

# Visual Perception

## Lecture 2

### *Camera Calibration*



## 2. Camera Calibration

- 2.1 Calibration introduction
- 2.2 The pinhole model
- 2.3 The method of Hall
- 2.4 The method of Faugeras-Toscani – Modelling
- 2.5 The method of Faugeras-Toscani – Calibration
- 2.6 The method of Faugeras-Toscani with distortion
- 2.7 Experimental comparison of methods

## 2. Camera Calibration

### 2.1 Calibration introduction

### 2.2 The pinhole model

### 2.3 The method of Hall

### 2.4 The method of Faugeras-Toscani – Modelling

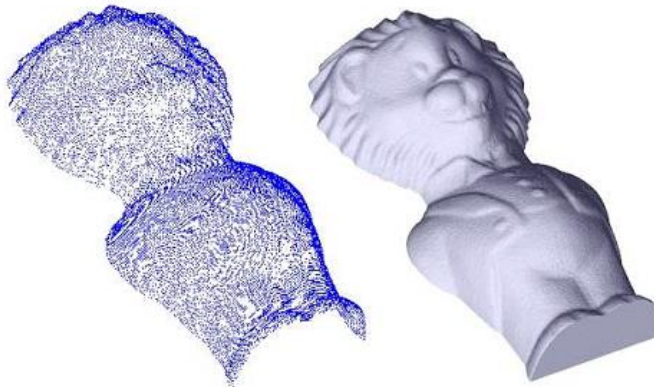
### 2.5 The method of Faugeras-Toscani – Calibration

### 2.6 The method of Faugeras-Toscani with distortion

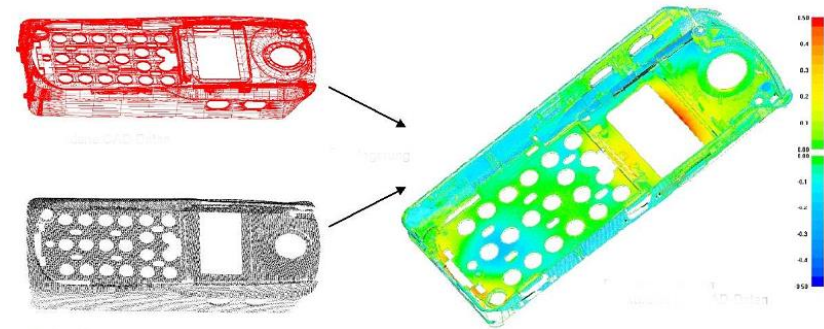
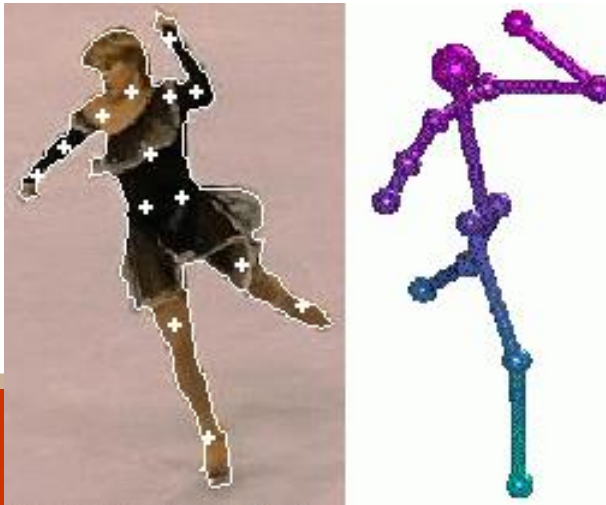
### 2.7 Experimental comparison of methods

## 2.1 Calibration Introduction

- Some applications of this capability include
  - Dense reconstruction
  - Visual inspection



– Object localization



– Camera localization



## 2.1 Calibration Introduction – Perspective Imaging<sup>5</sup>

“The Scholar of Athens,” Raphael, 1518

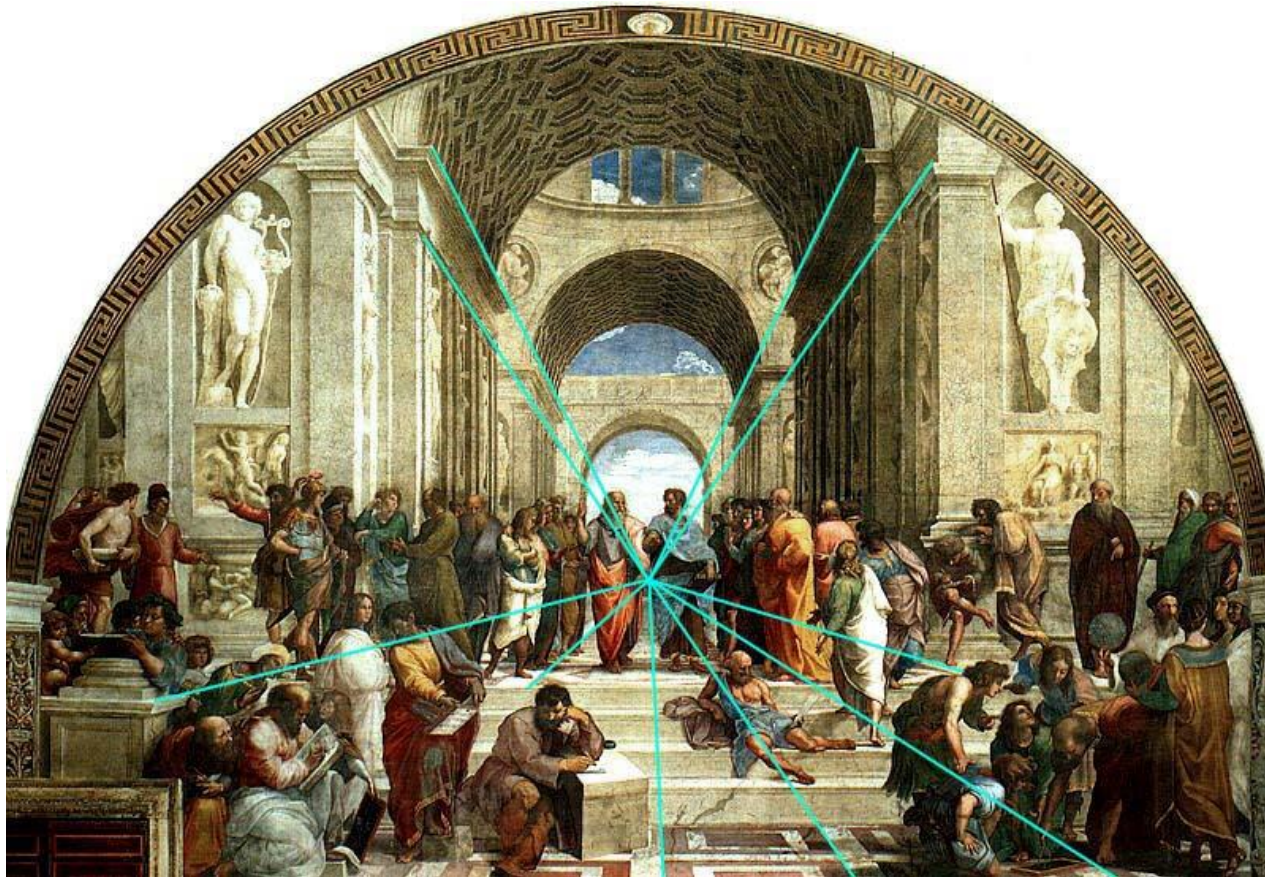
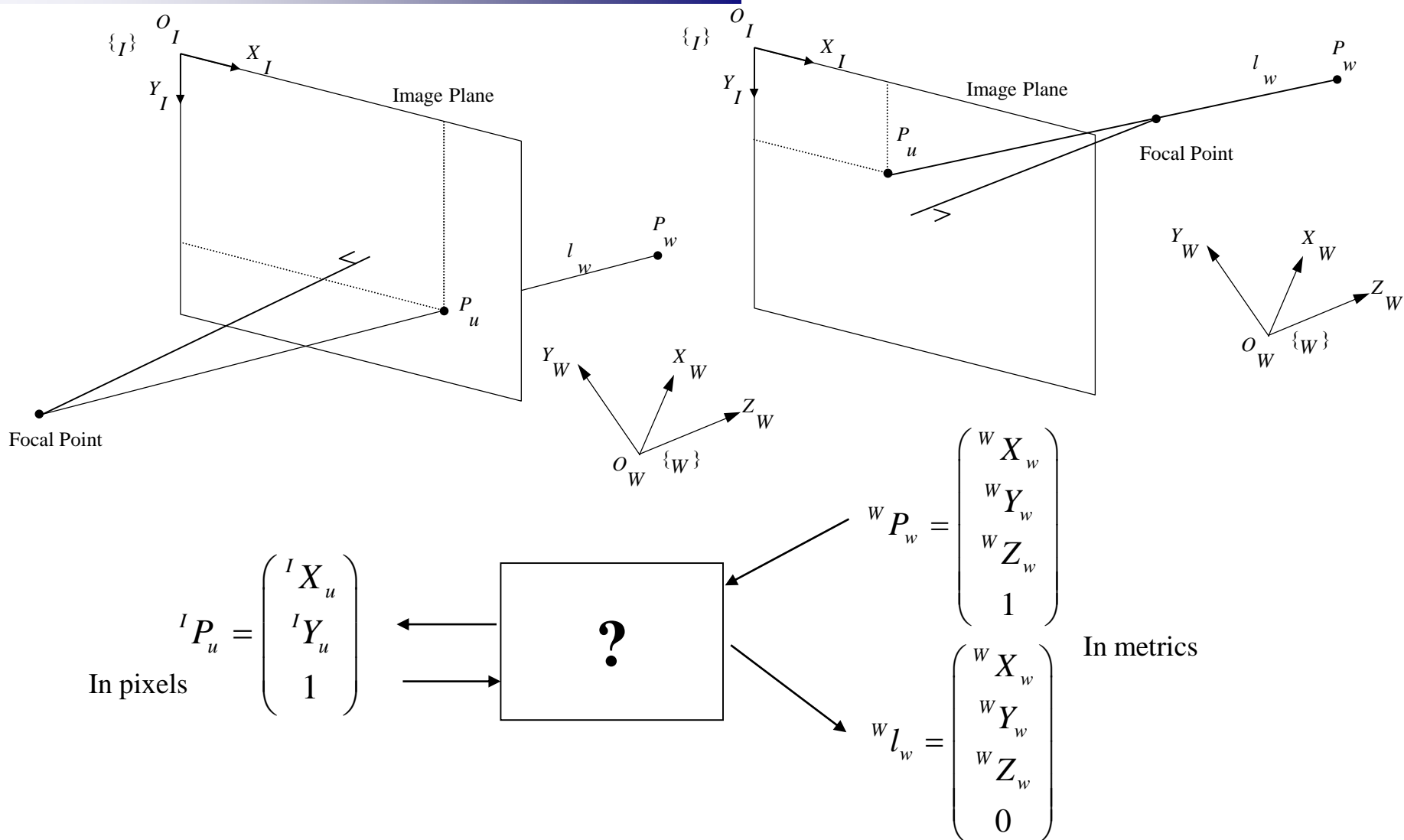


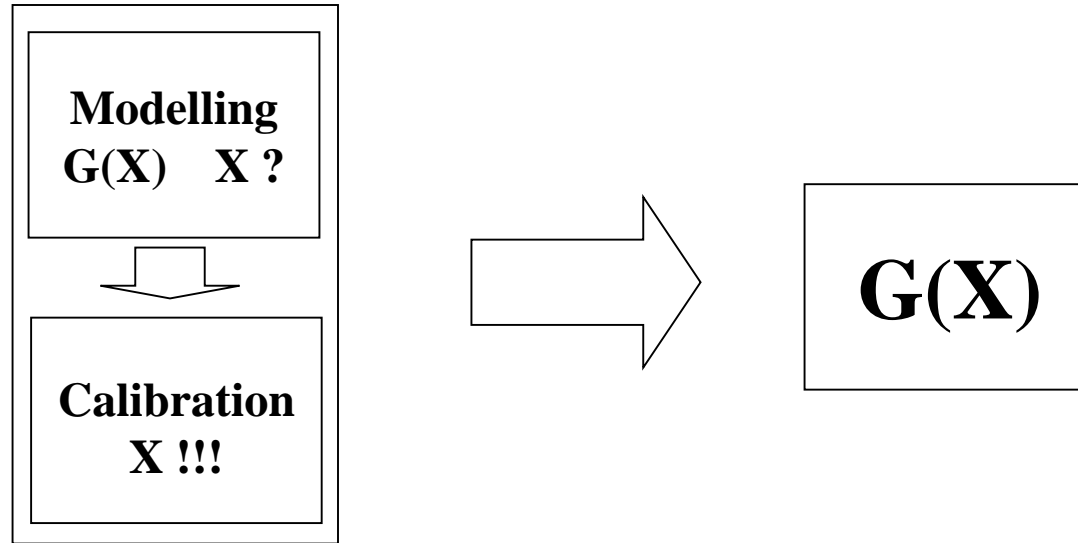
Image courtesy of C. Taylor

# 2.1 Calibration Introduction





## 2.1 Calibration Introduction



### Modelling:

- Determine the equation that approximates the camera behaviour.
- Define the set of unknowns in the equation (camera parameters).
- The camera model is an approximation of the physics & optics of the camera.

### Calibration:

- Get the numeric value of every camera parameter.

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## 2. Camera Calibration

2.1 Calibration introduction

**2.2 The pinhole model**

2.3 The method of Hall

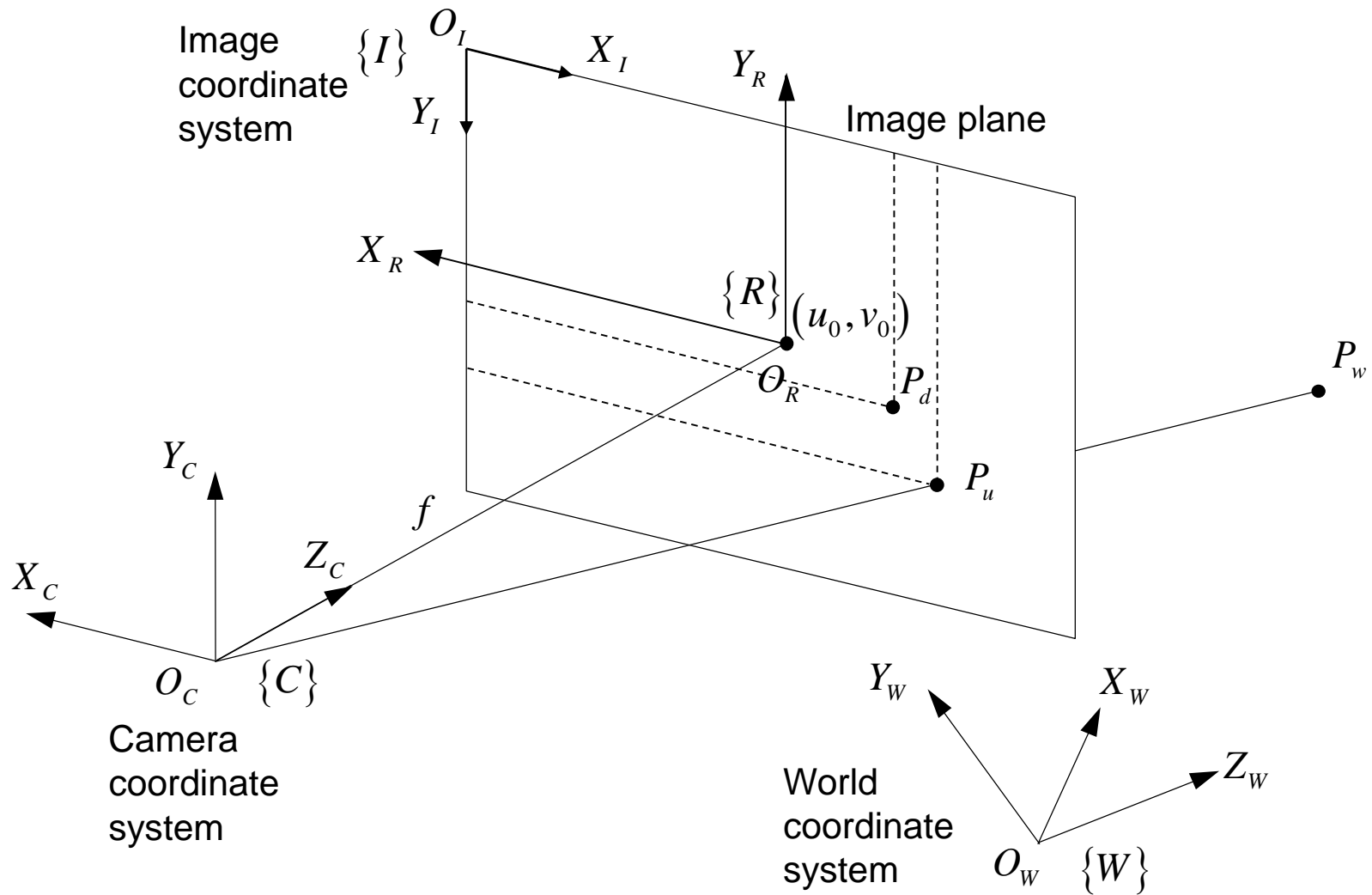
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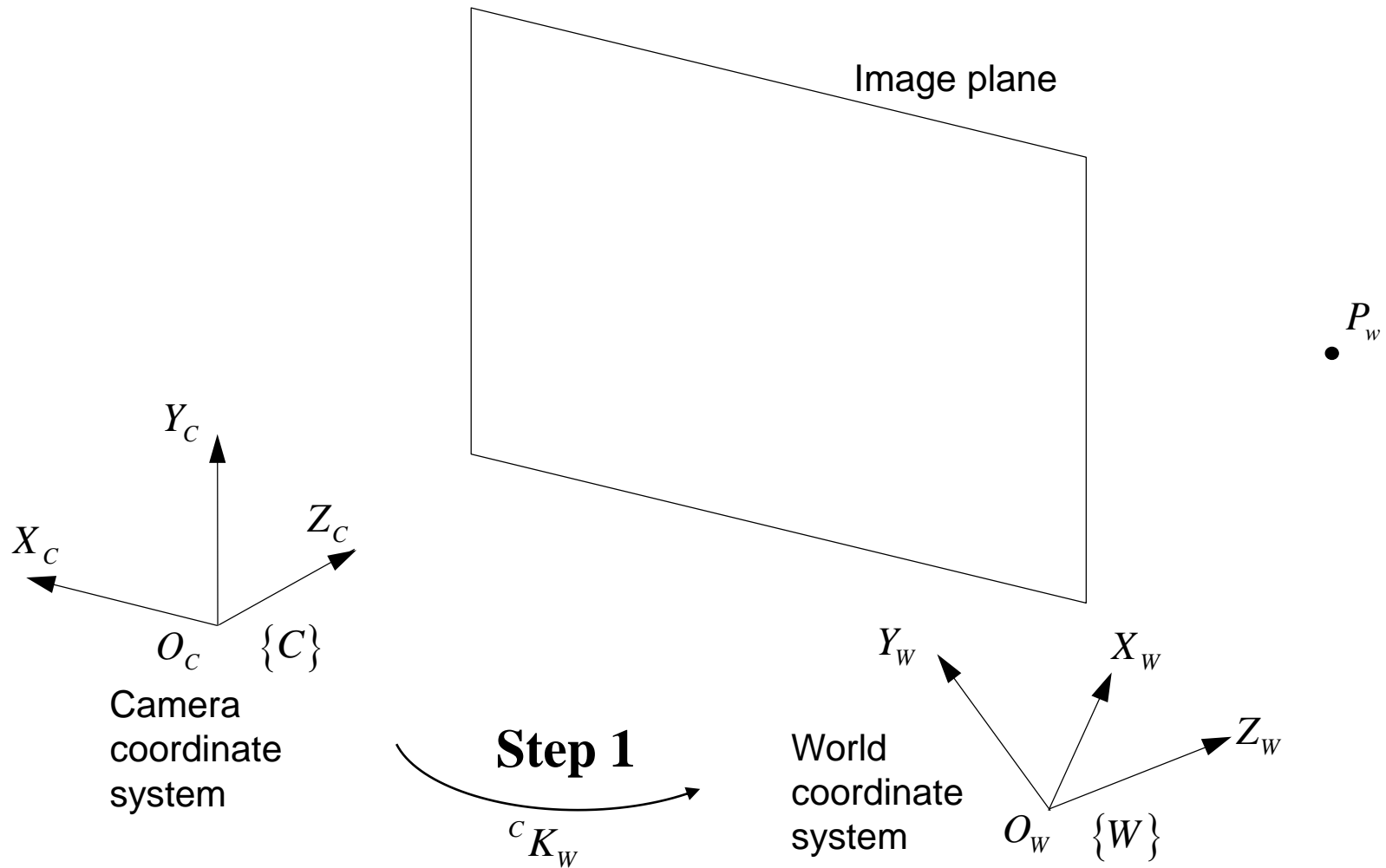
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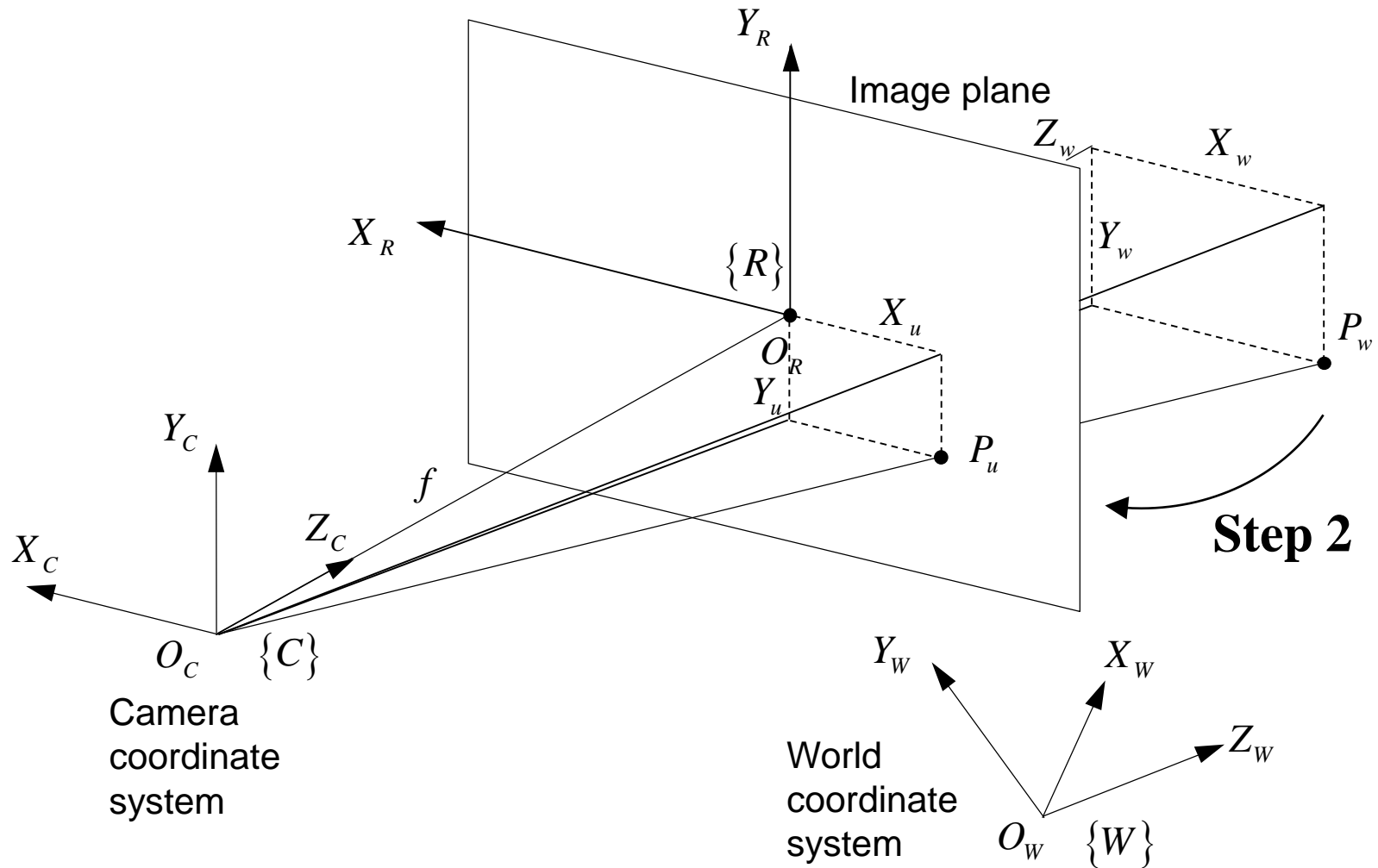
## 2.2 Pinhole Model



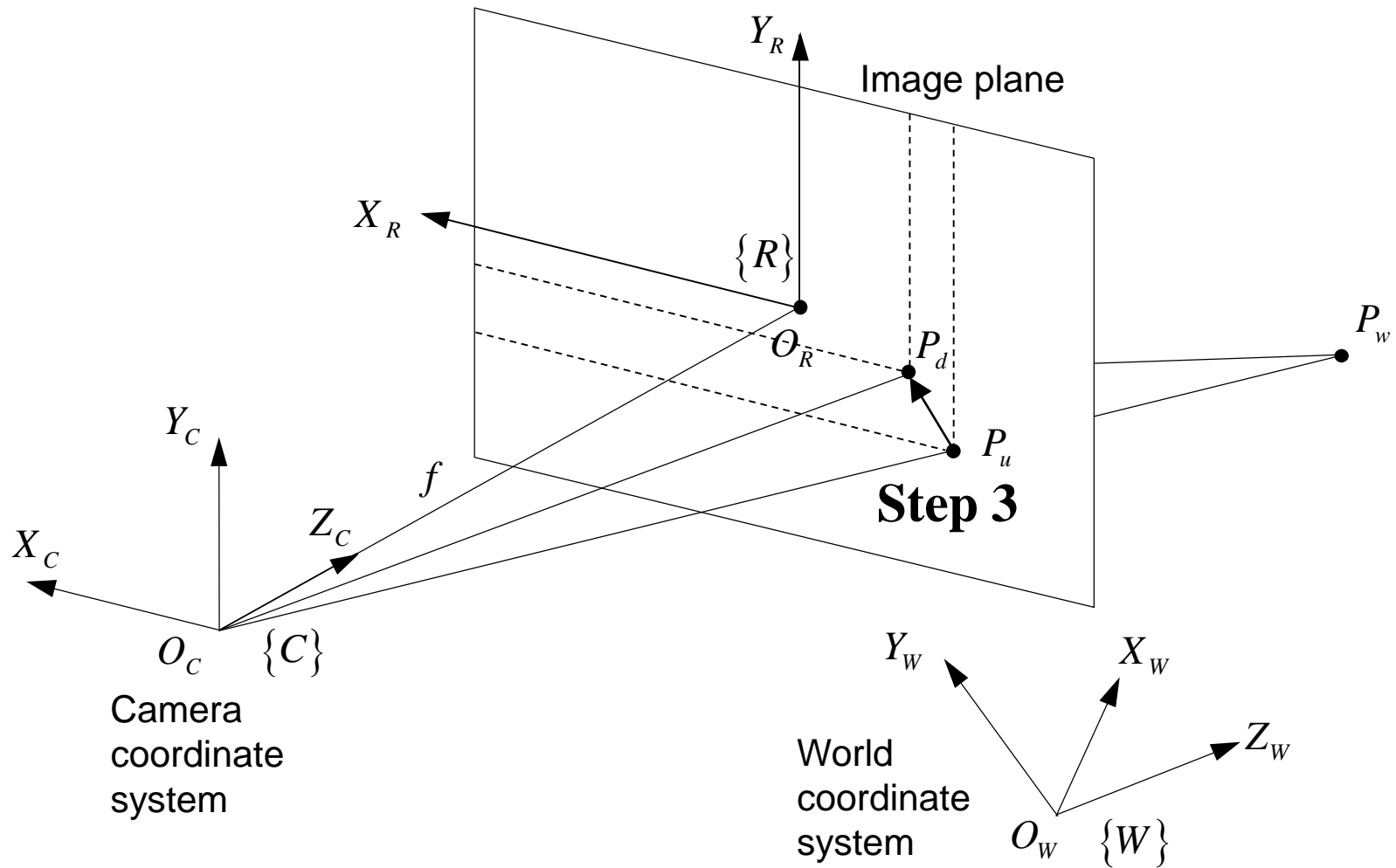
## 2.2 Pinhole Model (Step 1: World to Camera)



## 2.2 Pinhole Model (Step 2: Projection)

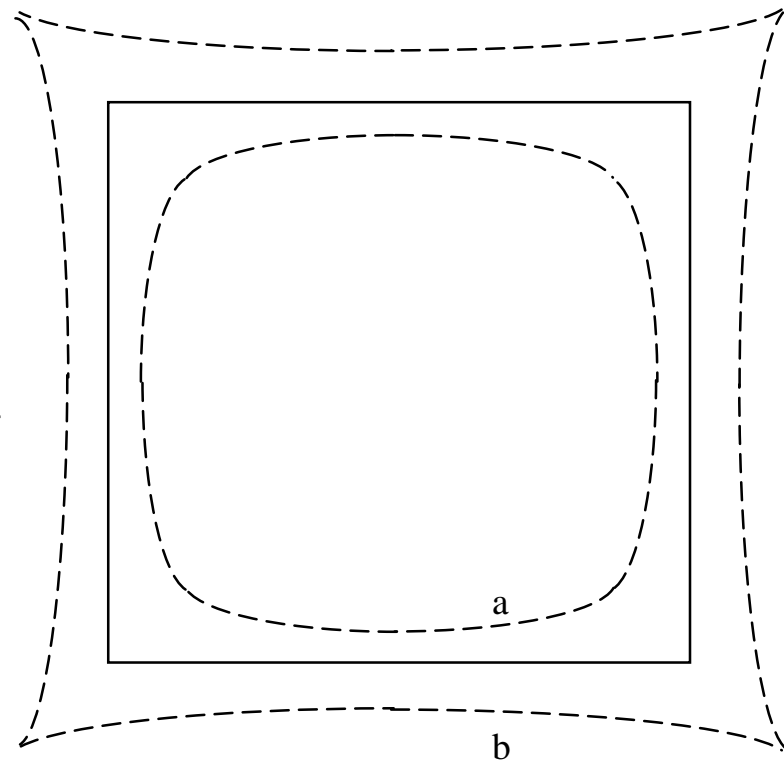
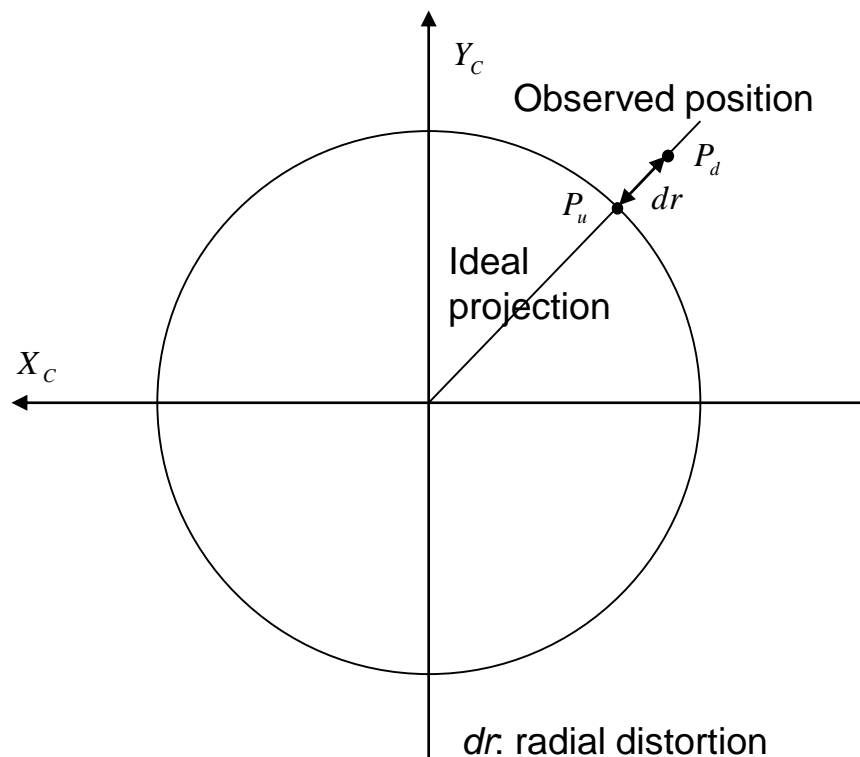


## 2.2 Pinhole Model (Step 3: Lens Distortion)



## 2.2 Pinhole Model (Step 3: Lens Distortion)

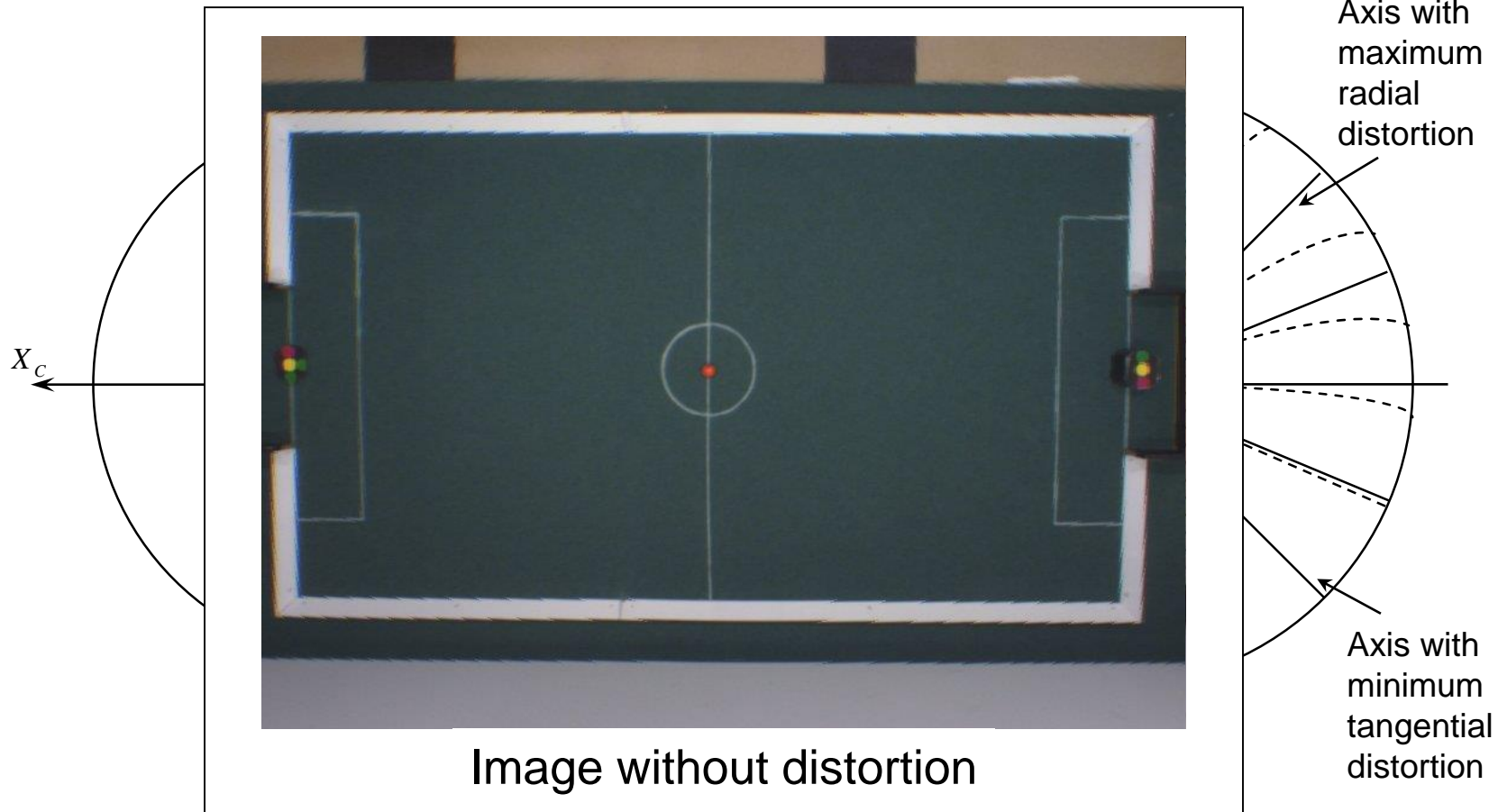
### Radial Distortion



Radial distortion effect (a: negative, b: positive)

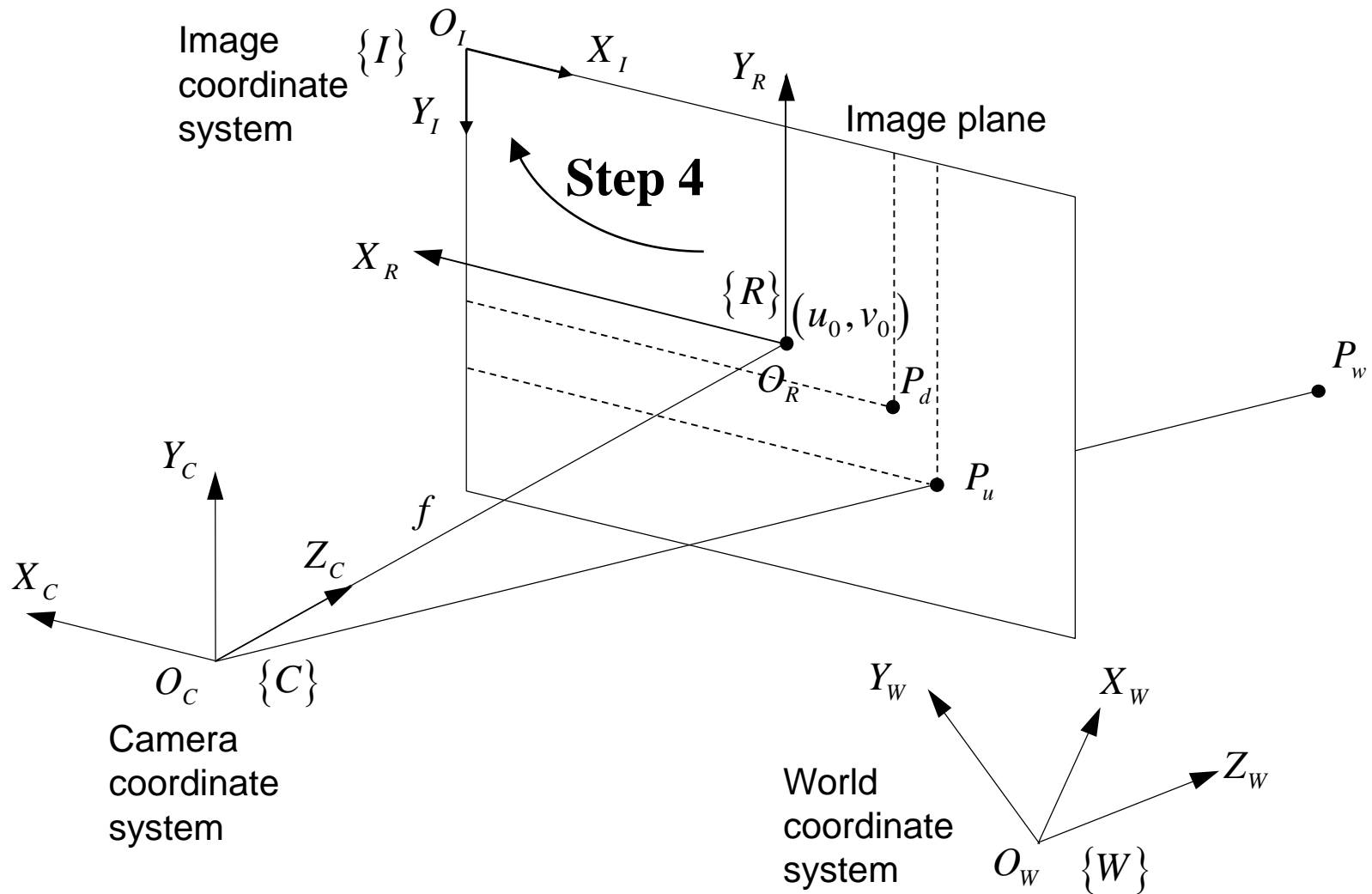
## 2.2 Pinhole Model (Step 3: Lens Distortion)

### Radial and Tangential Distortion

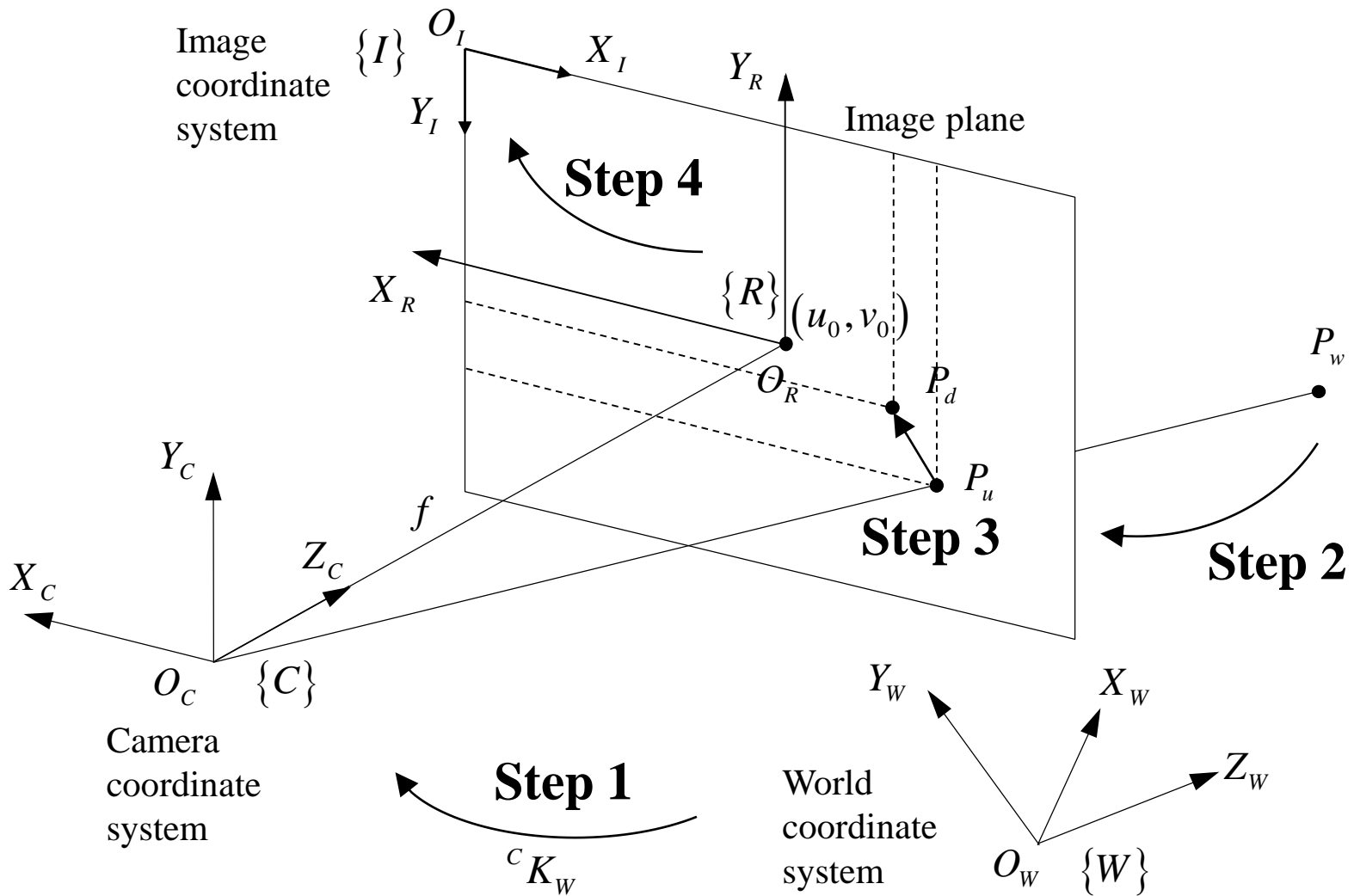




## 2.2 Pinhole Model (Step 4: Camera to Image)



# 2.2 Pinhole Model



## 2.2 Calibration Methods (I)

- Method of Hall
  - Lineal method
  - Transformation matrix
- Method of Faugeras-Toscani
  - Lineal method
  - Obtaining camera parameters
- Method of Faugeras-Toscani with distortion
  - Iterative method
  - Radial distortion
- Method of Tsai
  - Iterative method
  - Radial distortion
  - Focal distance estimation
- Method of Weng
  - Iterative method
  - Radial and tangential distortion
- ... and many more

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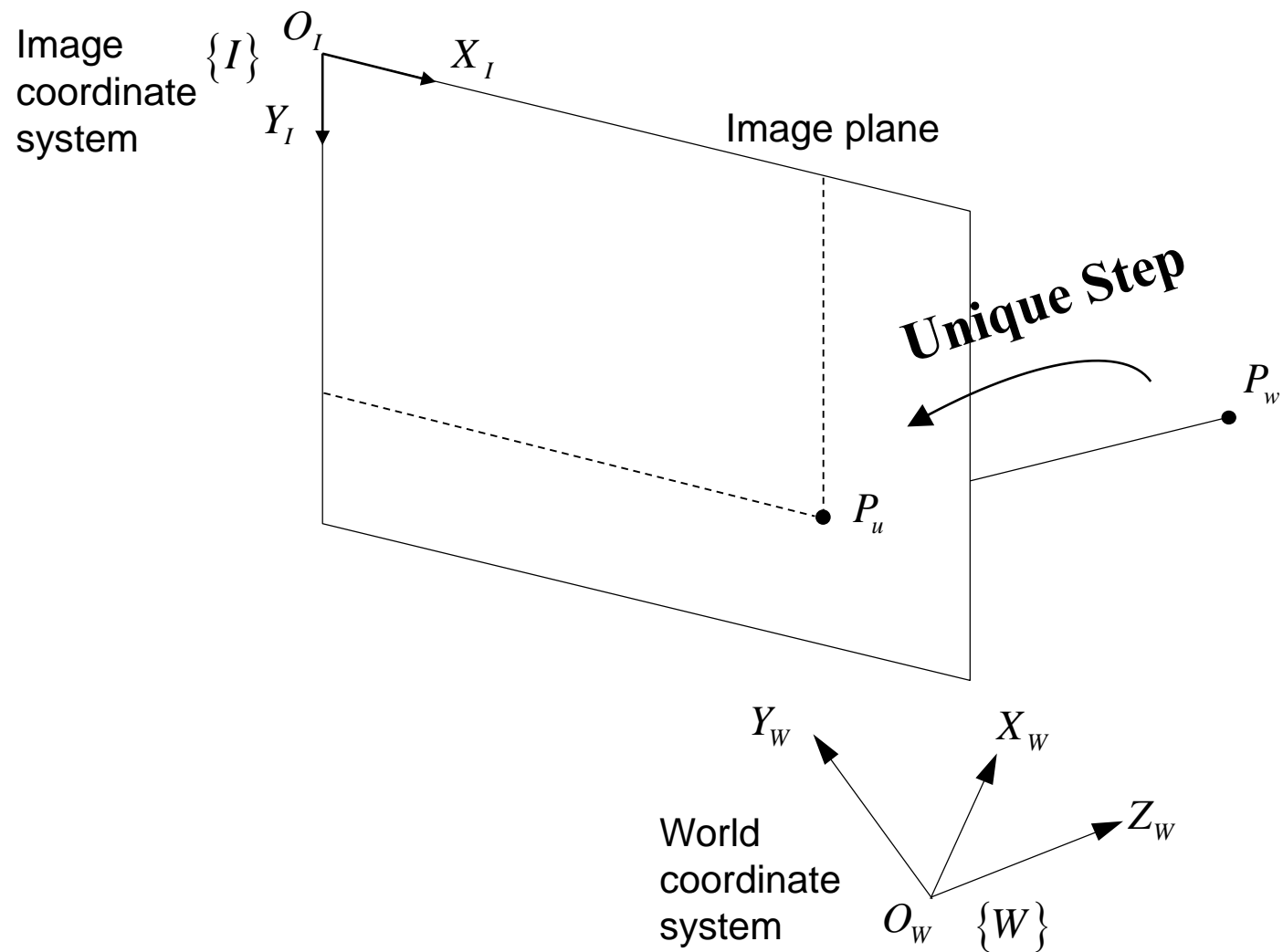
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## 2.3 The Method of Hall

- Method of Hall
  - Lineal method
  - Transformation matrix
- Method of Faugeras-Toscani
  - Lineal method
  - Obtaining camera parameters
- Method of Faugeras-Toscani with distortion
  - Iterative method
  - Radial distortion
- Method of Tsai
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  - Radial distortion
  - Focal distance estimation
- Method of Weng
  - Iterative method
  - Radial and tangential distortion
- ... and many more

## 2.3 The Method of Hall - Modelling





## 2.3 The Method of Hall - Modelling

Assume light is captured on the image plane by a linear projection

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

The matrix is defined up to a scale factor → Multiple Solutions

A component is fixed to the unity → Unique Solution

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

## 2.3 The Method of Hall - Calibration

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

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

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

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

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

## 2.3 The Method of Hall - Calibration

$$\begin{aligned}
 A_{11} {}^W X_w - A_{31} {}^I X_u {}^W X_w + A_{12} {}^W Y_w - A_{32} {}^I X_u {}^W Y_w + A_{13} {}^W Z_w - A_{33} {}^I X_u {}^W Z_w + A_{14} &= {}^I X_u \\
 A_{21} {}^W X_w - A_{31} {}^I Y_u {}^W X_w + A_{22} {}^W Y_w - A_{32} {}^I Y_u {}^W Y_w + A_{23} {}^W Z_w - A_{33} {}^I Y_u {}^W Z_w + A_{24} &= {}^I Y_u \\
 A &= (A_{11} \quad A_{12} \quad A_{13} \quad A_{14} \quad A_{21} \quad A_{22} \quad A_{23} \quad A_{24} \quad A_{31} \quad A_{32} \quad A_{33})^T
 \end{aligned}$$

Obtaining 11 unknowns and each 2D point gives two equations

So, at least 6 points are needed. More points leads to a more accurate solution.

$$QA = B$$

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

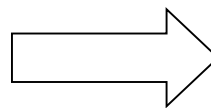
$$Q_{2i} = \begin{pmatrix} 0 & 0 & 0 & 0 & {}^W X_{wi} & {}^W Y_{wi} & {}^W Z_{wi} & 1 & -{}^I Y_{ui} {}^W X_{wi} & -{}^I Y_{ui} {}^W Y_{wi} & -{}^I Y_{ui} {}^W Z_{wi} \end{pmatrix}$$

$$B_{2i-1} = ({}^I X_{ui})$$

$$B_{2i} = ({}^I Y_{ui})$$

Pseudoinverse leads to a unique solution:

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



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

## 2.3 The Method of Hall - Calibration

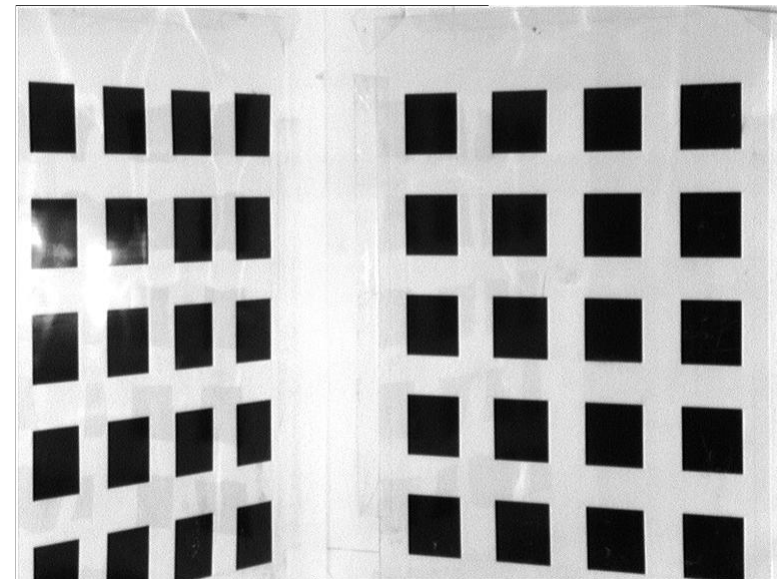
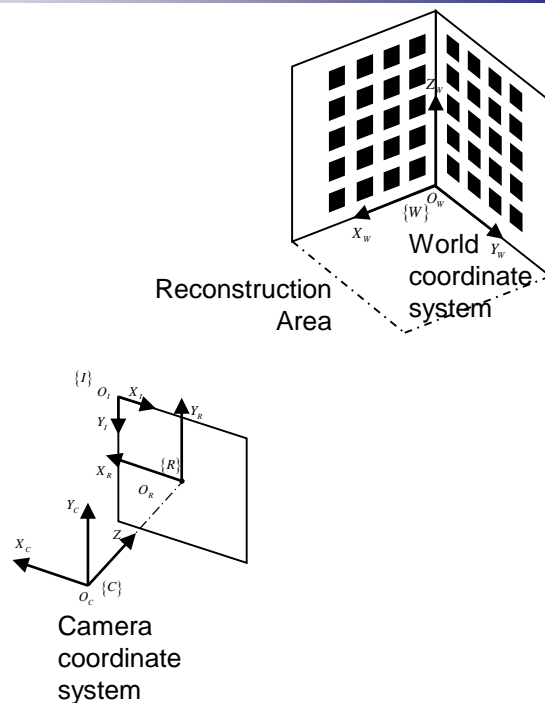


Image of the calibrating pattern

$$Q_{2i-1} = \begin{pmatrix} {}^wX_{wi} & {}^wY_{wi} & {}^wZ_{wi} & 1 & 0 & 0 & 0 & 0 & -{}^IX_{ui} {}^wX_{wi} & -{}^IX_{ui} {}^wY_{wi} & -{}^IX_{ui} {}^wZ_{wi} \end{pmatrix}$$

$$Q_{2i} = \begin{pmatrix} 0 & 0 & 0 & 0 & {}^wX_{wi} & {}^wY_{wi} & {}^wZ_{wi} & 1 & -{}^IY_{ui} {}^wX_{wi} & -{}^IY_{ui} {}^wY_{wi} & -{}^IY_{ui} {}^wZ_{wi} \end{pmatrix}$$

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

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

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