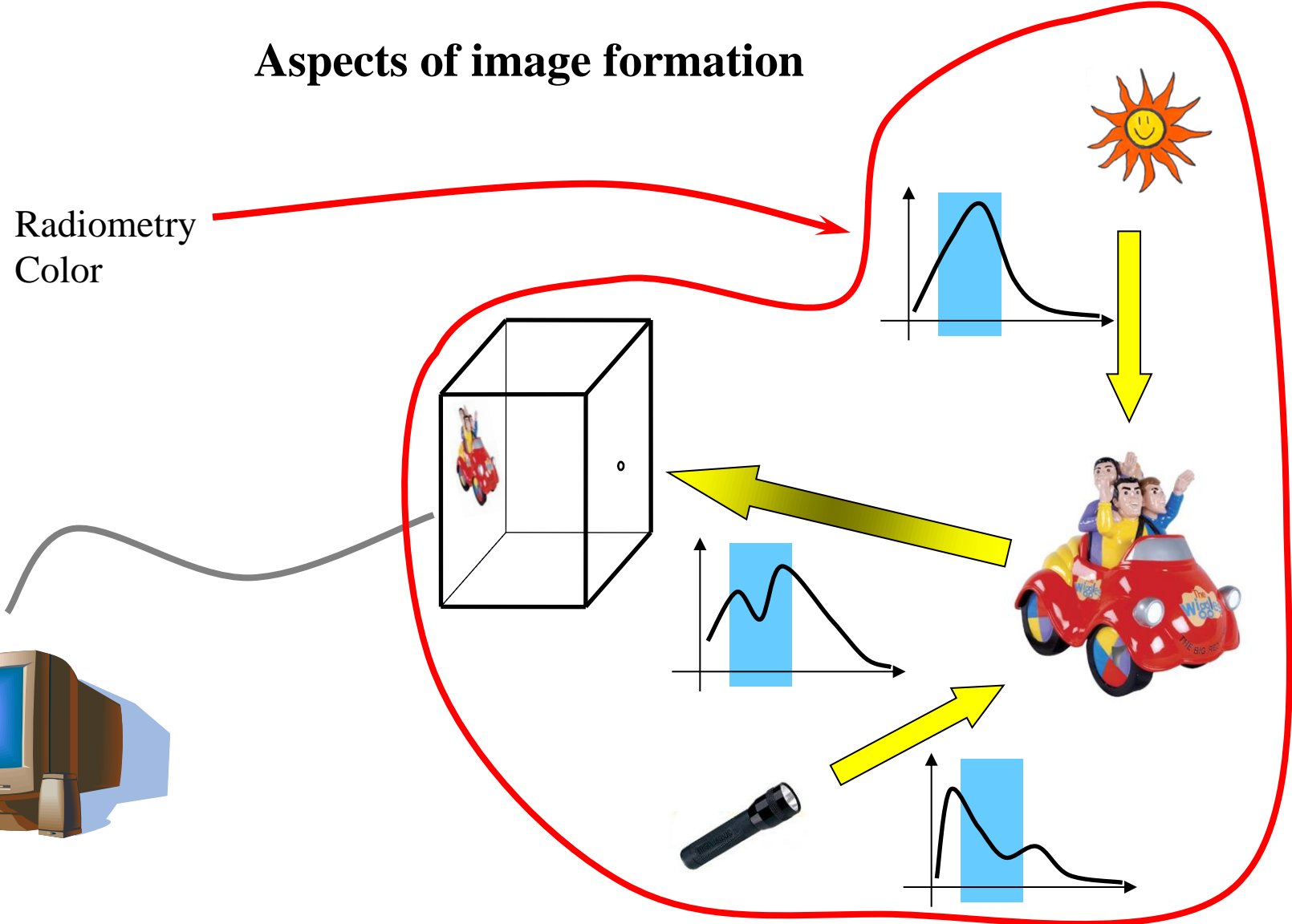
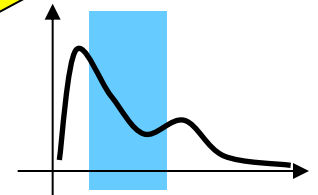
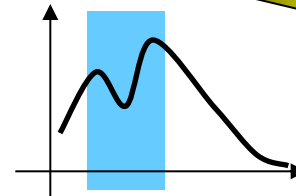
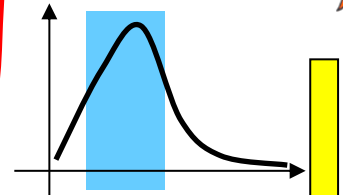
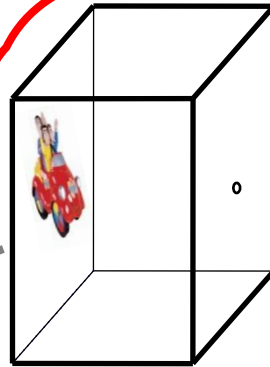
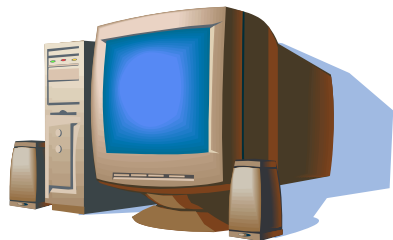




# *Image formation and representation*

## Aspects of image formation

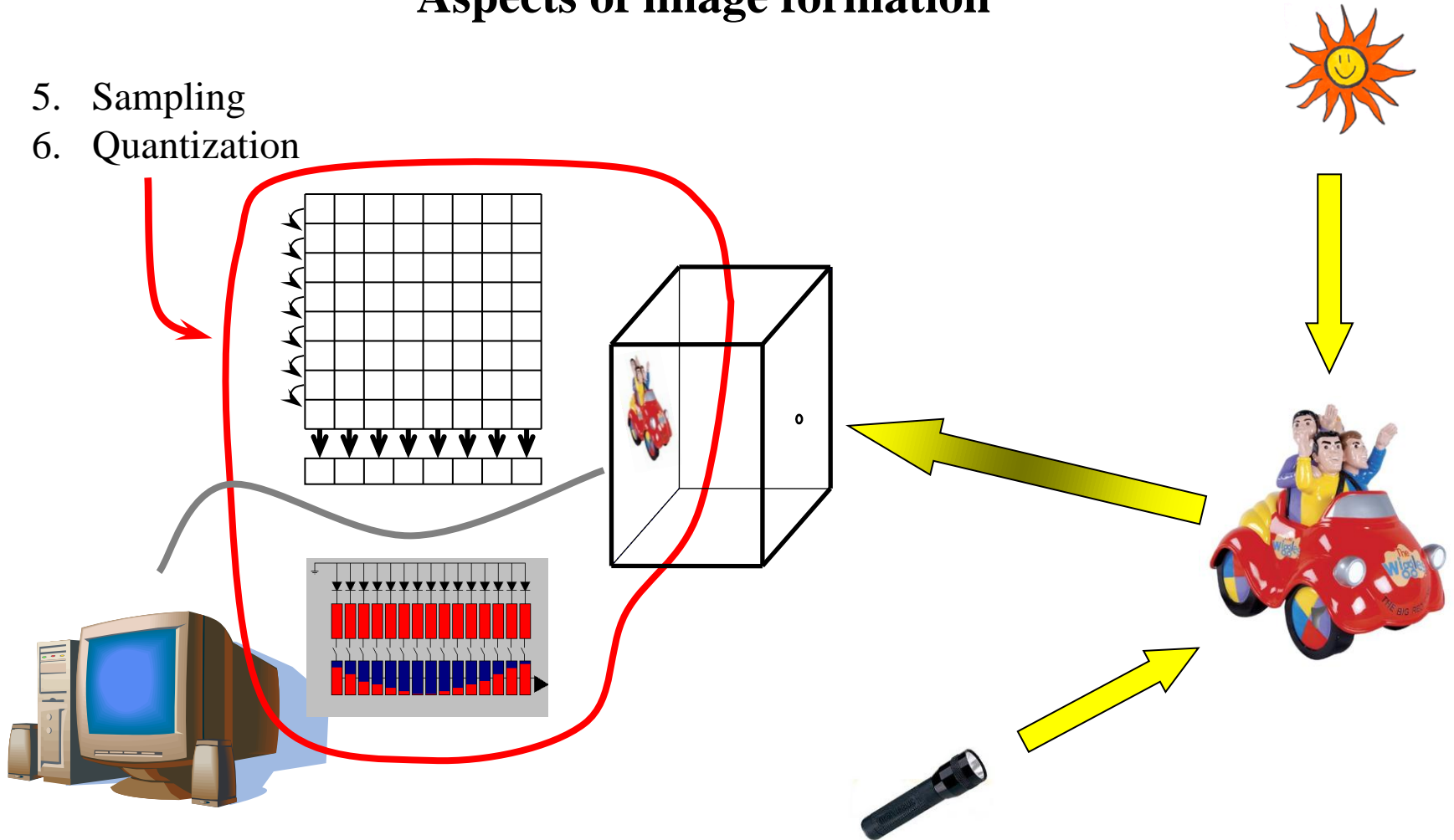
- 3. Radiometry
- 4. Color



# *Image formation and representation*

## Aspects of image formation

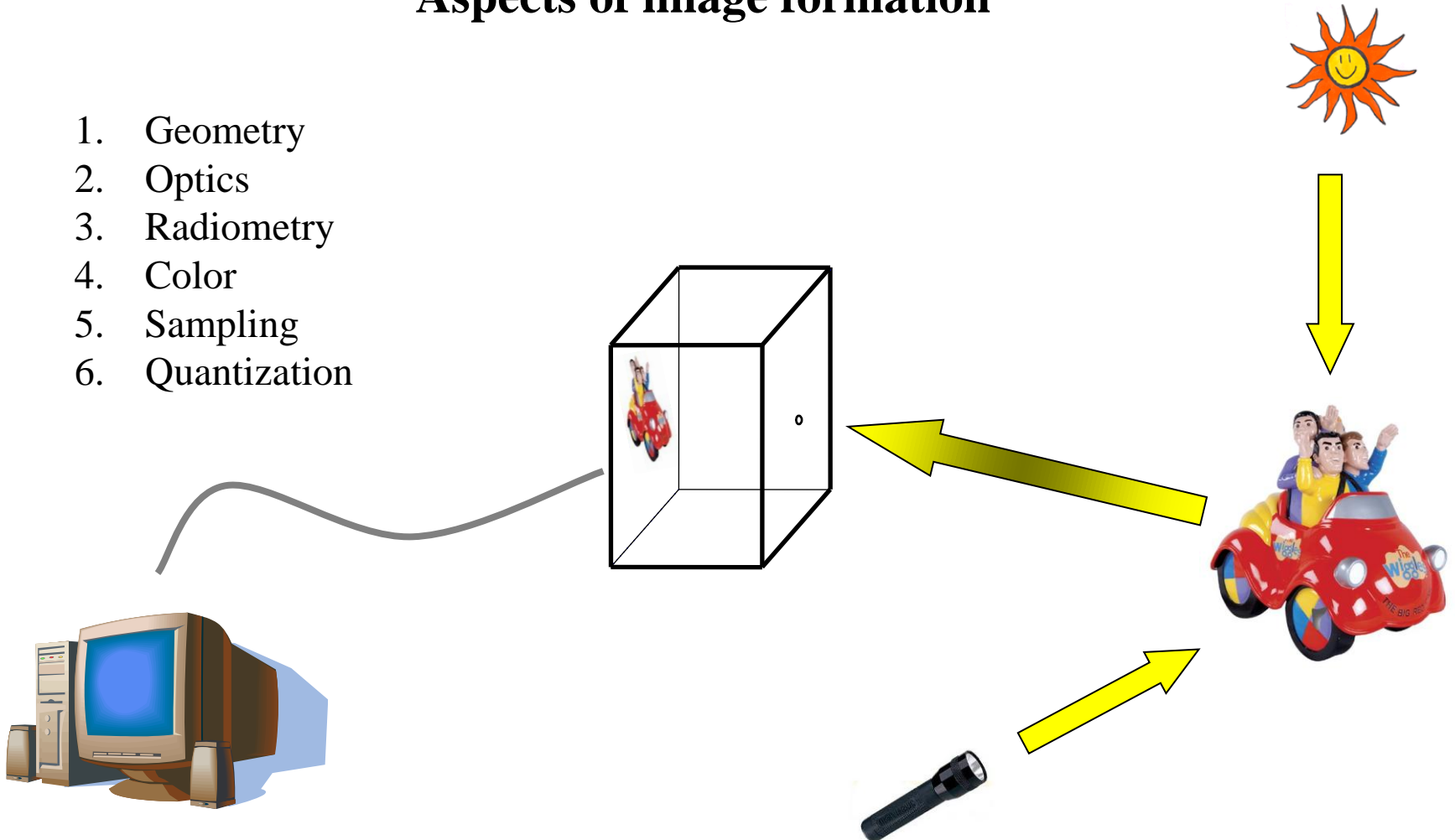
5. Sampling
6. Quantization



# *Image formation and representation*

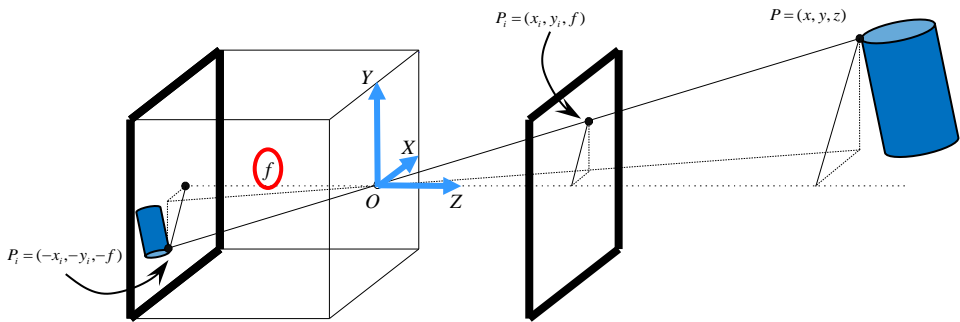
## Aspects of image formation

1. Geometry
2. Optics
3. Radiometry
4. Color
5. Sampling
6. Quantization



# Image formation and representation

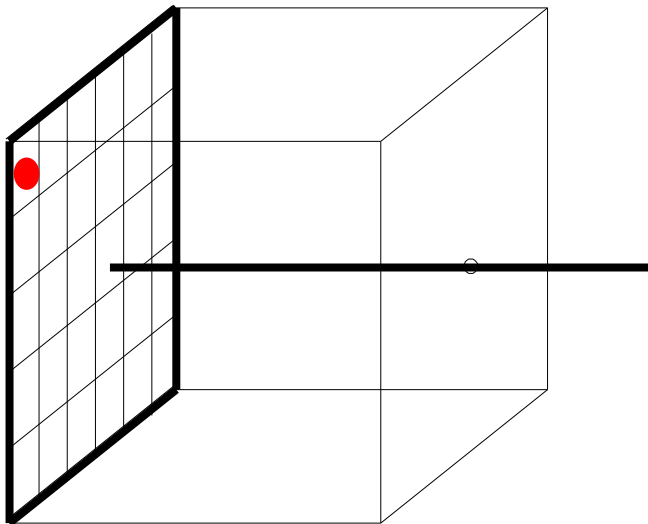
## Camera *intrinsic* parameters



$$\begin{pmatrix} x_i \\ y_i \\ 1 \end{pmatrix} = \begin{pmatrix} x_i \\ y_i \\ 1 \end{pmatrix} = \frac{1}{z} \begin{bmatrix} f & 0 & 0 & 0 \\ 0 & f & 0 & 0 \\ 0 & 0 & 1 & 0 \end{bmatrix} \cdot \begin{bmatrix} x \\ y \\ z \\ 1 \end{bmatrix}$$

$$x_i = S_x f \cdot \frac{x}{z} = \alpha \frac{x}{z} + x_0$$

$$y_i = S_y f \cdot \frac{y}{z} = \beta \frac{y}{z} + y_0$$

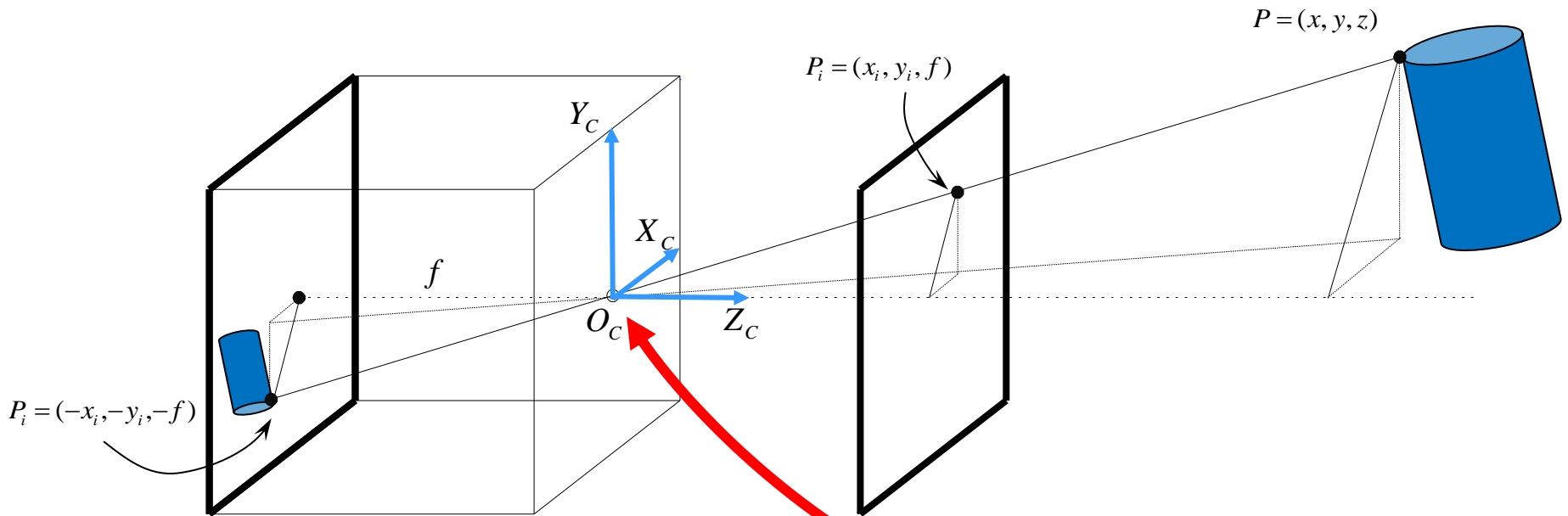


$$\begin{pmatrix} x_i \\ y_i \\ 1 \end{pmatrix} = \begin{pmatrix} x_i \\ y_i \\ 1 \end{pmatrix} = \frac{1}{z} \underbrace{\begin{bmatrix} \alpha & 0 & x_0 & 0 \\ 0 & \beta & y_0 & 0 \\ 0 & 0 & 1 & 0 \end{bmatrix}}_{\mathbf{K}} \cdot \begin{bmatrix} x \\ y \\ z \\ 1 \end{bmatrix}$$

The *calibration matrix*  $\mathbf{K}$

# Image formation and representation

## Camera *extrinsic* parameters



Rigid change of coordinates (6 parameters)

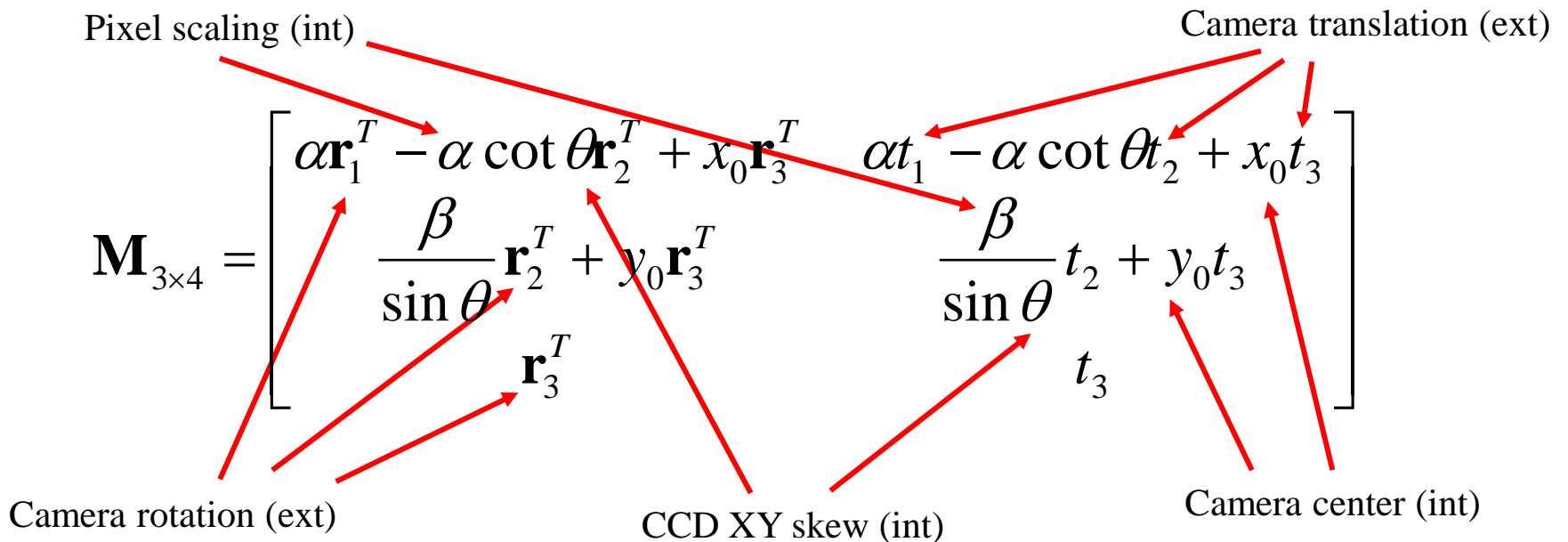
$$P = \mathbf{R}_{3 \times 3} \cdot P_w + \mathbf{t}_{3 \times 1}$$

$$\begin{bmatrix} P \\ 1 \end{bmatrix} = \underbrace{\begin{bmatrix} \mathbf{R}_{3 \times 3} & \mathbf{t}_{3 \times 1} \\ \mathbf{0} & 1 \end{bmatrix}}_{\mathbf{F}} \begin{bmatrix} P_w \\ 1 \end{bmatrix}$$

# *Image formation and representation*

## The perspective projection matrix

$$\begin{pmatrix} x_i \\ y_i \end{pmatrix} = \begin{bmatrix} x_i \\ y_i \\ 1 \end{bmatrix} = \frac{1}{z} \mathbf{M} \begin{bmatrix} x \\ y \\ z \\ 1 \end{bmatrix}$$

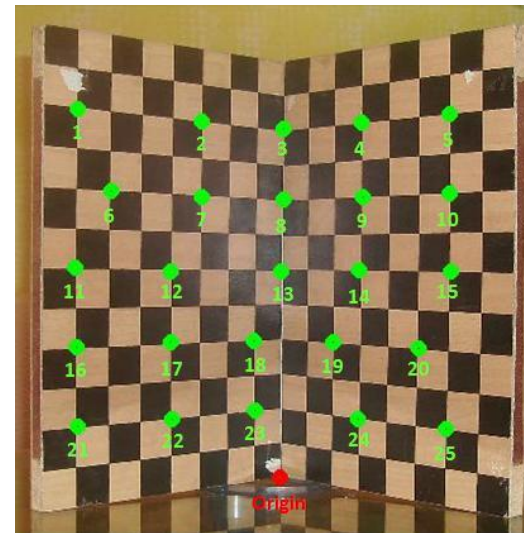
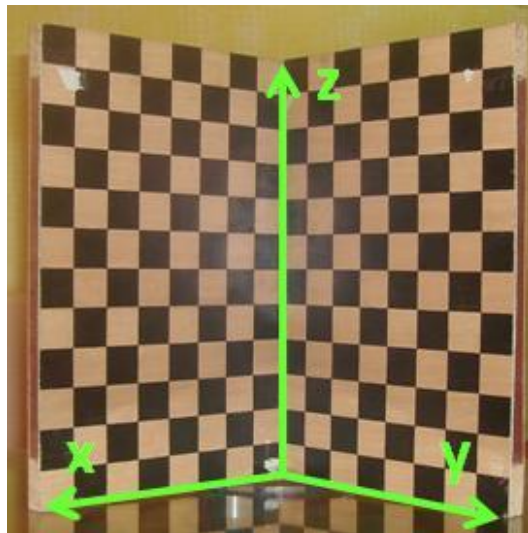


# *Image formation and representation*

## Camera calibration

- Measure enough pairs  $(P_i^j; P^j)$   $j = 1..N \geq 6$
- Estimate  $\mathbf{M}$
- Estimate the intrinsic and extrinsic parameters

$$P_i^j = \frac{1}{z} \mathbf{M} \cdot P^j$$



# *Image formation and representation*

## **Image representation**



```
32 48 57 98 142 158 160 151 155 153
161 160 155 163 159 166 159 176 153 156
143 116 99 114 100 105 132 148 132 108
124 124 110 93 96 78 38 42 66 62
197 196 199 200 196 200 199 195 203 201
150 144 125 119 118 108 144 164 227 81
162 163 171 174 172 165 175 171 193 188
201 152 184 110 89 136 119 100 120 183
93 137 155 173 172 164 162 159 171 157
203 179 174 173 138 117 100 107 107 118
188 145 111 169 160 135 107 74 59 63
198 193 182 192 198 203 200 196 201 192
183 179 156 128 128 157 169 174 159 208
161 165 174 164 163 164 156 157 156 162
130 154 173 112 190 174 153 179 187 161
46 85 89 68 167 154 155 163 155 158
191 198 191 205 192 190 156 105 106 122
180 170 200 160 166 184 159 144 113 75
192 192 190 195 191 190 195 194 196 196
168 151 171 185 181 170 149 167 174 177
157 156 171 153 147 157 162 159 156 163
112 162 168 155 180 188 172 162 186 185
67 67 49 69 92 87 111 156 160 158
202 193 195 196 198 196 193 196 198 162
192 198 191 201 201 197 198 188 173 144
155 156 198 198 194 190 192 194 192 190
182 171 163 161 162 176 186 195 161 154
```



# *Image formation and representation*

## **Image representation**

**(ignoring discretization and quantization)**



$$I(x, y) : \mathbb{R}^2 \rightarrow \mathbb{R}$$

# *Image formation and representation*

## **The issue of representation**

### **Representation:**

**A *formal* system for making *explicit* certain *entities* or types of *information*, together with the specification of how the system achieves this goal.**

### **Representational tradeoff:**

**Any particular representation makes certain information (or properties of the represented entities) explicit at the expense of other information (or properties) that is pushed into the background and may be quite hard to recover.**

**Therefore...**

**How information is represented greatly affects how easy it is to do certain things with it.**

# *Image formation and representation*

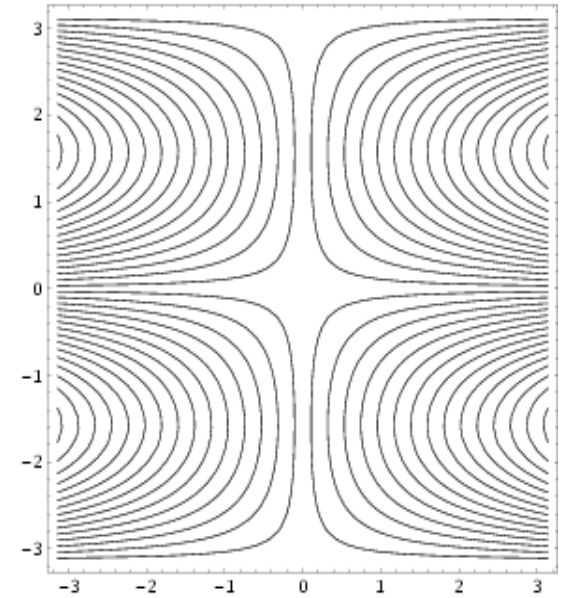
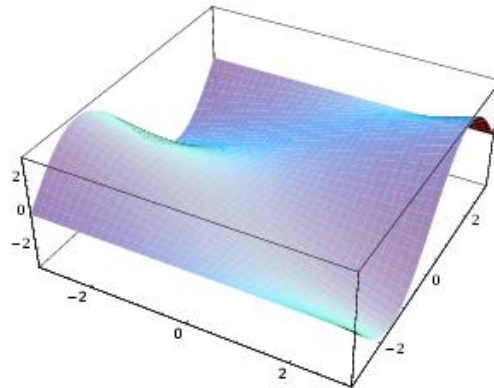
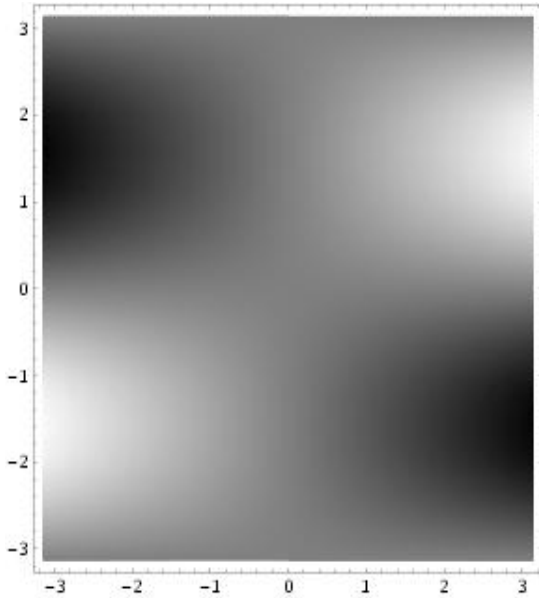
## **The issue of representation**



# *Image formation and representation*

## **Image representation**

$$I(x, y) : \mathbb{R}^2 \rightarrow \mathbb{R}$$



# *Image formation and representation*

## **Image representation**

