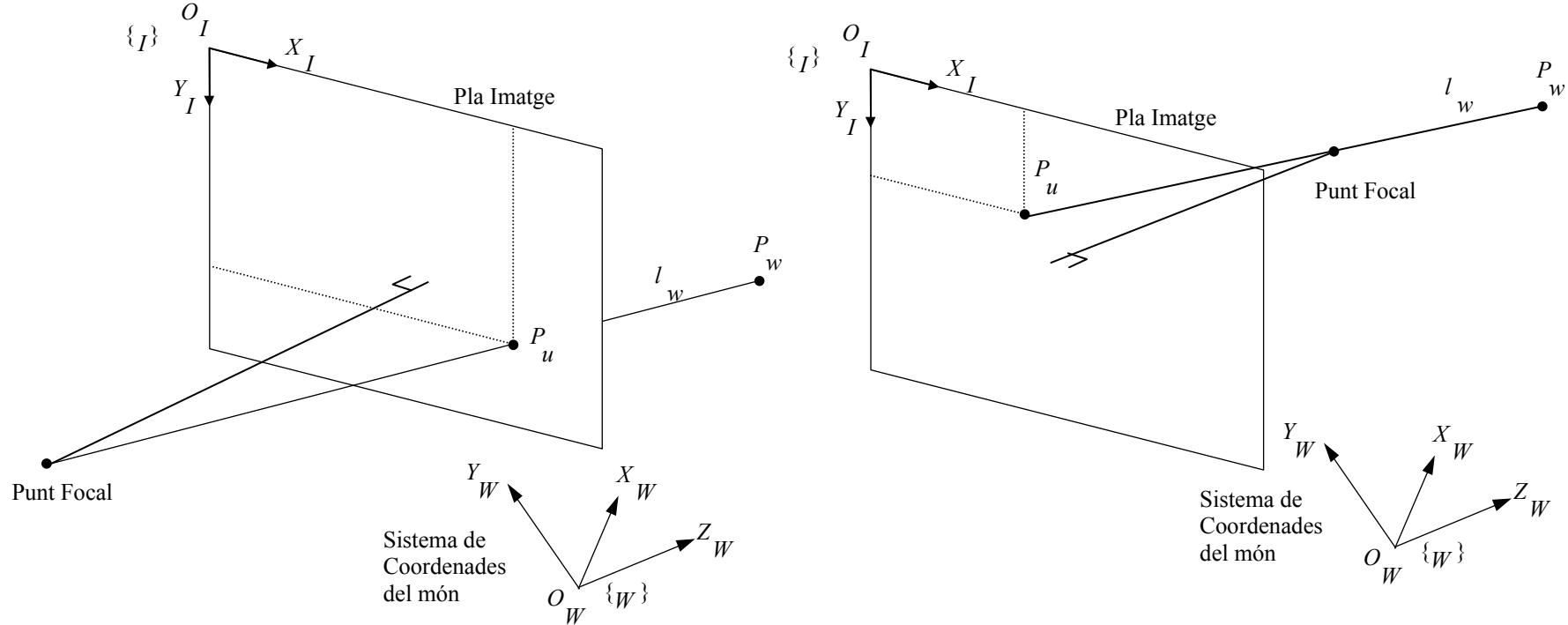


# TEMA 5

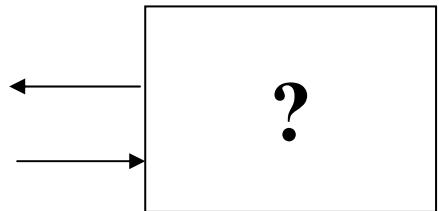
## Calibració de Càmeres

# Calibració de càmeres



$${}^I P_u = \begin{pmatrix} {}^I X_u \\ {}^I Y_u \\ 1 \end{pmatrix}$$

En píxels

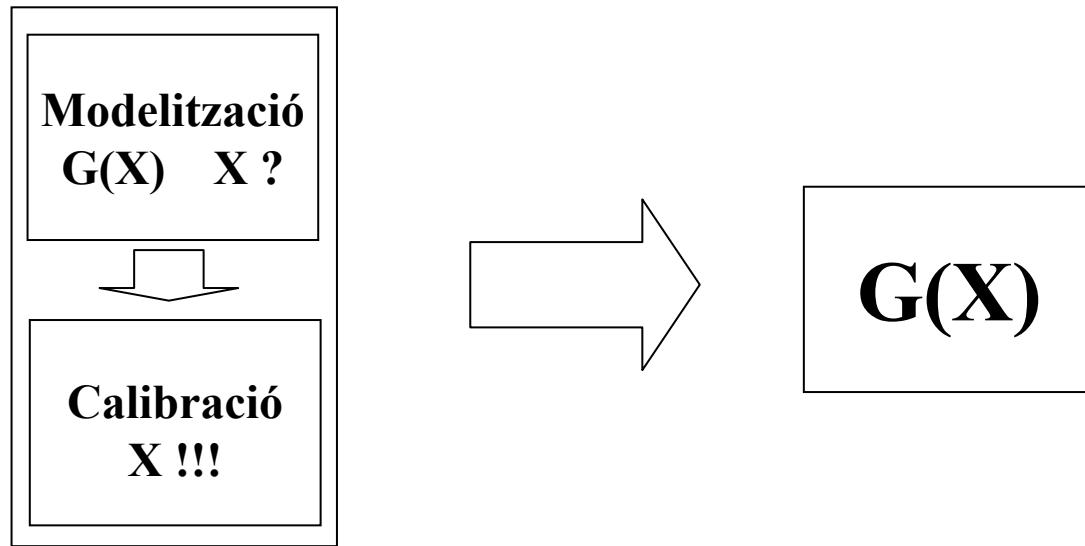


$${}^W P_w = \begin{pmatrix} {}^W X_w \\ {}^W Y_w \\ {}^W Z_w \\ 1 \end{pmatrix}$$

En mm.

$${}^W l_w = \begin{pmatrix} {}^W X_w \\ {}^W Y_w \\ {}^W Z_w \\ 0 \end{pmatrix}$$

# Calibració de càmeres



## Modelització:

- Especificar l'equació matemàtica que regirà el comportament de la càmara.
- Aquesta equació dependrà d'un conjunt de paràmetres.
- Aproximació matemàtica al model físic real de la càmara.

## Calibració:

- Obtenció del valor dels paràmetres del model.

# Mètode de Hall - Model de la càmera

Suposem que la llum es projecta al pla imatge de forma lineal.

$$\begin{pmatrix} s^I X_u \\ s^I Y_u \\ s \end{pmatrix} = \begin{pmatrix} A_{11} & A_{12} & A_{13} & A_{14} \\ A_{21} & A_{22} & A_{23} & A_{24} \\ A_{31} & A_{32} & A_{33} & A_{34} \end{pmatrix} \begin{pmatrix} {}^w X_w \\ {}^w Y_w \\ {}^w Z_w \\ 1 \end{pmatrix}$$

Matriu definida a partir d'un factor d'escala

Solució única fixant una component qualsevol a la unitat.

$$\begin{pmatrix} s^I X_u \\ s^I Y_u \\ s \end{pmatrix} = \begin{pmatrix} A_{11} & A_{12} & A_{13} & A_{14} \\ A_{21} & A_{22} & A_{23} & A_{24} \\ A_{31} & A_{32} & A_{33} & 1 \end{pmatrix} \begin{pmatrix} {}^w X_w \\ {}^w Y_w \\ {}^w Z_w \\ 1 \end{pmatrix}$$

# Mètode de Hall - Calibració

$$\begin{pmatrix} s^I X_u \\ s^I Y_u \\ s \end{pmatrix} = \begin{pmatrix} A_{11} & A_{12} & A_{13} & A_{14} \\ A_{21} & A_{22} & A_{23} & A_{24} \\ A_{31} & A_{32} & A_{33} & 1 \end{pmatrix} \begin{pmatrix} {}^W X_w \\ {}^W Y_w \\ {}^W Z_w \\ 1 \end{pmatrix}$$

$${}^I X_u = \frac{A_{11} {}^W X_w + A_{12} {}^W Y_w + A_{13} {}^W Z_w + A_{14}}{A_{31} {}^W X_w + A_{32} {}^W Y_w + A_{33} {}^W Z_w + 1}$$

$${}^I Y_u = \frac{A_{21} {}^W X_w + A_{22} {}^W Y_w + A_{23} {}^W Z_w + A_{24}}{A_{31} {}^W X_w + A_{32} {}^W Y_w + A_{33} {}^W Z_w + 1}$$

$$A_{11} {}^W X_w - A_{31} {}^I X_u {}^W X_w + A_{12} {}^W Y_w - A_{32} {}^I X_u {}^W Y_w + A_{13} {}^W Z_w - A_{33} {}^I X_u {}^W Z_w + A_{14} = {}^I X_u$$

$$A_{21} {}^W X_w - A_{31} {}^I Y_u {}^W X_w + A_{22} {}^W Y_w - A_{32} {}^I Y_u {}^W Y_w + A_{23} {}^W Z_w - A_{33} {}^I Y_u {}^W Z_w + A_{24} = {}^I Y_u$$

# Mètode de Hall - Calibració

$$A_{11} {}^W X_w - A_{31} {}^I X_u {}^W X_w + A_{12} {}^W Y_w - A_{32} {}^I X_u {}^W Y_w + A_{13} {}^W Z_w - A_{33} {}^I X_u {}^W Z_w + A_{14} = {}^I X_u$$

$$A_{21} {}^W X_w - A_{31} {}^I Y_u {}^W X_w + A_{22} {}^W Y_w - A_{32} {}^I Y_u {}^W Y_w + A_{23} {}^W Z_w - A_{33} {}^I Y_u {}^W Z_w + A_{24} = {}^I Y_u$$

$$A = \begin{pmatrix} A_{11} & A_{12} & A_{13} & A_{14} & A_{21} & A_{22} & A_{23} & A_{24} & A_{31} & A_{32} & A_{33} \end{pmatrix}^T$$

Tenim 11 incògnites i cada punt 2D ens dona 2 equacions.

Necessitem com a mínim 6 punts. Més punts implica més precisió

$$QA = B$$

$$Q_{2i-1} = \begin{pmatrix} {}^W X_{wi} & {}^W Y_{wi} & {}^W Z_{wi} & 1 & 0 & 0 & 0 & 0 & -{}^I X_{ui} {}^W X_{wi} & -{}^I X_{ui} {}^W Y_{wi} & -{}^I X_{ui} {}^W Z_{wi} \end{pmatrix}$$

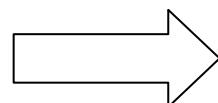
$$Q_{2i} = \begin{pmatrix} 0 & 0 & 0 & 0 & {}^W X_{wi} & {}^W Y_{wi} & {}^W Z_{wi} & 1 & -{}^I Y_{ui} {}^W X_{wi} & -{}^I Y_{ui} {}^W Y_{wi} & -{}^I Y_{ui} {}^W Z_{wi} \end{pmatrix}$$

$$B_{2i-1} = \begin{pmatrix} {}^I X_{ui} \end{pmatrix}$$

$$B_{2i} = \begin{pmatrix} {}^I Y_{ui} \end{pmatrix}$$

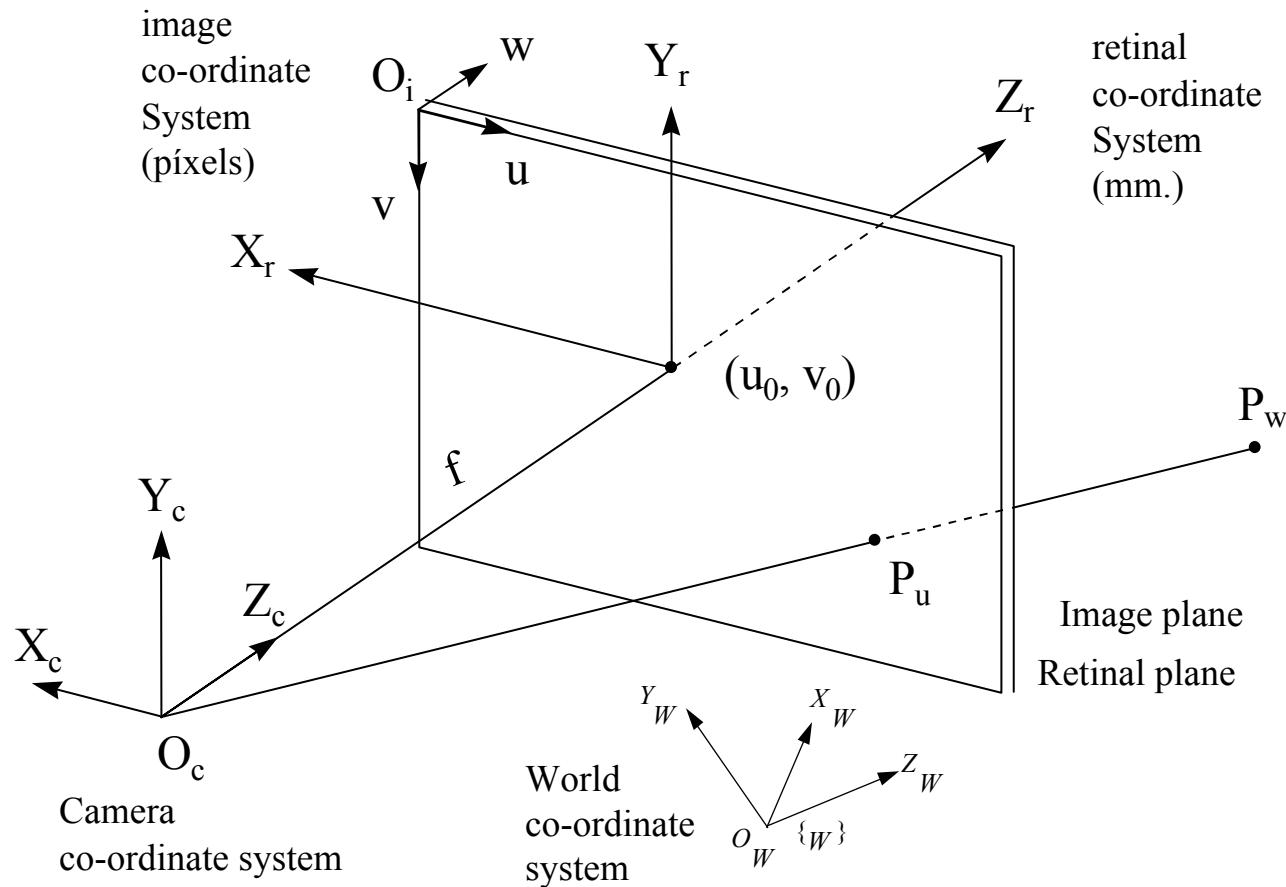
Aleshores, es pot obtenir una solució per la matriu A, utilitzant la pseudoinversa.

$$A = Q^{-1} B$$



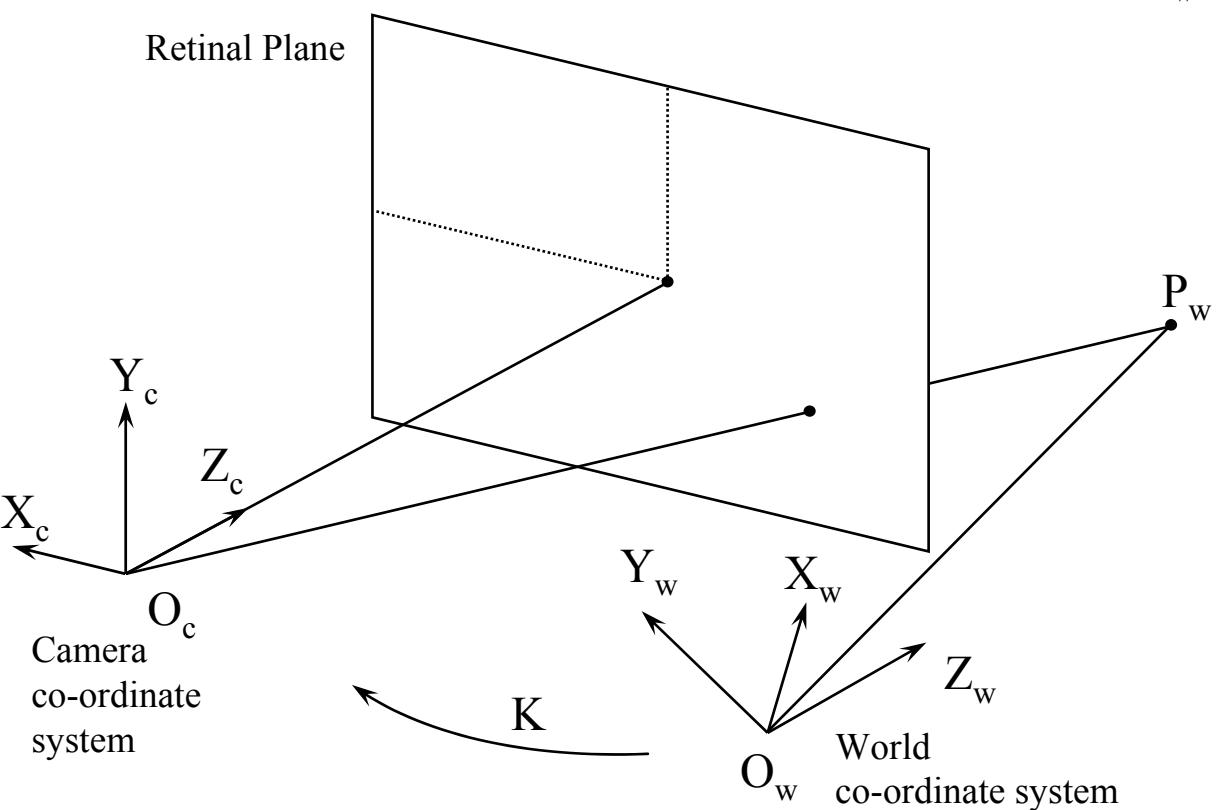
$$A = (Q^t Q)^{-1} Q^t B$$

# Mètode de Faugeras - El model pinhole



- **Extrinsic parameters:** Model the situation and orientation of the camera with respect to a world co-ordinate system.
- **Intrinsic parameters:** Model the behaviour of the internal geometry and the optical characteristics of the camera.

# Mètode de Faugeras - Paràmetres extrínsecos



$${}^C R_W = \text{Rot}(X, \alpha) \cdot \text{Rot}(Y, \beta) \cdot \text{Rot}(Z, \gamma)$$

$${}^C R_W = \begin{pmatrix} r_{11} & r_{12} & r_{13} \\ r_{21} & r_{22} & r_{23} \\ r_{31} & r_{32} & r_{33} \end{pmatrix}$$

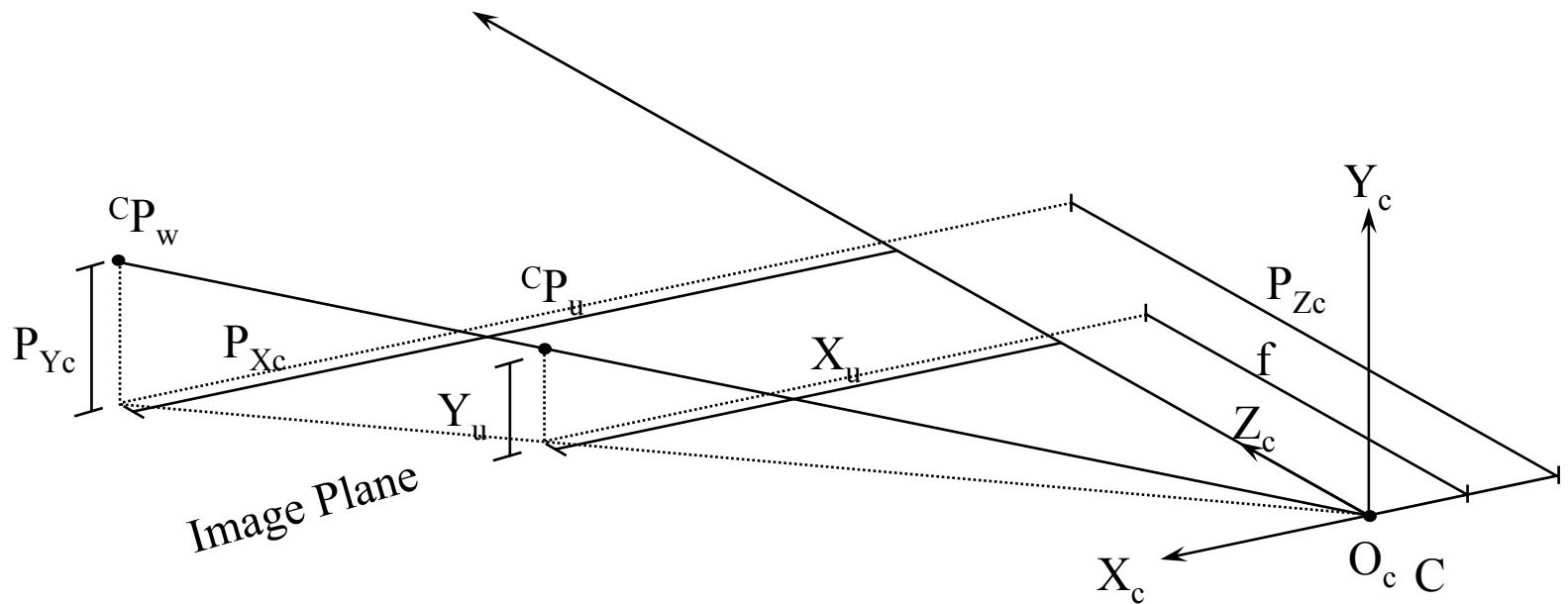
$${}^C T_W = \begin{pmatrix} t_X \\ t_Y \\ t_Z \end{pmatrix}$$

$$\begin{pmatrix} {}^C X_w \\ {}^C Y_w \\ {}^C Z_w \end{pmatrix} = {}^C R_W \begin{pmatrix} {}^W X_w \\ {}^W Y_w \\ {}^W Z_w \end{pmatrix} + {}^C T_W$$

$$\begin{pmatrix} {}^C P_w \\ 1 \end{pmatrix} = {}^C K_W \begin{pmatrix} {}^W P_w \\ 1 \end{pmatrix}$$

$${}^C K_W = \begin{pmatrix} {}^C R_{W3x3} & {}^C T_{W3x1} \\ 0_{1x3} & 1 \end{pmatrix}$$

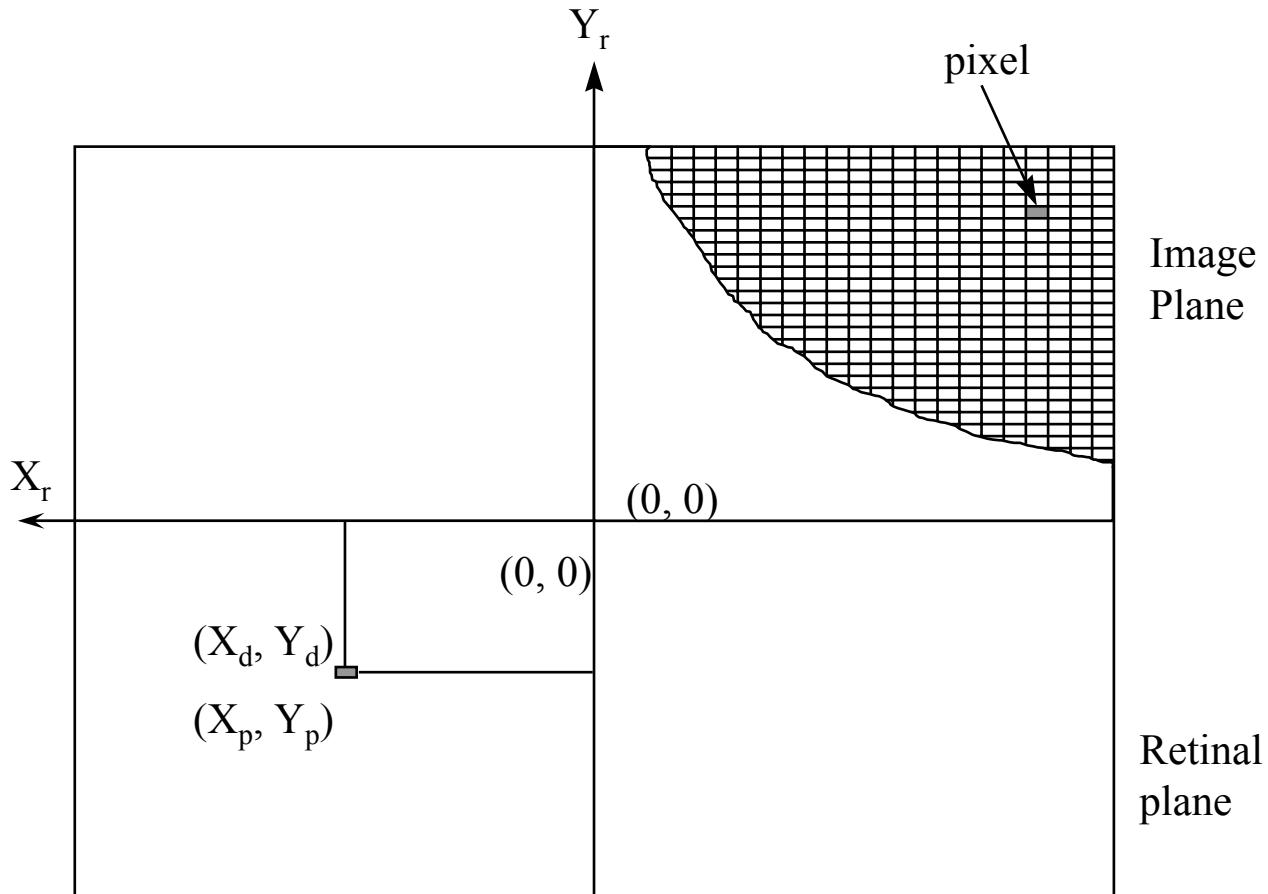
# Mètode de Faugeras - Paràmetres intrínsecs - Projecció ideal



$${}^C X_u = f \frac{{}^C X_w}{{}^C Z_w}$$

$${}^C Y_u = f \frac{{}^C Y_w}{{}^C Z_w}$$

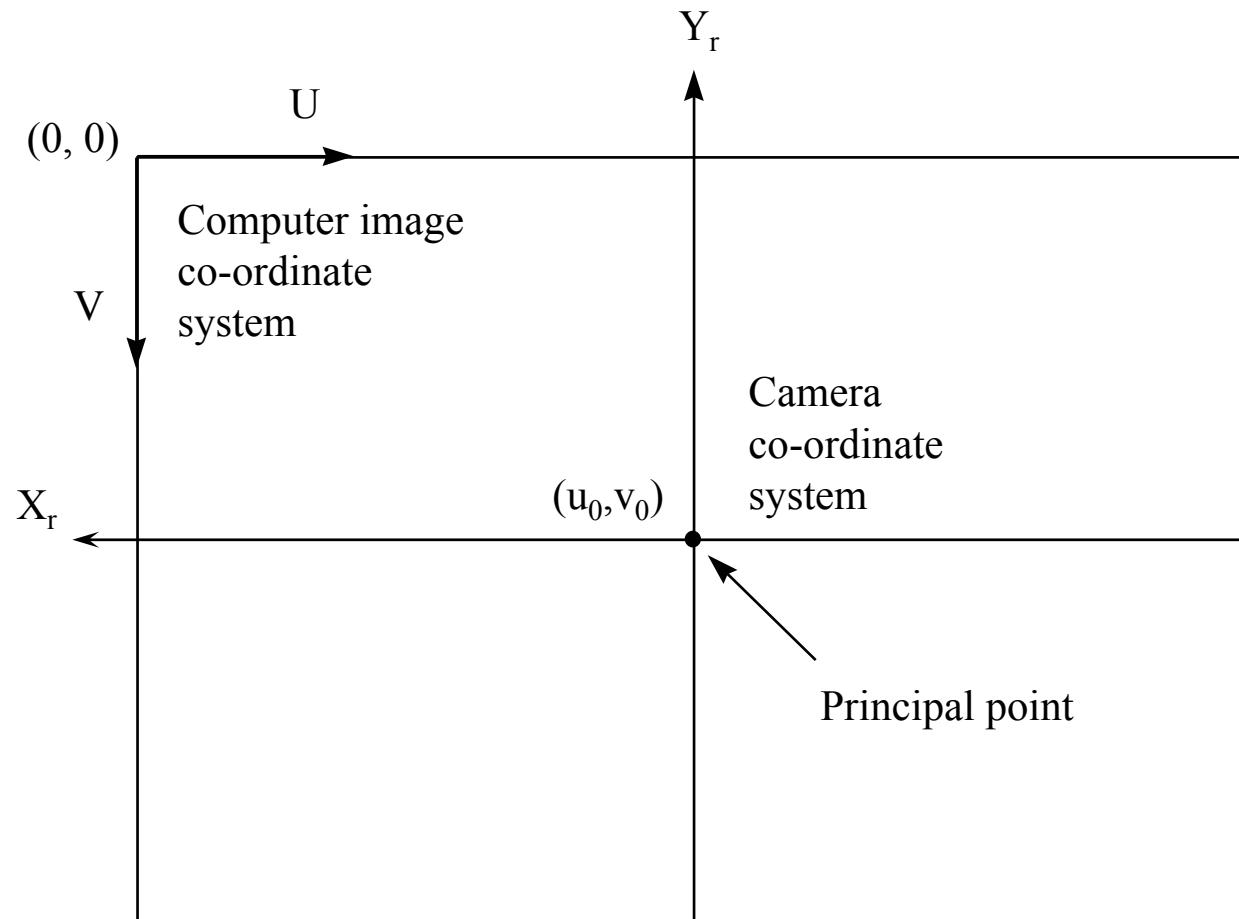
# Mètode de Faugeras - Paràmetres intrínsecs - Conversió píxel



$${}^R X_d = k_u {}^C X_u$$

$${}^R Y_d = k_v {}^C X_u$$

# Mètode de Faugeras - Paràmetres intrínsecs - Punt Principal



$${}^I X_d = - {}^R X_d + u_0$$

$${}^I Y_d = - {}^R X_d + v_0$$

# Mètode de Faugeras - Model de la càmera

$(X_w, Y_w, Z_w)$  3D object point with respect to world co-ordinate system

Affine transformation.

Modelled parameters:  $R, T$

$(X_c, Y_c, Z_c)$  3D object point with respect to camera co-ordinate system

Perspective transformation.

Modelled parameter:  $f$

$(X_u, Y_u)$  Ideal projection on the retinal plane

Pixel adjustment

Modelled parameters:  $k_u, k_v$

$(X_p, Y_p)$  Real projection on the image plane

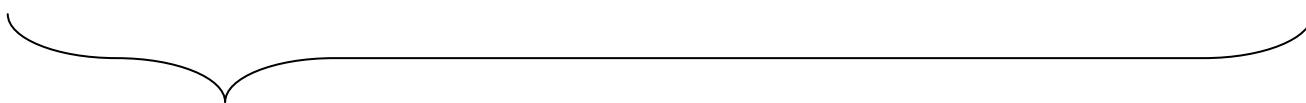
Adaptation to the computer image buffer

Modelled parameters:  $u_0, v_0$

$(X_i, Y_i)$  Real projection on the image plane

# Mètode de Faugeras - Paràmetres intrínsecos

$$\begin{array}{l}
 {}^C X_u = f \frac{{}^C X_w}{{}^C Z_w} \quad {}^R X_d = k_u {}^C X_u \quad {}^I X_d = - {}^R X_d + u_0 \\
 {}^C Y_u = f \frac{{}^C Y_w}{{}^C Z_w} \quad {}^R Y_d = k_v {}^C X_u \quad {}^I Y_d = - {}^R X_d + v_0
 \end{array}$$



$$\begin{aligned}
 {}^I X_u &= -k_u f \frac{{}^C X_w}{{}^C Z_w} + u_0 \\
 {}^I Y_u &= -k_v f \frac{{}^C Y_w}{{}^C Z_w} + v_0
 \end{aligned}$$

$$\begin{pmatrix} s {}^I X_u \\ s {}^I Y_u \\ s \end{pmatrix} = \begin{pmatrix} \alpha_u & 0 & u_0 & 0 \\ 0 & \alpha_v & v_0 & 0 \\ 0 & 0 & 1 & 0 \end{pmatrix} \begin{pmatrix} {}^C X_w \\ {}^C Y_w \\ {}^C Z_w \\ 1 \end{pmatrix}$$

$$\alpha_u = -fk_u$$

$$\alpha_v = -fk_v$$

# Mètode de Faugeras - Model de la càmera

$$\begin{array}{c}
 \text{Intrínsecs} & \text{Extrínsecs} \\
 \left( \begin{array}{c} s^I X_u \\ s^I Y_u \\ s \end{array} \right) = \left( \begin{array}{cccc} \alpha_u & 0 & u_0 & 0 \\ 0 & \alpha_v & v_0 & 0 \\ 0 & 0 & 1 & 0 \end{array} \right) \left( \begin{array}{cccc} r_{11} & r_{12} & r_{13} & t_x \\ r_{21} & r_{22} & r_{23} & t_y \\ r_{31} & r_{32} & r_{33} & t_z \\ 0 & 0 & 0 & 1 \end{array} \right) \left( \begin{array}{c} {}^W X_w \\ {}^W Y_w \\ {}^W Z_w \\ 1 \end{array} \right) \\
 \underbrace{\hspace{10em}}_{A = \left( \begin{array}{cc} \alpha_u r_1 + u_0 r_3 & \alpha_u t_x + u_0 t_z \\ \alpha_v r_2 + v_0 r_3 & \alpha_v t_y + v_0 t_z \\ r_3 & t_z \end{array} \right)}
 \end{array}$$

# Mètode de Faugeras - Calibració

$$A_1 {}^W P_w + A_{14} - {}^I X_u \left( A_3 {}^W P_w + A_{34} \right) = 0$$

$${}^I X_u = \frac{A_1}{A_{34}} {}^W P_w + \frac{A_{14}}{A_{34}} - \frac{A_3}{A_{34}} {}^W P_w {}^I X_u$$

$$A_2 {}^W P_w + A_{24} - {}^I Y_u \left( A_3 {}^W P_w + A_{34} \right) = 0$$

$${}^I Y_u = \frac{A_2}{A_{34}} {}^W P_w + \frac{A_{24}}{A_{34}} - \frac{A_3}{A_{34}} {}^W P_w {}^I Y_u$$

$${}^I X_u = T_1 {}^W P_w + C_1 - T_2 {}^W P_w {}^I X_u$$

$${}^I Y_u = T_3 {}^W P_w + C_2 - T_2 {}^W P_w {}^I Y_u$$

$$T_1 = \frac{r_3}{t_z} u_0 + \frac{r_1}{t_z} \alpha_u \quad C_1 = u_0 + \frac{t_x}{t_z} \alpha_u$$

$$T_2 = \frac{r_3}{t_z}$$

$$T_3 = \frac{r_3}{t_z} v_0 + \frac{r_2}{t_z} \alpha_v \quad C_2 = v_0 + \frac{t_y}{t_z} \alpha_v$$

# Mètode de Faugeras - Calibració

$$B = QX$$

$$X = \begin{pmatrix} T_1 \\ T_2 \\ T_3 \\ C_1 \\ C_2 \end{pmatrix}$$
$$Q = \begin{pmatrix} & & & \cdots & \\ {}^W P_{wi}^t & -{}^I X_{ui} {}^W P_{wi}^t & 0_{1x3} & 1 & 0 \\ 0_{1x3} & -{}^I Y_{ui} {}^W P_{wi}^t & {}^W P_{wi}^t & 0 & 1 \\ & & \cdots & & \end{pmatrix}$$
$$B = \begin{pmatrix} \cdots \\ {}^I X_{ui} \\ {}^I Y_{ui} \\ \cdots \end{pmatrix}$$

$$X = (Q^t Q)^{-1} Q^t B$$

# Mètode de Faugeras - Calibració - Obtenció dels paràmetres

$$T_1 = \frac{r_3}{t_z} u_0 + \frac{r_1}{t_z} \alpha_u \quad C_1 = u_0 + \frac{t_x}{t_z} \alpha_u$$

$$T_2 = \frac{r_3}{t_z}$$

$$T_3 = \frac{r_3}{t_z} v_0 + \frac{r_2}{t_z} \alpha_v \quad C_2 = v_0 + \frac{t_y}{t_z} \alpha_v$$

$$\|r_3\| = 1 \quad \longrightarrow \quad t_z = \frac{1}{\|T_2\|}$$

# Mètode de Faugeras - Calibració - Obtenció dels paràmetres

$$T_1 = \frac{r_3}{t_z} u_0 + \frac{r_1}{t_z} \alpha_u \quad C_1 = u_0 + \frac{t_x}{t_z} \alpha_u$$

$$T_2 = \frac{r_3}{t_z}$$

$$T_3 = \frac{r_3}{t_z} v_0 + \frac{r_2}{t_z} \alpha_v \quad C_2 = v_0 + \frac{t_y}{t_z} \alpha_v$$

$$v_1 v_2 = \|v_1\| \|v_2\| \cos \alpha$$

$$v_1 \wedge v_2 = \|v_1\| \|v_2\| \sin \alpha$$

$$r_i r_j^t = 0 \quad i \neq j$$

$$r_i r_j^t = 1 \quad i = j$$

$$r_i \wedge r_j = 1 \quad i \neq j$$

$$r_i \wedge r_j = 0 \quad i = j$$

$$u_0 = \frac{T_1 T_2^t}{\|T_2\|^2} \quad v_0 = \frac{T_1 T_3^t}{\|T_2\|^2}$$

$$\alpha_u = \frac{\|T_1^t \wedge T_2^t\|}{\|T_2\|^2} \quad \alpha_v = \frac{\|T_2^t \wedge T_3^t\|}{\|T_2\|^2}$$

# Mètode de Faugeras - Calibració - Obtenció dels paràmetres

$$T_1 = \frac{r_3}{t_z} u_0 + \frac{r_1}{t_z} \alpha_u \quad C_1 = u_0 + \frac{t_x}{t_z} \alpha_u$$

$$T_2 = \frac{r_3}{t_z}$$

$$T_3 = \frac{r_3}{t_z} v_0 + \frac{r_2}{t_z} \alpha_v \quad C_2 = v_0 + \frac{t_y}{t_z} \alpha_v$$

$$v_1 v_2 = \|v_1\| \|v_2\| \cos \alpha$$

$$v_1 \wedge v_2 = \|v_1\| \|v_2\| \sin \alpha$$

$$r_i r_j^t = 0 \quad i \neq j$$

$$r_i r_j^t = 1 \quad i = j$$

$$r_i \wedge r_j = 1 \quad i \neq j$$

$$r_i \wedge r_j = 0 \quad i = j$$

$$r_1 = \frac{\|T_2\|}{\|T_1^t \wedge T_2^t\|} \left( T_1 - \frac{T_1 T_2^t}{\|T_2\|^2} T_2 \right)$$

$$r_2 = \frac{\|T_2\|}{\|T_2^t \wedge T_3^t\|} \left( T_3 - \frac{T_2 T_3^t}{\|T_2\|^2} T_2 \right)$$

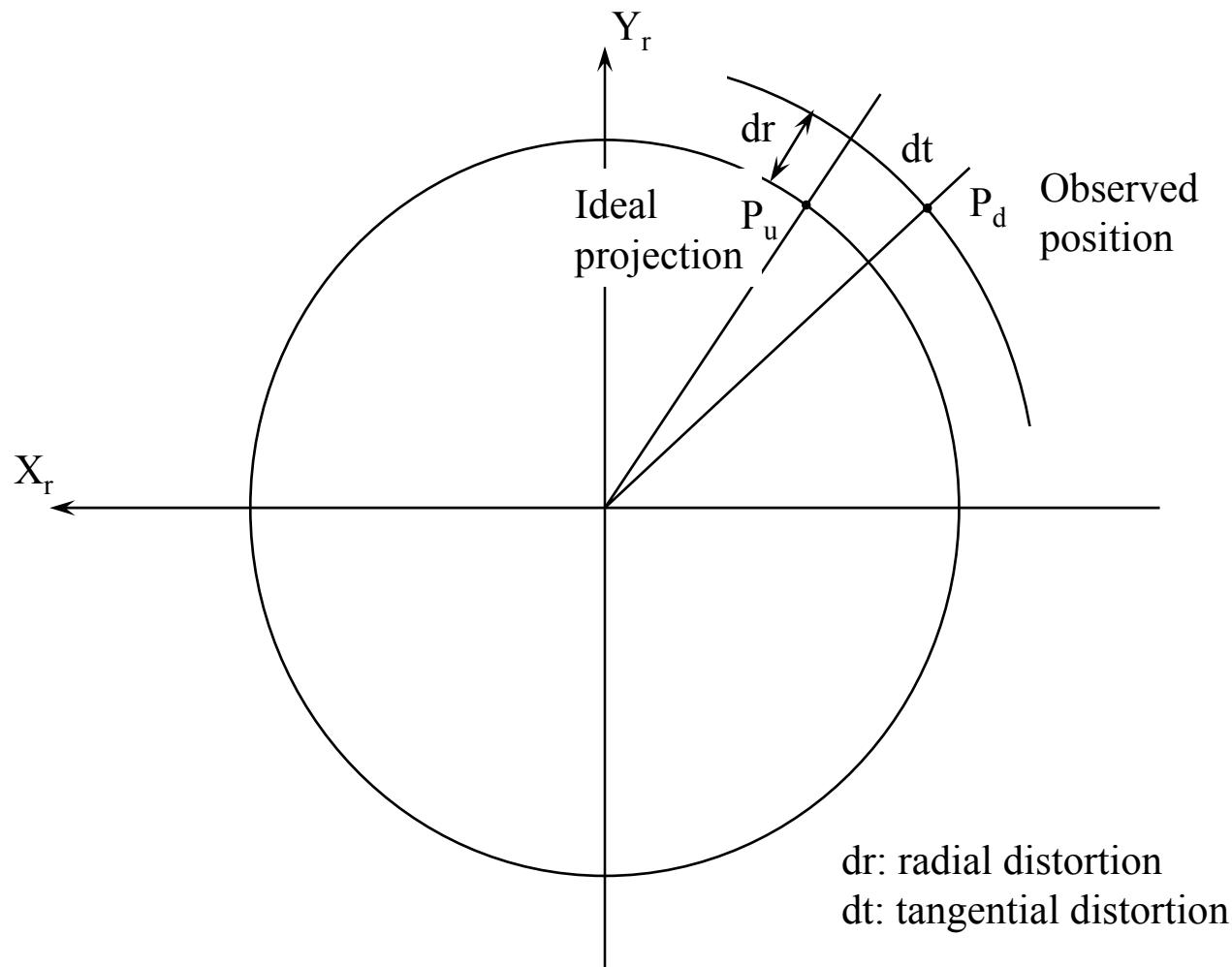
$$r_3 = \frac{T_2}{\|T_2\|}$$

$$t_x = \frac{\|T_2\|}{\|T_1^t \wedge T_2^t\|} \left( C_1 - \frac{T_1 T_2^t}{\|T_2\|^2} \right)$$

$$t_y = \frac{\|T_2\|}{\|T_2^t \wedge T_3^t\|} \left( C_2 - \frac{T_2 T_3^t}{\|T_2\|^2} \right)$$

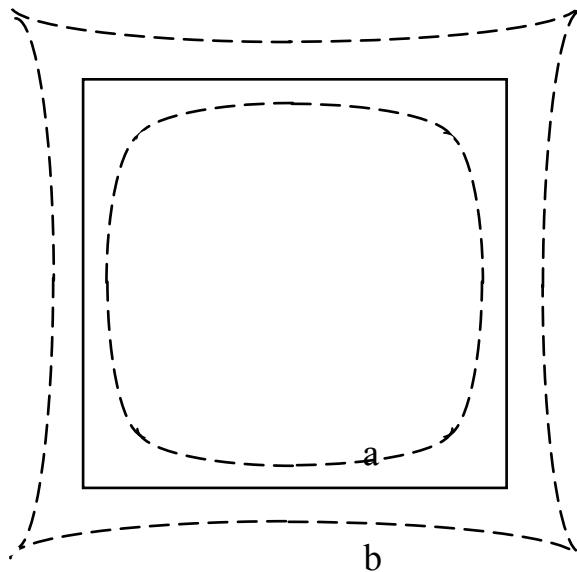
$$t_z = \frac{1}{\|T_2\|}$$

# Mètode de Faugeras amb distorsió de les lens

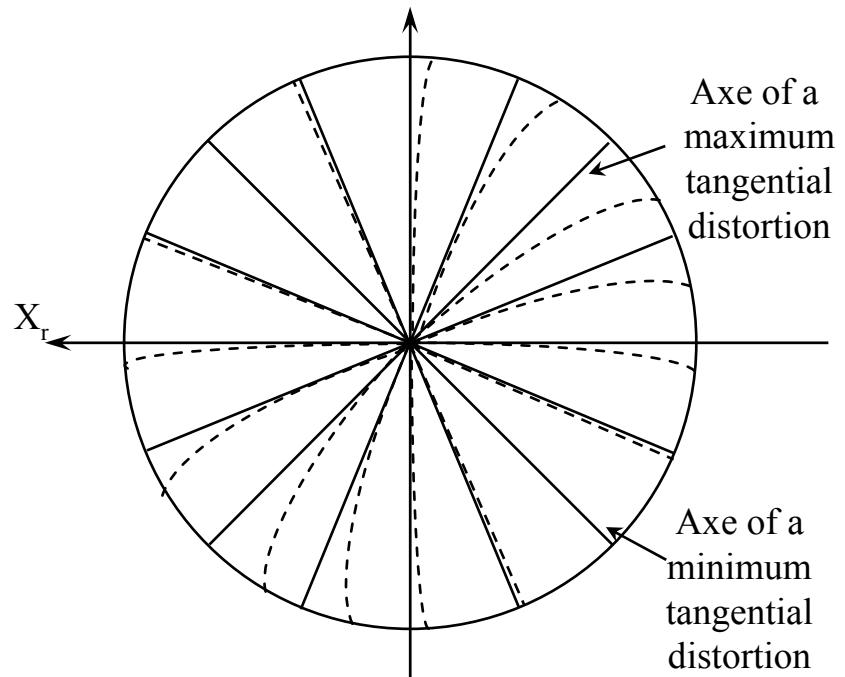


# Mètode de Faugeras amb distorsió de les lens

Efecte de la distorsió radial



Efecte de la distorsió tangencial



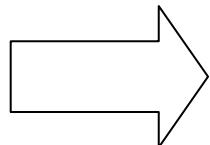
La distorsió radial es la que afecta més, i normalment és la única que es té en compte en la majoria de models.

# Mètode de Faugeras - Model amb distorsió radial - Paràmetres intrínsecos

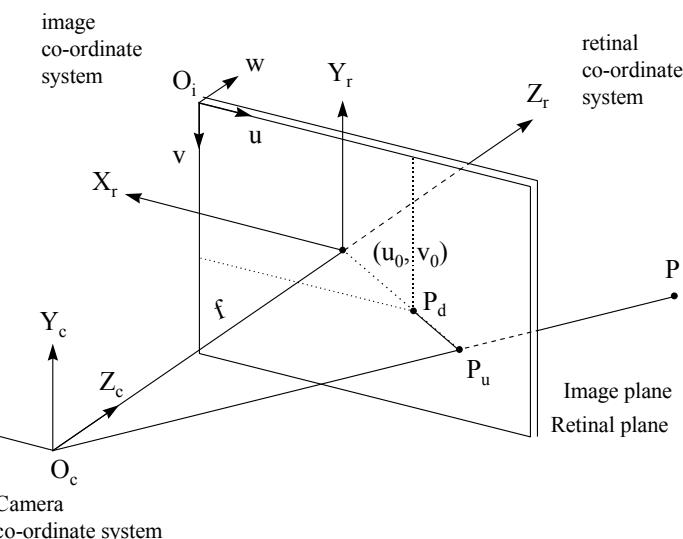
$$D_x = {}^c X_d \left( k_1 r^2 + k_2 r^4 + \dots \right)$$

$$D_y = {}^c Y_d \left( k_1 r^2 + k_2 r^4 + \dots \right)$$

$$r = \sqrt{{}^c X_d^2 + {}^c Y_d^2}$$



$k_1$  es el factor més important



$$\frac{X_u}{f} = \frac{P_{Xc}}{P_{Zc}}$$

$$\frac{Y_u}{f} = \frac{P_{Yc}}{P_{Zc}}$$

$$X_u = X_d + D_x$$

$$Y_u = Y_d + D_y$$

$$D_x = X_d k_1 r^2$$

$$D_y = Y_d k_1 r^2$$

$$r = \sqrt{{}^c X_d^2 + {}^c Y_d^2}$$

$$X_p = k_u X_d$$

$$Y_p = k_v Y_d$$

$$X_i = -X_p + u_0$$

$$Y_i = -Y_p + v_0$$

# Metode de Faugeras - Model amb distorsió radial

$(X_w, Y_w, Z_w)$  3D object point with respect to world co-ordinate system

Affine transformation.

Modelled parameters:  $R, T$

$(X_c, Y_c, Z_c)$  3D object point with respect to camera co-ordinate system

Perspective transformation.

Modelled parameter:  $f$

$(X_u, Y_u)$  Ideal projection on the retinal plane

Radial lens distortion.

Modelled parameter:  $k_1$

$(X_d, Y_d)$  Real projection on the retinal plane

Pixel adjustment

Modelled parameters:  $k_u, k_v$

$(X_p, Y_p)$  Real projection on the image plane

Adaptation to the computer image buffer

Modelled parameters:  $u_0, v_0$

$(X_i, Y_i)$  Real projection on the image plane

# Mètode de Faugeras - El model amb distorsió radial

$$f \frac{{}^C X_w}{{}^C Z_w} = {}^C X_d + k_1 r^2 {}^C X_d$$

$$f \frac{{}^C Y_w}{{}^C Z_w} = {}^C Y_d + k_1 r^2 {}^C Y_d$$

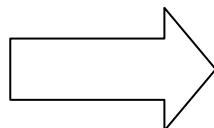
$${}^C X_d = \frac{{}^I X_d - u_0}{-k_u}$$

$${}^C Y_d = \frac{{}^I Y_d - v_0}{-k_v}$$

$$r = \sqrt{{}^I X_d^2 + {}^I Y_d^2}$$

$$\begin{pmatrix} {}^C X_w \\ {}^C Y_w \\ {}^C Z_w \\ 1 \end{pmatrix} = {}^C K_W \begin{pmatrix} {}^W X_w \\ {}^W Y_w \\ {}^W Z_w \\ 1 \end{pmatrix}$$

El model és NO LINEAL



Calibració per mètodes iteratius