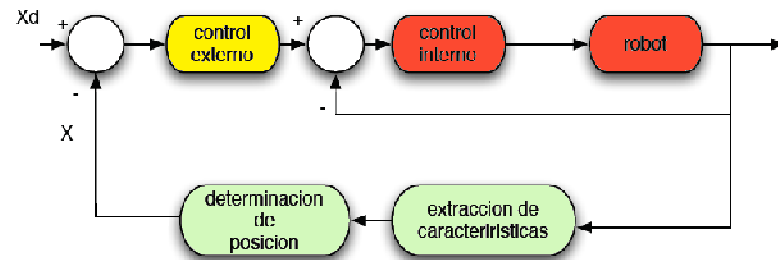
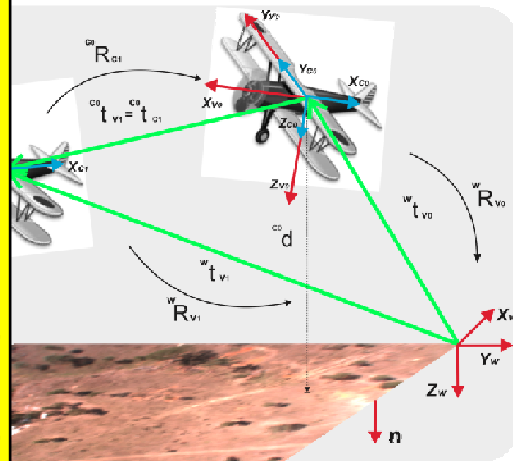


Curso: Técnicas Avanzadas de Visión por Computador
Máster Automática y Robótica

Pose Estimation and Position Based Visual Servoing



Carol Martínez
May 2011

OUTLINE

- Introduction
- Position Based Visual Servoing PBVS
- Pose estimation techniques
- Results
- Summary
- References

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INTRODUCTION

and follow the car with one of the **ROBOTS** we have (ground or



o control,
oing:
of computer
to control the
robot

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INTRODUCTION

and follow the car with one of the **ROBOTS** we have (ground or



Give the task we need: detection, segmentation, tracking, alignment-visual servoing.

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INTRODUCTION

and follow the car with one of the **ROBOTS** we have (ground or



For the task we need:

- **Robust perception**
- **Robust control**

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Perceptual Robustness

... configuration static or moving
... of cameras
... ions issues
... processing techniques

... g to
... na and G. Hager, Incremental focus of attention for
... sual tracking, CVPR 1996

... is the **ability of a vision-based tracking system to track accurately and**
... ing or after visual **circumstances that are less than ideal**. ... The robust vision-
... ng problem is therefore a vision-based tracking sub-problem – the problem of
... a **complex environment**

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Vision system requirements

ing temporal inconsistencies in appearance and **occlusions** of
get object

ing situations when the object is **outside of the FOV**
(realization)

to unpredictable object motion

sensitive to **lighting conditions** and specular reflections

to errors (in tracking or detection) and **to recover** the tracking
wards

ce estimates in **Real-Time**

minimum a-priori knowledge about the object

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Lack of robustness due to

ground segmentation
of the target or
on of tracking

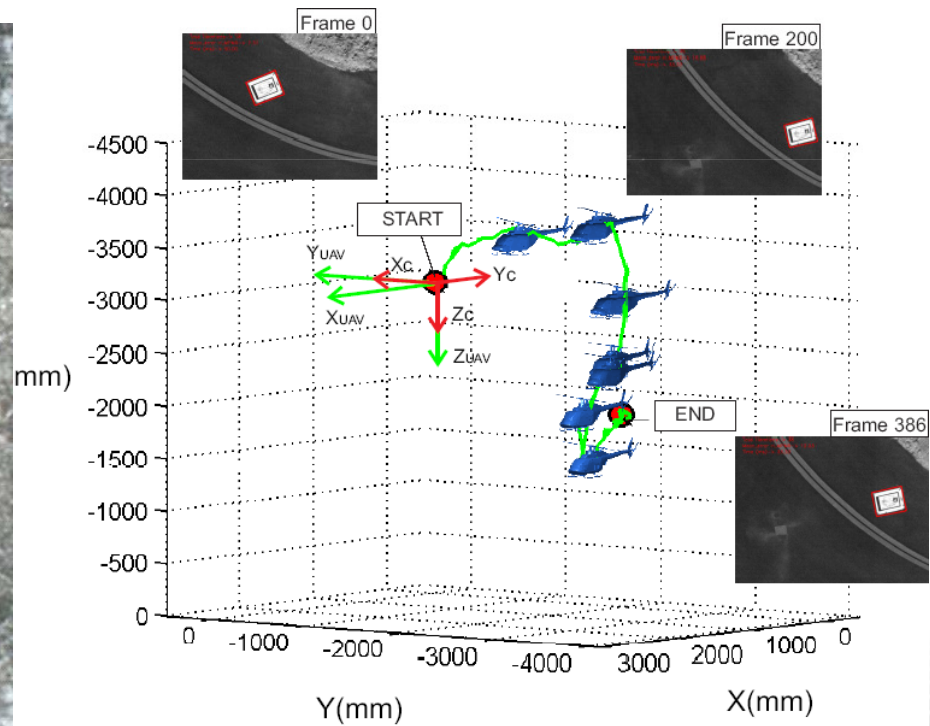
ing across images (in
in the presence of large
ng inter-frame motions)



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Lack of robustness due to

inadequate modeling of motion (to enable prediction of the new images)



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Lack of robustness due to

inadequate modeling of motion (to enable prediction of the new images)



4 parameters (Tx, Ty, Rz, scale)



3 parameters (Tx, Ty, Rz)

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However ...

There have been successful works using vision for controlling purpose



cameras: monocular or stereo

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However ...

There have been successful works using vision for controlling purpose

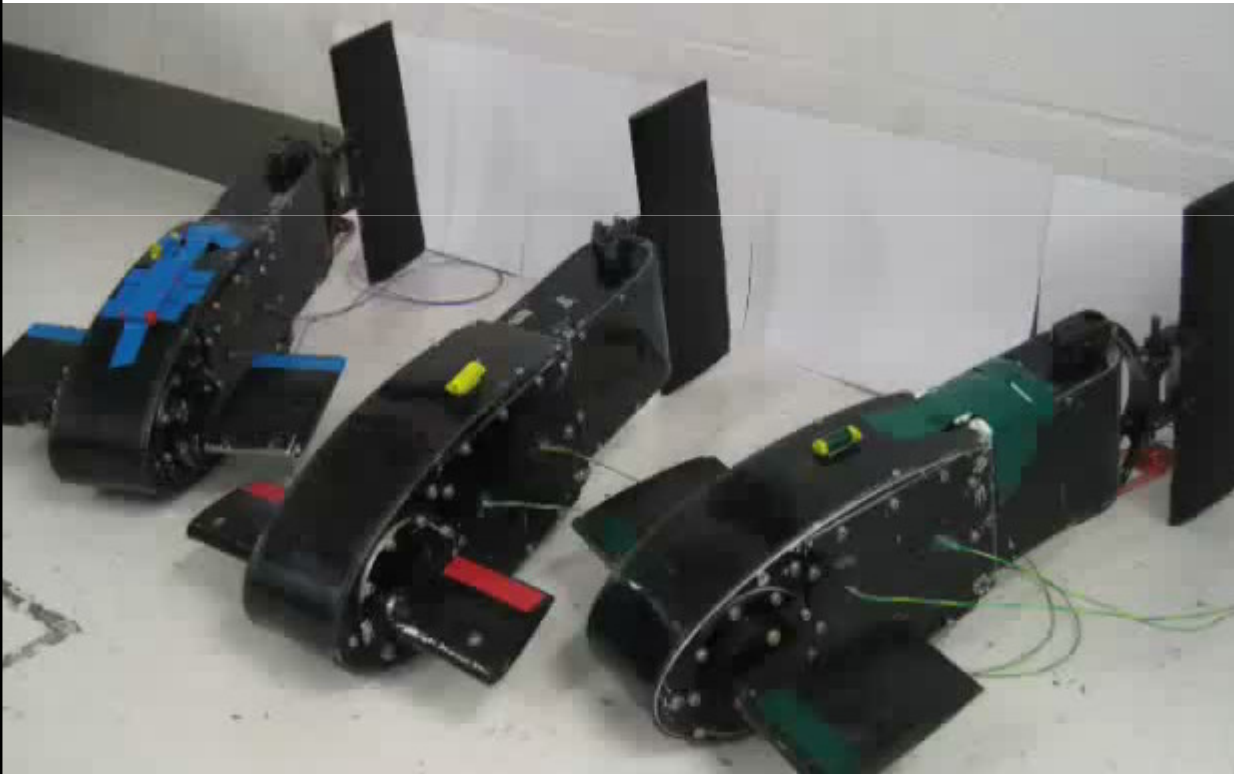


camera: monocular

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However ...

There have been successful works using vision for controlling purpose

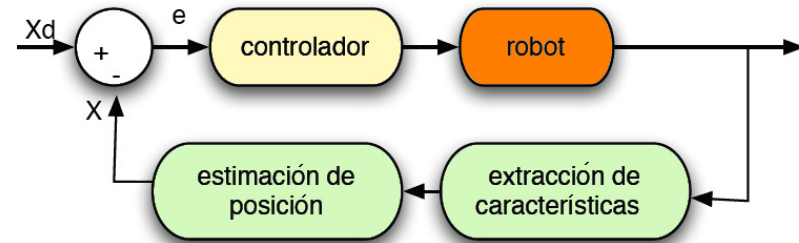


camera system

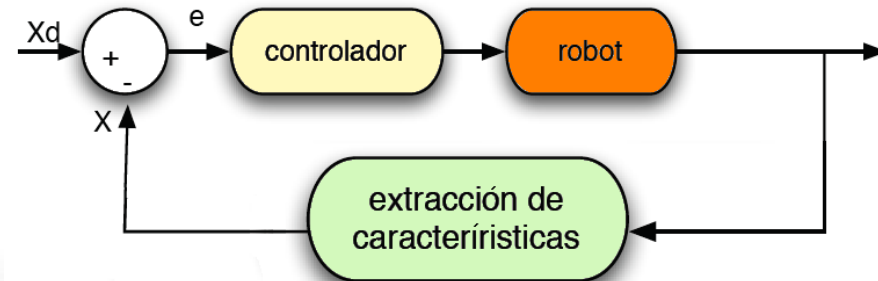
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PBVS

Position Based Visual Servoing PBVS



PBVS



IBVS

Position of visual servoing

is:

Image-Based (IBVS)

Position-Based (PBVS)

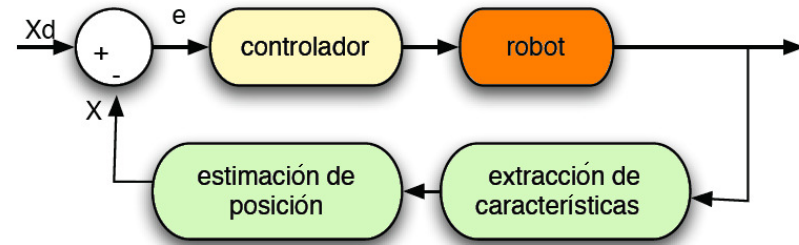
Hybrid approach



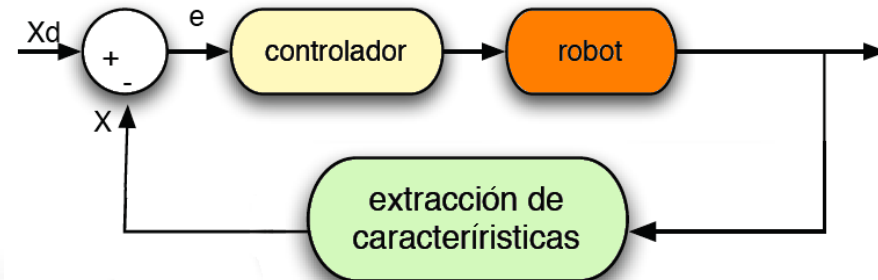
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Position Based Visual Servoing PBVS



PBVS



IBVS

PBVS are different in
of the inputs used in
ctive control schemes

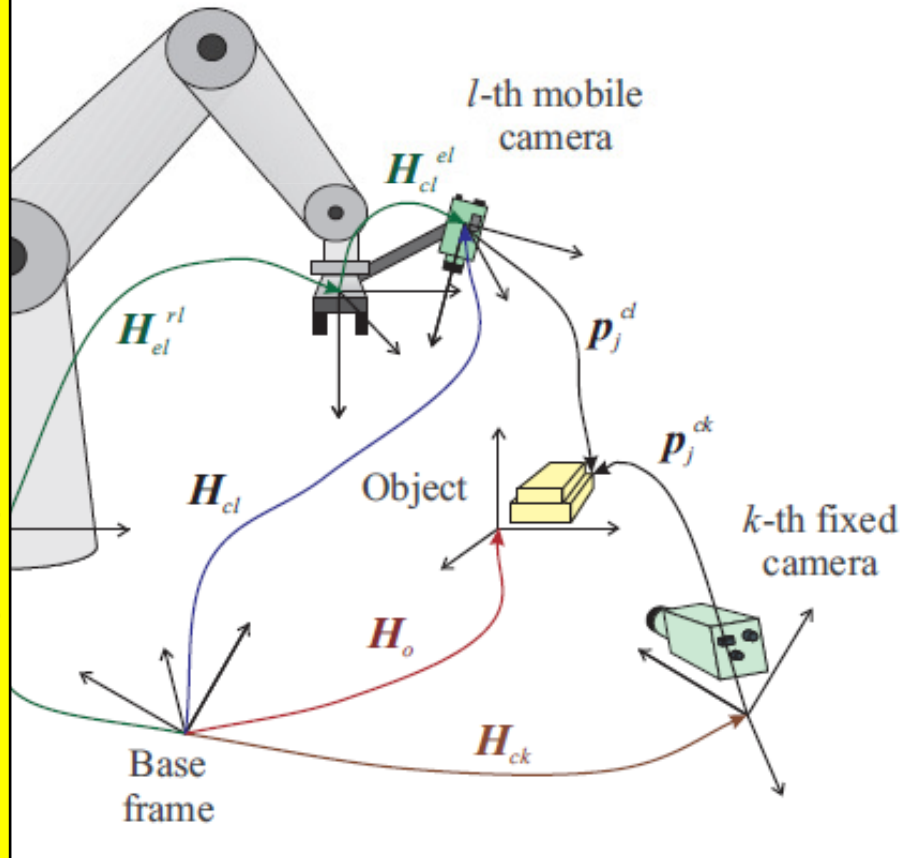
approaches give
tory results:

ence, stability, robust
ra calibration errors,
ements errors.

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Position Based Visual Servoing PBVS

on the camera-robot configuration



- Eye to hand
- Eye in hand
- Hybrid approach

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Position Based Visual Servoing PBVS

on the number of cameras

ar:

lost of information (depth), make the
re complicated.

g tasks look for solving this problem:

minating depth before the tasks, or with metric
mation of the object.

sed with eye in hand configuration”



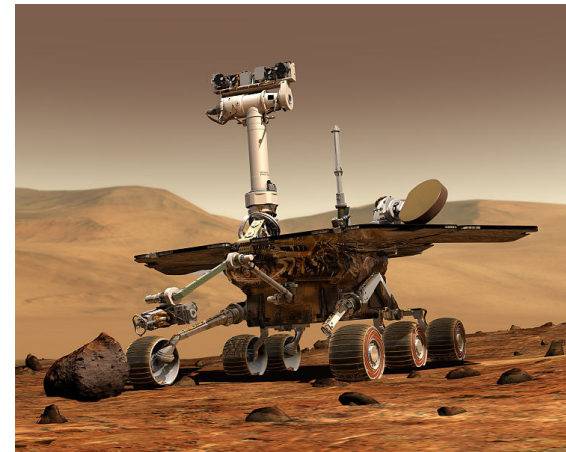
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Position Based Visual Servoing PBVS

on the number of cameras

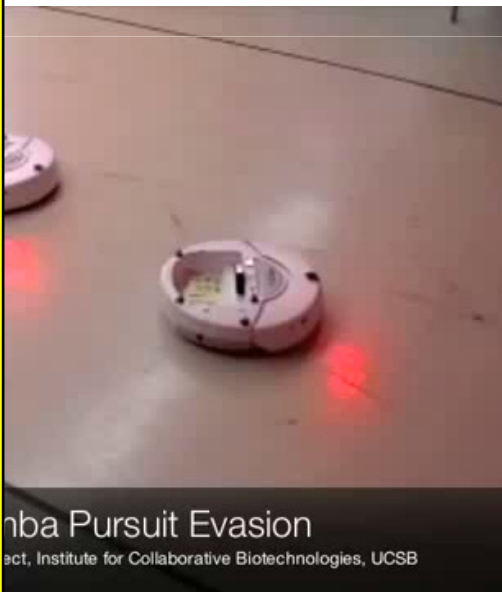
Stereo:

3D information can be obtained



Redundant system:

3D information can be obtained.
Adding robustness.
Processing time increases



Robotic Pursuit Evasion
Project, Institute for Collaborative Biotechnologies, UCSB

Robotic robots try to catch a
controlled evader

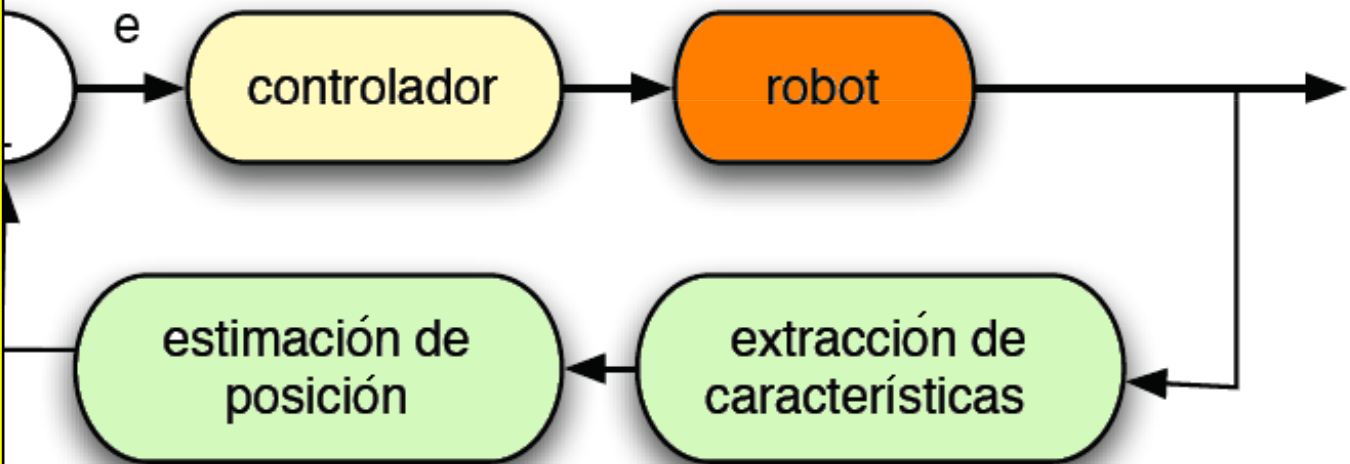
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Position Based Visual Servoing PBVS

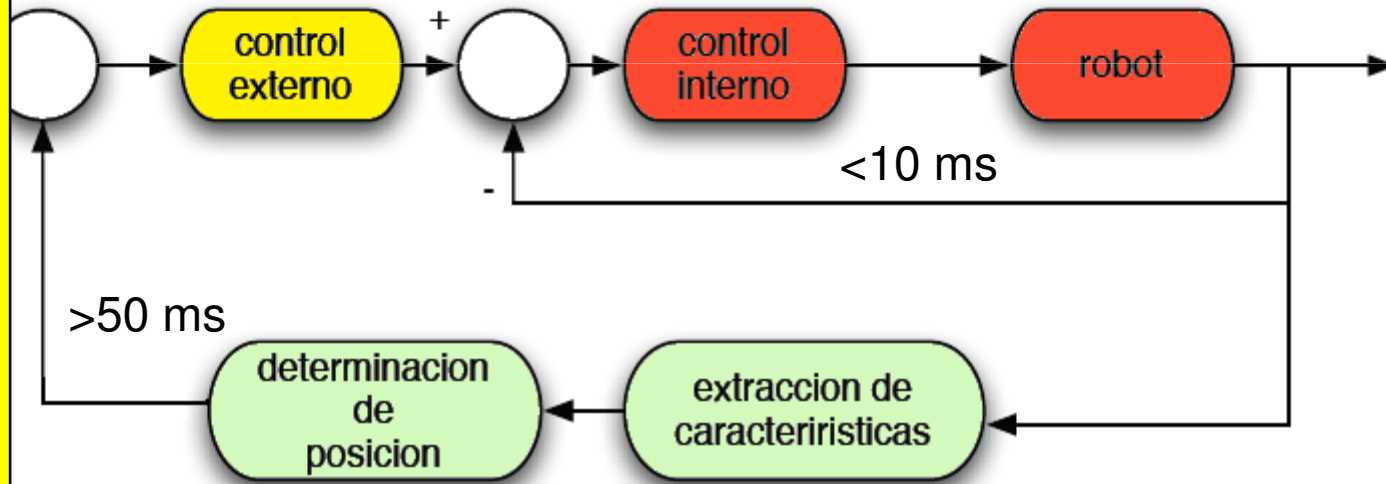
Structure: direct visual control



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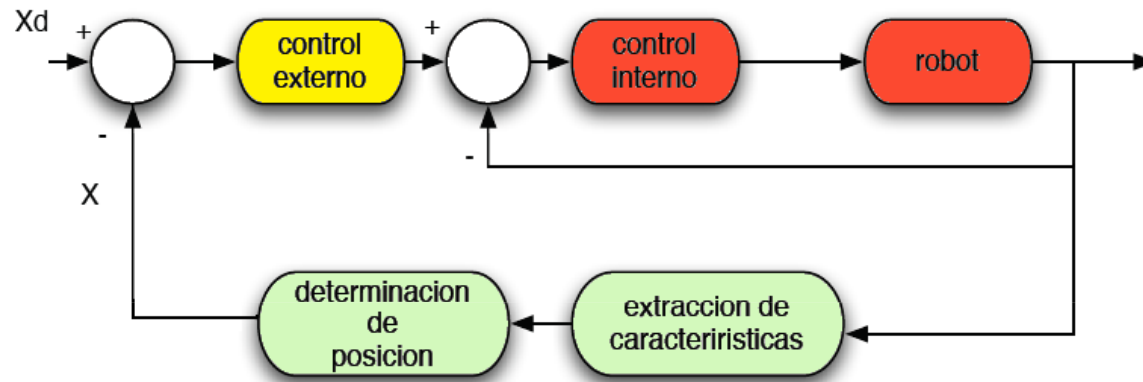
Position Based Visual Servoing PBVS

Structure: indirect visual servoing, dynamic look and move



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Position Based Visual Servoing PBVS



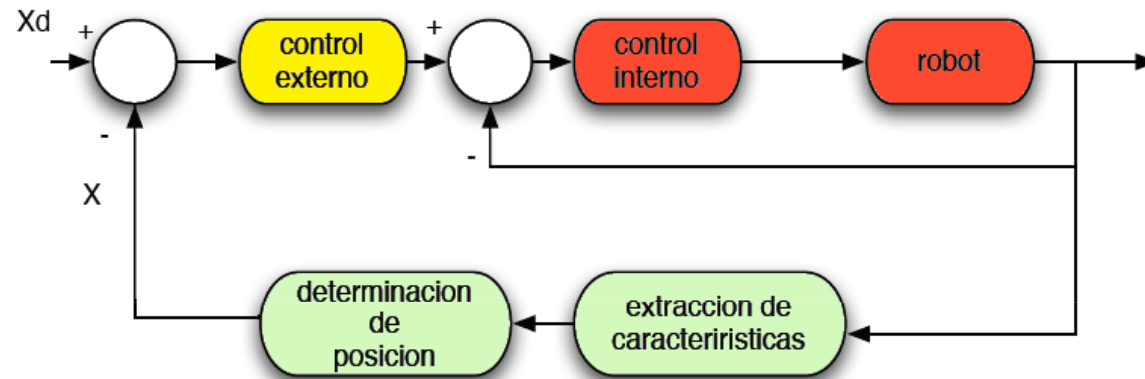
on based on the **3D** cartesian space, It is also called pose-based visual

res are extracted as well, but are additionally used to estimated **3D** (pose of the object in the cartesian space), hence it is servoing in 3D

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Position Based Visual Servoing PBVS

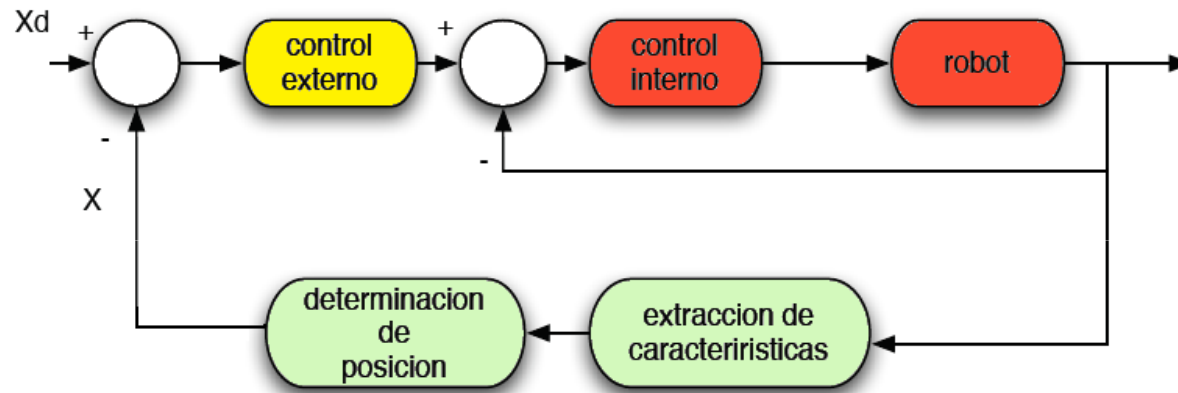


on based on the **3D** cartesian space, It is also called pose-based visual

Features are extracted as well, but are additionally **used to estimated 3D** (pose of the object in the cartesian space), hence it is servoing in 3D

- Geometric models: **required**
- Camera calibration: **required**
- Camera robot transformation: **required**

Position Based Visual Servoing PBVS



There is not direct control in the image plane, the object can go out the field of view of the camera during the control task.

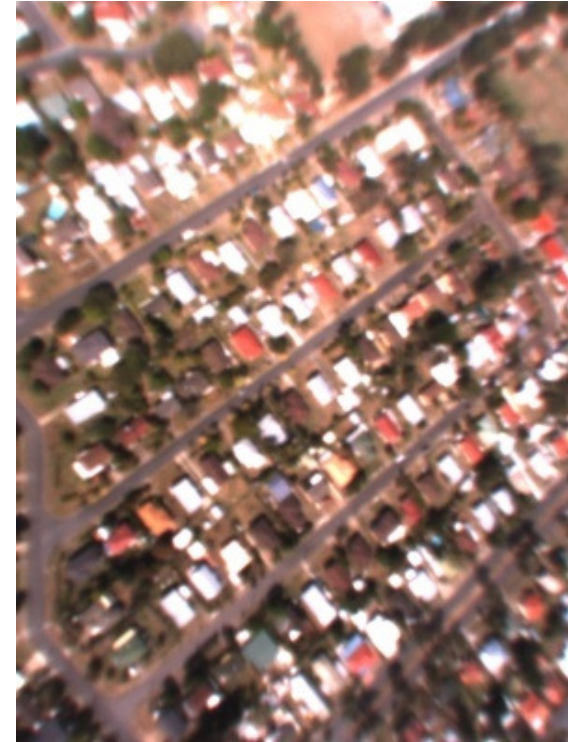
Observing the object and the robot.

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Solving the pose estimation problem

How to recover 6DOF?



estimation using an on-board camera. There is not a specific follow

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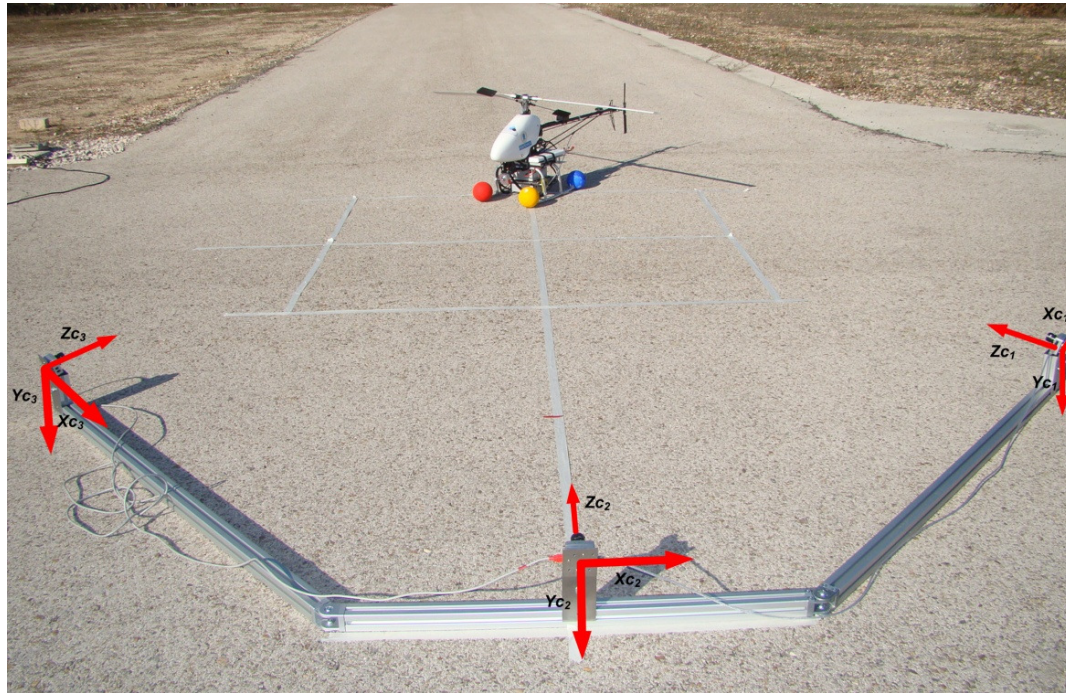
Solving the pose estimation problem



Estimation using an on-board camera. Following a specific

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Solving the pose estimation problem



Estimation using an external camera system.

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Pose estimation Problem

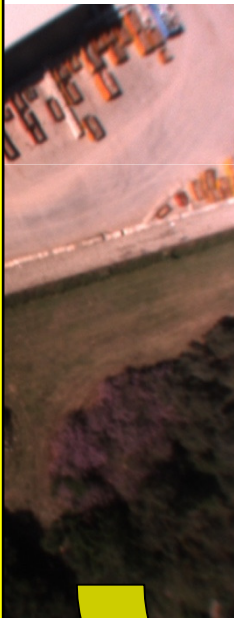
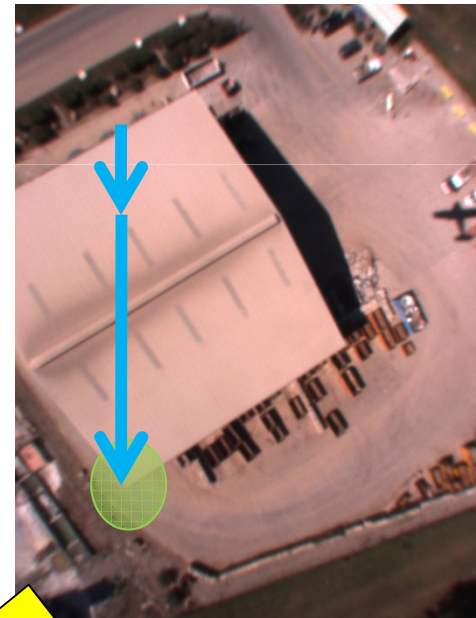


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Pose estimation Problem

flat terrain, dominant movement is due to vehicle movement



R_{tot}/t_{tot}

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Tracking of features

Feature-based

Direct methods

Recovering different motion models:

- Translation
- Rotation
- Scale
- Homography



Frame Motion

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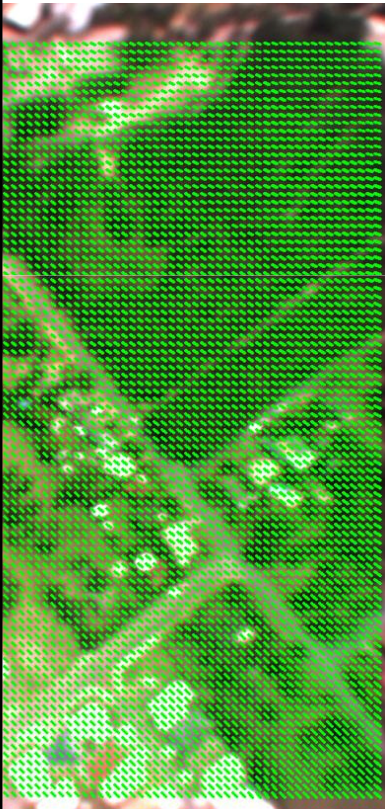
Pose estimation problem

Homography

$$\mathbf{x}' = \begin{bmatrix} 1 + p_1 & p_2 & p_3 \\ p_4 & 1 + p_5 & p_6 \\ p_7 & p_8 & 1 \end{bmatrix} \mathbf{x}$$



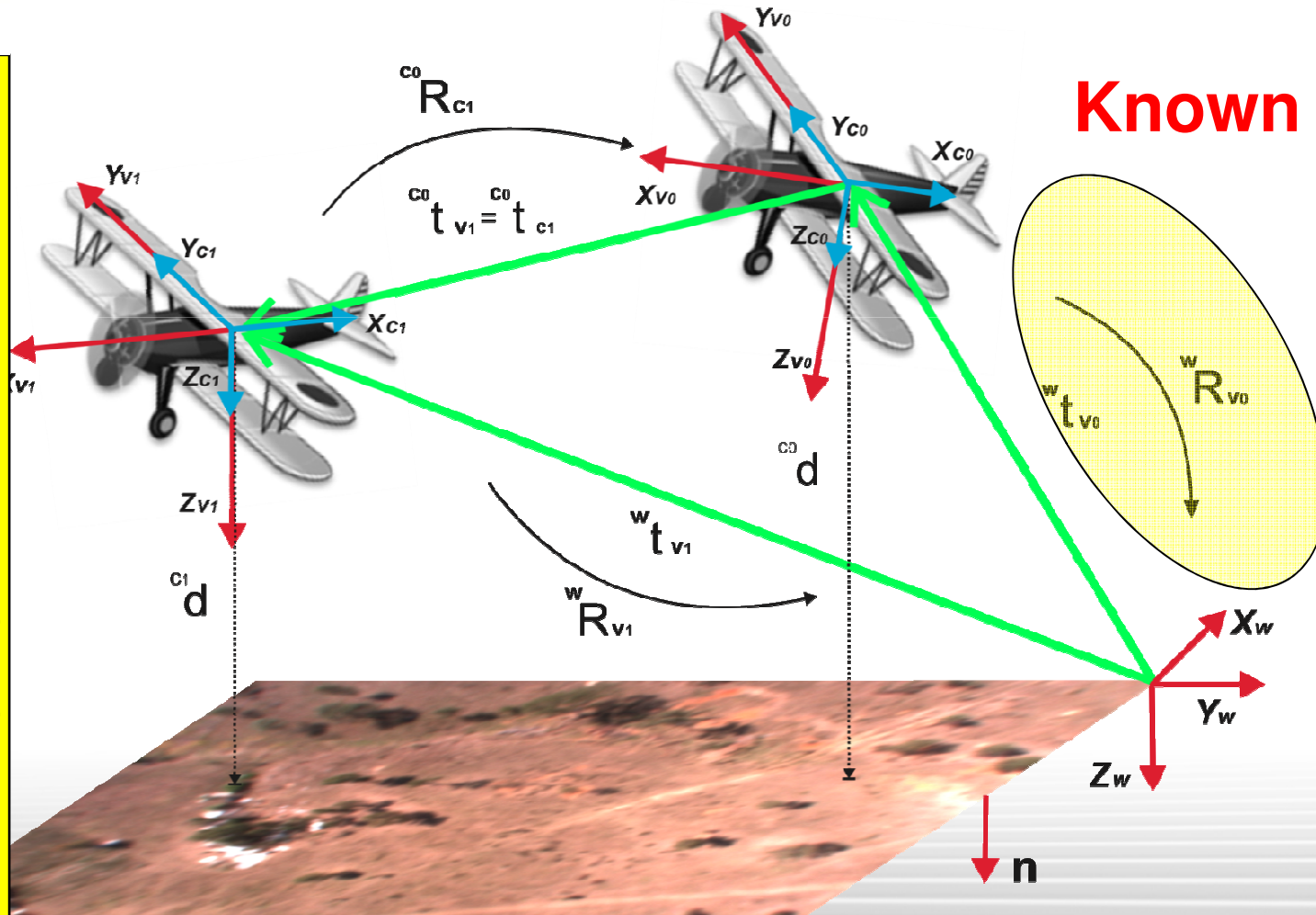
$$\mathbf{H}_e = \mathbf{c}_2 \mathbf{R}_{c_1} + \frac{1}{d} \mathbf{c}_2 \mathbf{t}_{c_1} \mathbf{n}^T$$



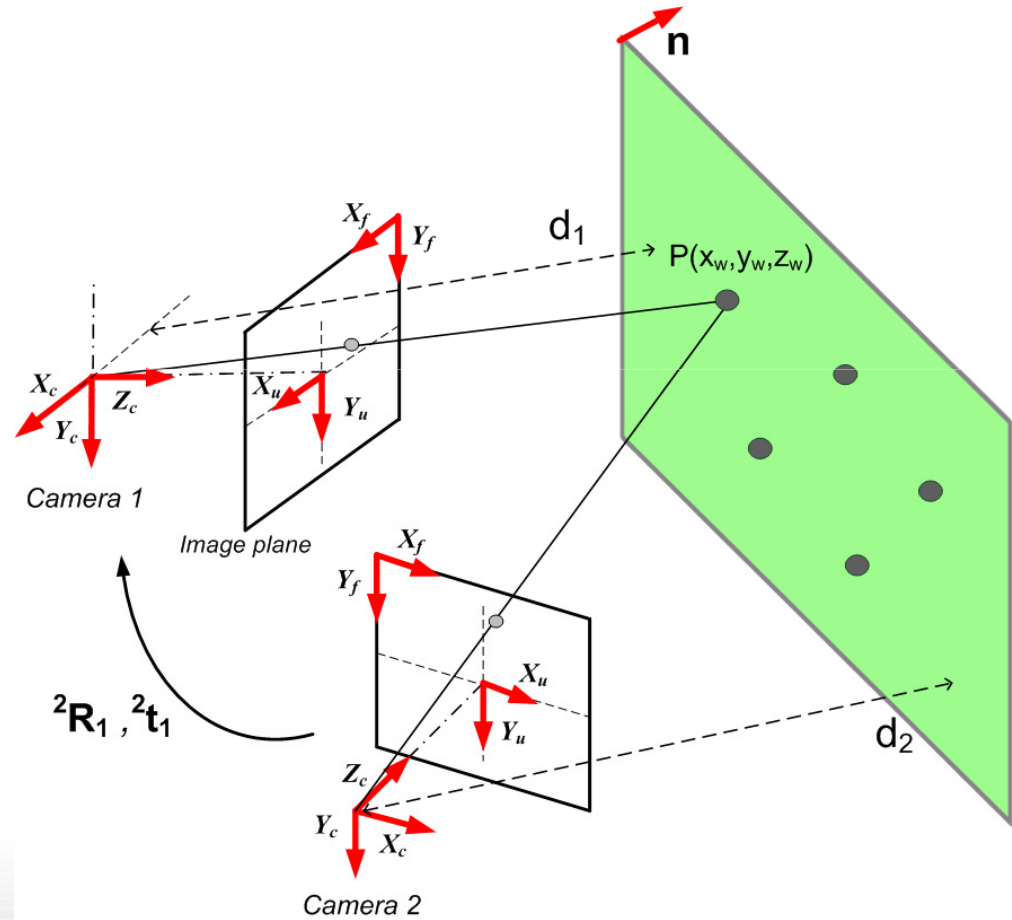
Frame Motion

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Pose estimation problem



Pose estimation problem



$$= M^w X$$

$$\lambda = \frac{Z}{f}$$

transformation

$${}^2R_{c_1} {}^1X + {}^2t_{c_1}$$

$$\left({}^2R_{c_1} + \frac{1}{d} {}^2t_{c_1} n^T \right) {}^1X$$

$${}^2R_{c_1} + \frac{1}{d} {}^2t_{c_1} n^T$$

ame estimation



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Pose Estimation problem: H decomposition

H decomposition: Method in book → “An invitation to 3D vision”

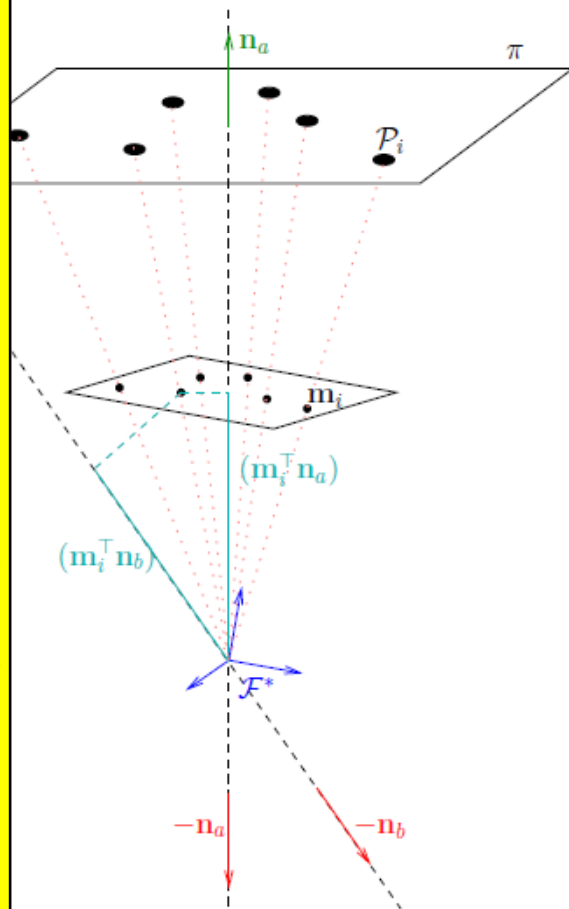
Solution 1	$R_1 = W_1 U_1^T$ $N_1 = \hat{v}_2 u_1$ $\frac{1}{d} T_1 = (H - R_1) N_1$	Solution 3	$R_3 = R_1$ $N_3 = -N_1$ $\frac{1}{d} T_3 = -\frac{1}{d} T_1$
Solution 2	$R_2 = W_2 U_2^T$ $N_2 = \hat{v}_2 u_2$ $\frac{1}{d} T_2 = (H - R_2) N_2$	Solution 4	$R_4 = R_2$ $N_4 = -N_2$ $\frac{1}{d} T_4 = -\frac{1}{d} T_2$

...

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Pose Estimation problem: H decomposition

From 4 solutions to 2: applying visibility constraint



All points seen by the camera must lie in front of it

$$m^* = K^{-1} p^*$$

$$m^{*\top} n^* > 0$$

TWO SOLUTIONS

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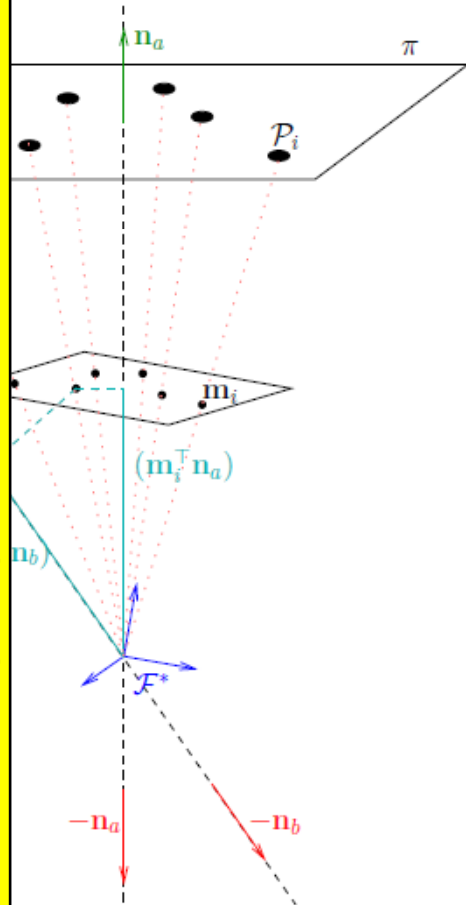
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Estimation problem: H decomposition

From 2 solutions to 1: assuming flat terrain

$$n = [0, 0, 1]$$

one SOLUTION



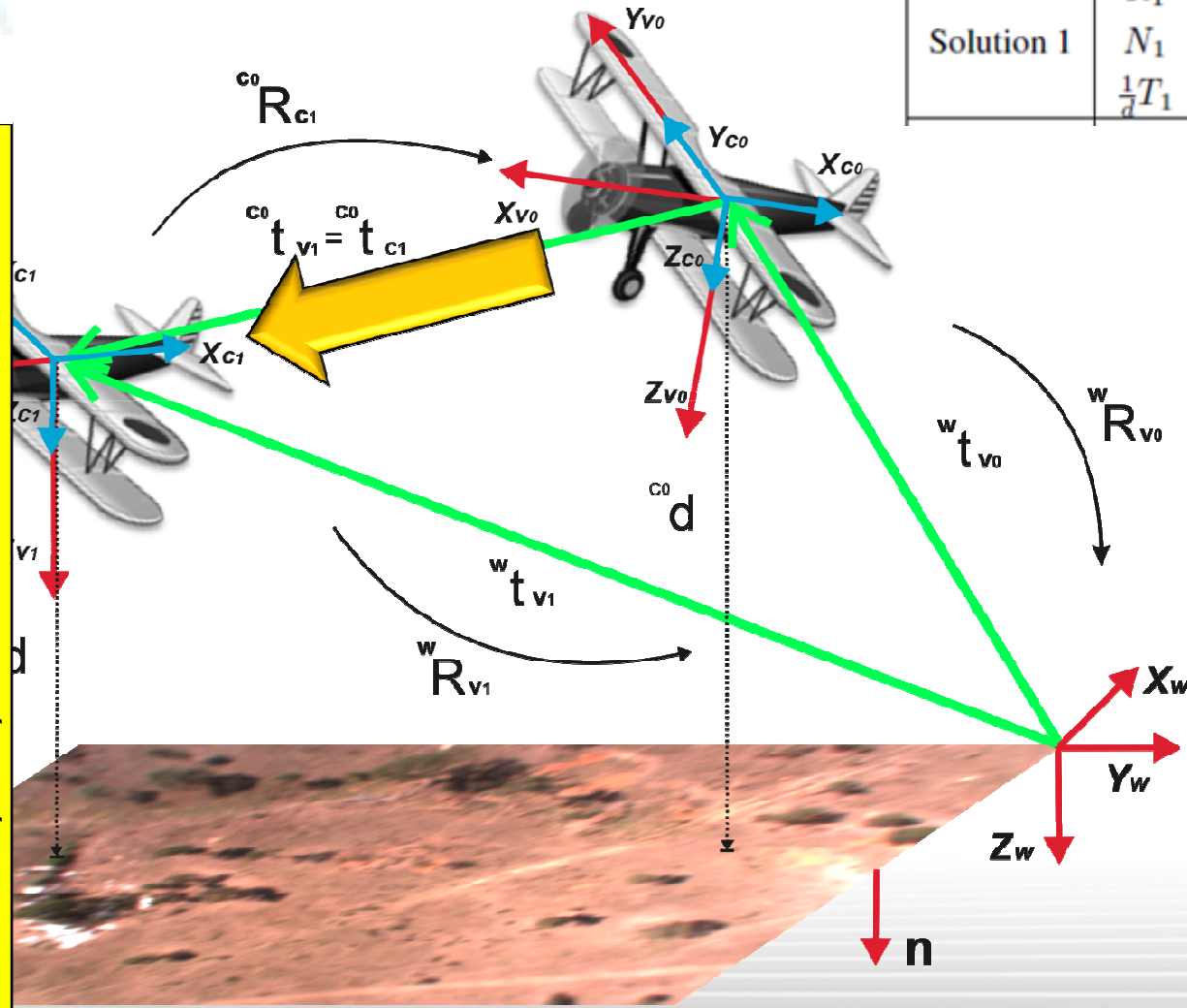
Solution 1	$R_1 = W_1 U_1^T$ $N_1 = \hat{v}_2 u_1$ $\frac{1}{d} T_1 = (H - R_1) N_1$	Solution 3	$R_3 = R_1$ $N_3 = -N_1$ $\frac{1}{d} T_3 = -\frac{1}{d} T_1$
Solution 2	$R_2 = W_2 U_2^T$ $N_2 = \hat{v}_2 u_2$ $\frac{1}{d} T_2 = (H - R_2) N_2$	Solution 4	$R_4 = R_2$ $N_4 = -N_2$ $\frac{1}{d} T_4 = -\frac{1}{d} T_2$

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Pose Estimation

Solution 1	$R_1 = W_1 U_1^T$
	$N_1 = \hat{v}_2 u_1$
	$\frac{1}{d} T_1 = (H - R_1) N_1$



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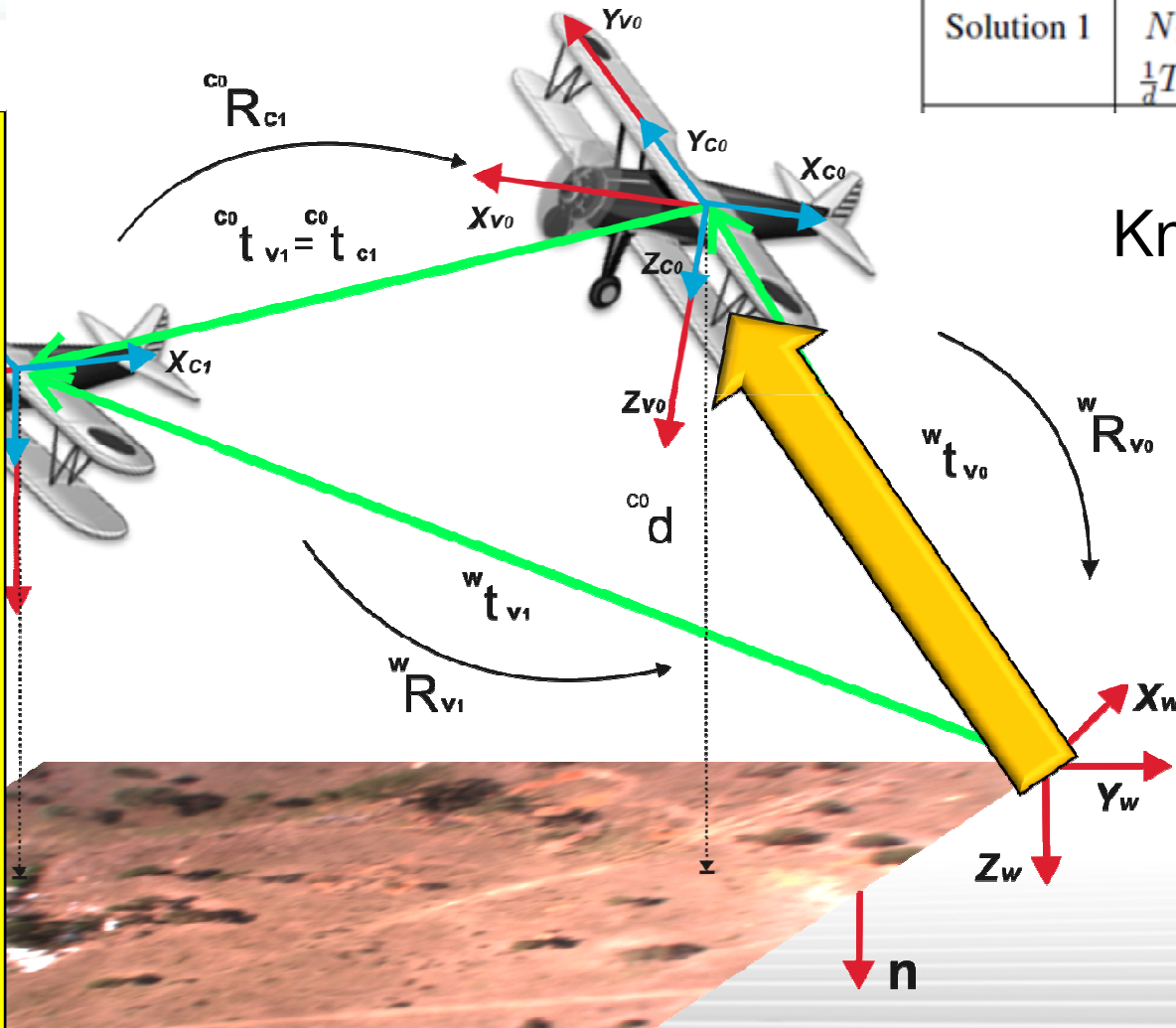
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Pose Estimation

Solution 1	$R_1 = W_1 U_1^T$
	$N_1 = \hat{v}_2 u_1$
	$\frac{1}{d} T_1 = (H - R_1) N_1$

Knowing Initial position



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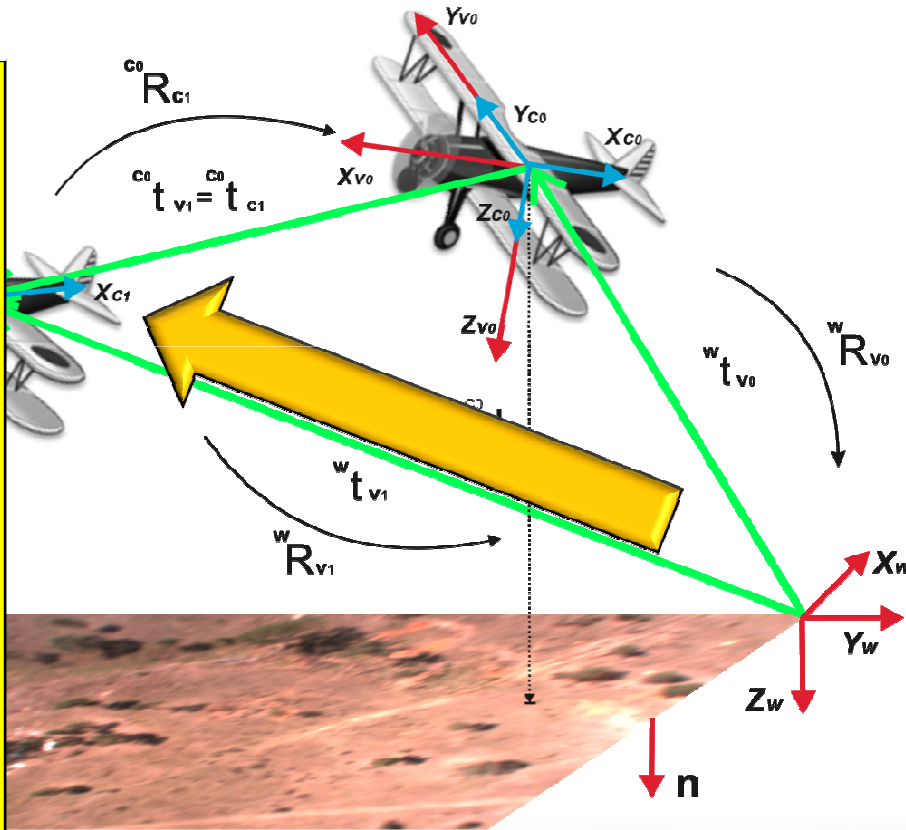
Pose Estimation

Solution 1	$R_1 = W_1 U_1^T$
	$N_1 = \hat{v}_2 u_1$
	$\frac{1}{d} T_1 = (H - R_1) N_1$

6 DOF are recovered

$${}^w R_{c1} = {}^w R_{c0} {}^{c0} R_{c1}$$

$${}^w t_{c1} = {}^w R_{c0} {}^{c0} t_{c1} + {}^w t_{c0}$$



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Pose Estimation Results

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strategy has been **used for pose estimation** of aerial vehicles
came to frame motion estimation.

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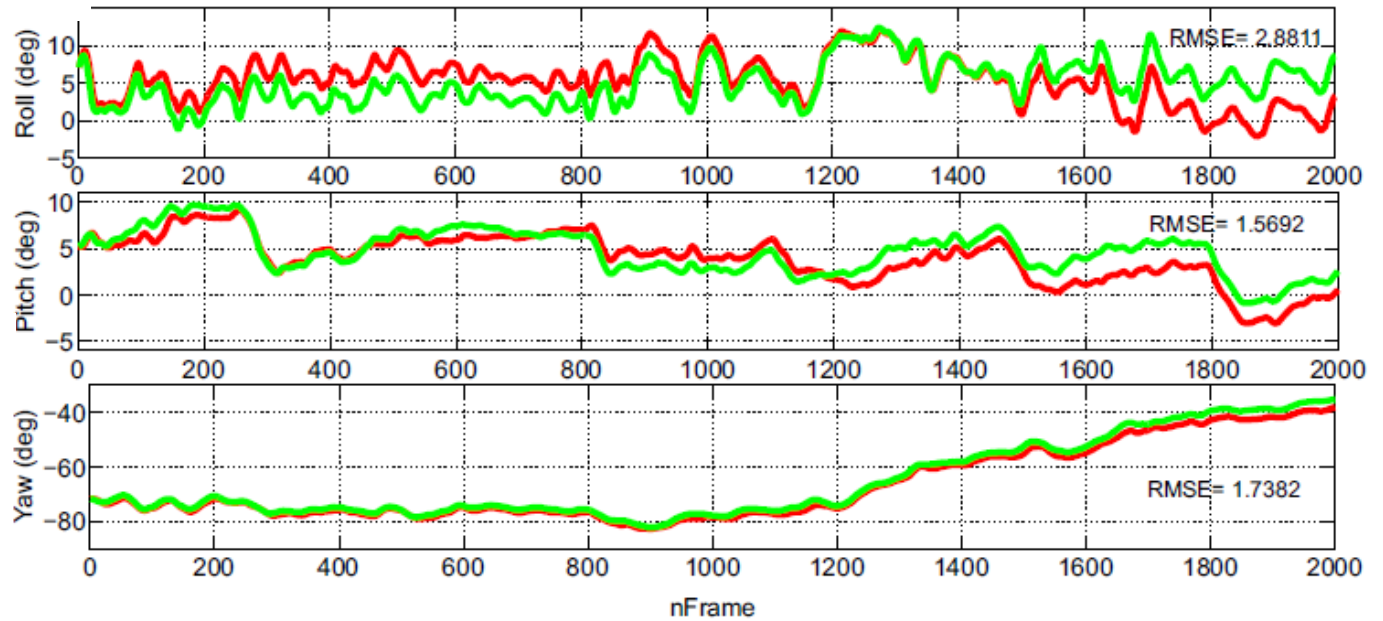
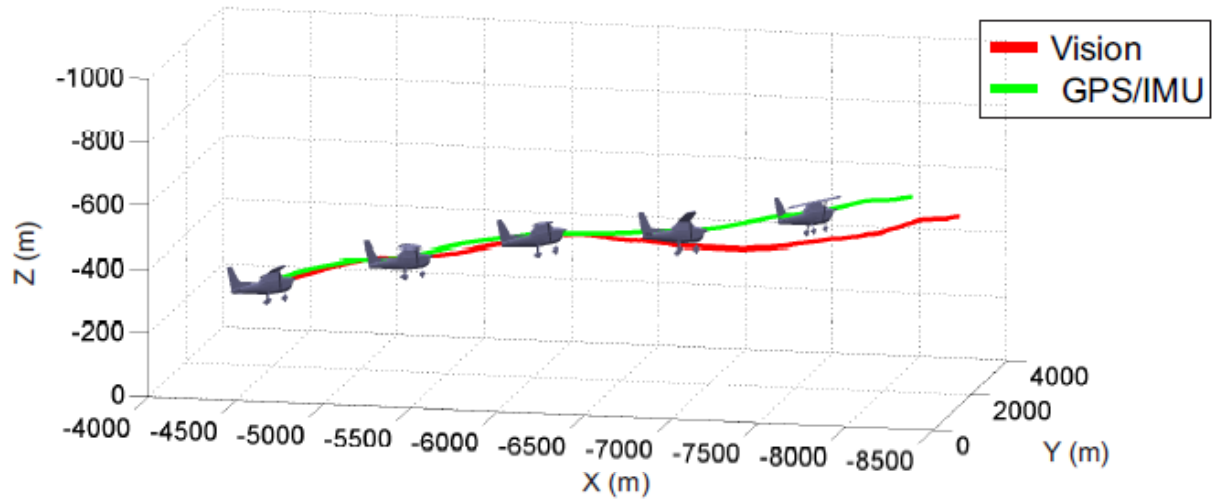
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Pose Estimation Results

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cruise

Cruise

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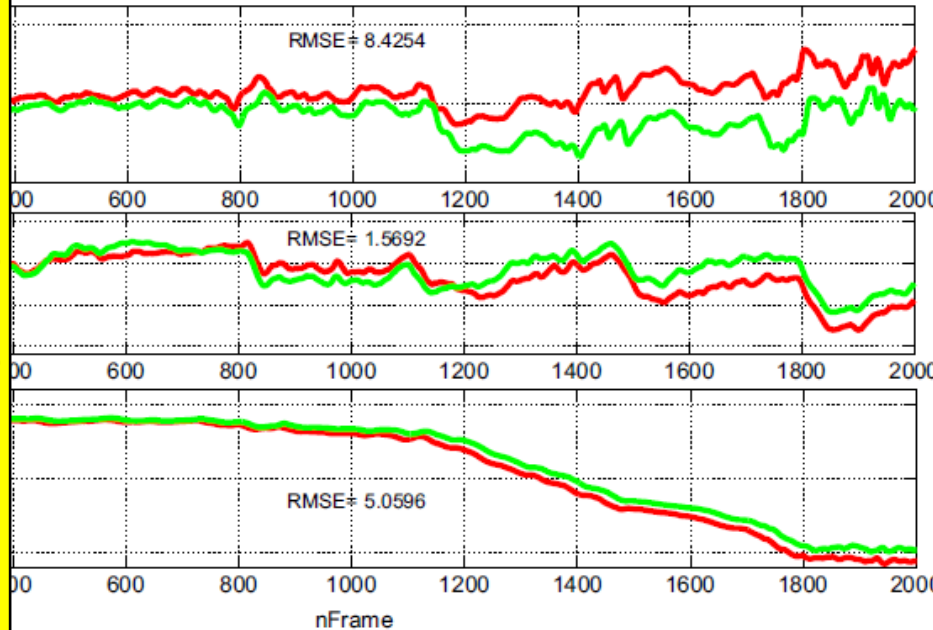
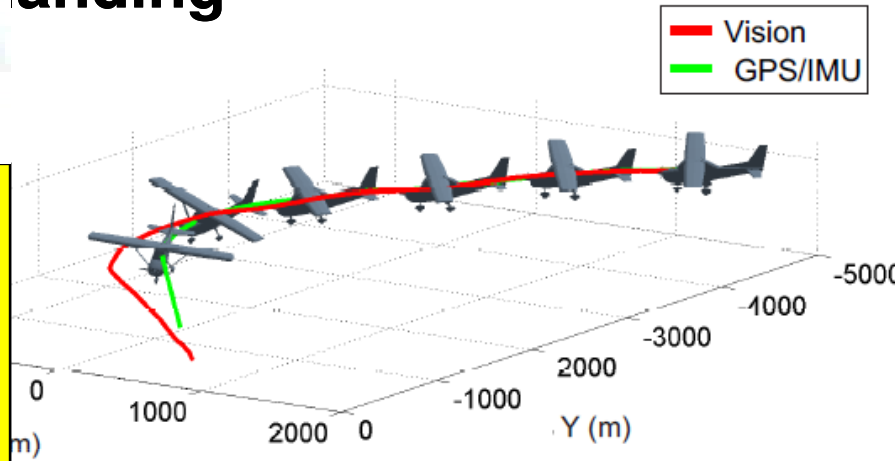
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Pose Estimation Results

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landing



Results:

- Similar Behavior
- Low drift, only based on visual information

MAPE x,y,z

[8.12%, 15.44%, 3.70%]

RMSE roll, pitch, yaw

[8.4, 1.5, 5] deg

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Problems

Linear assumption

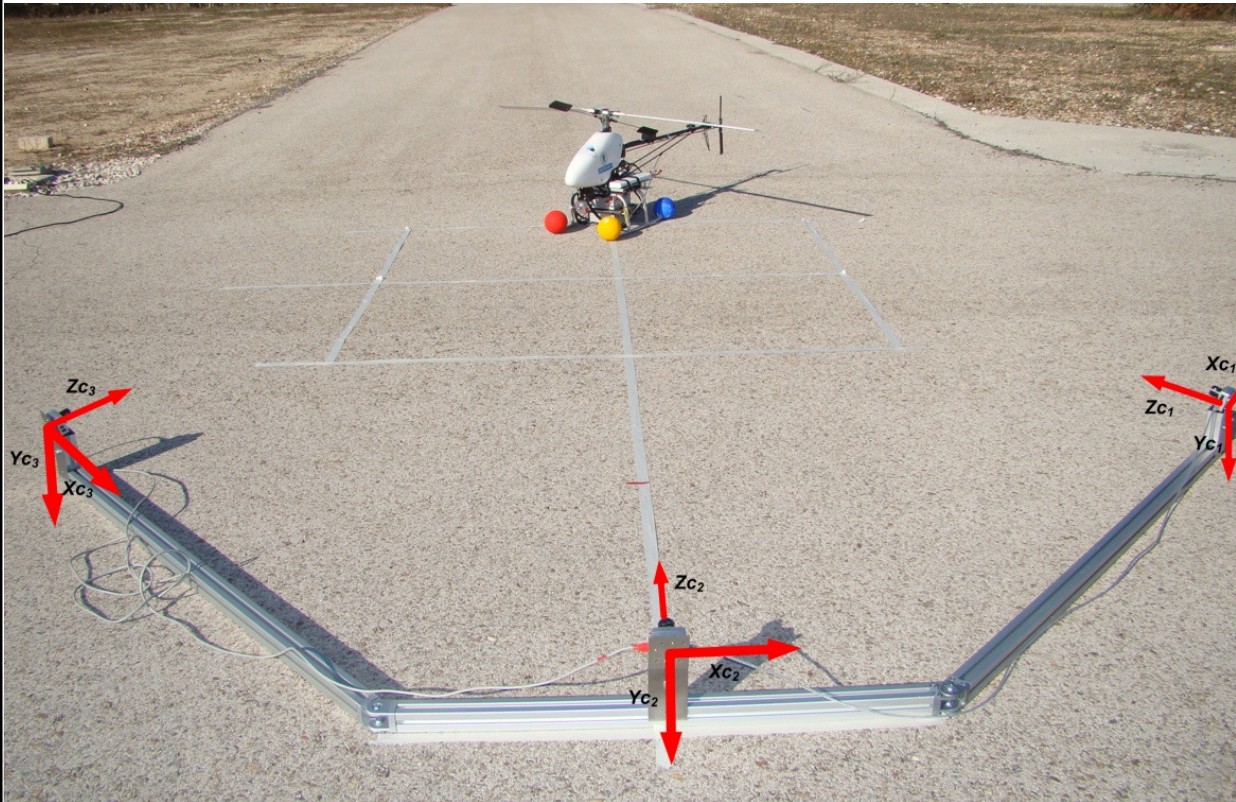
Not due to integration of the data.

Even if there is a frame to frame error, it is integrated

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Using a external camera system

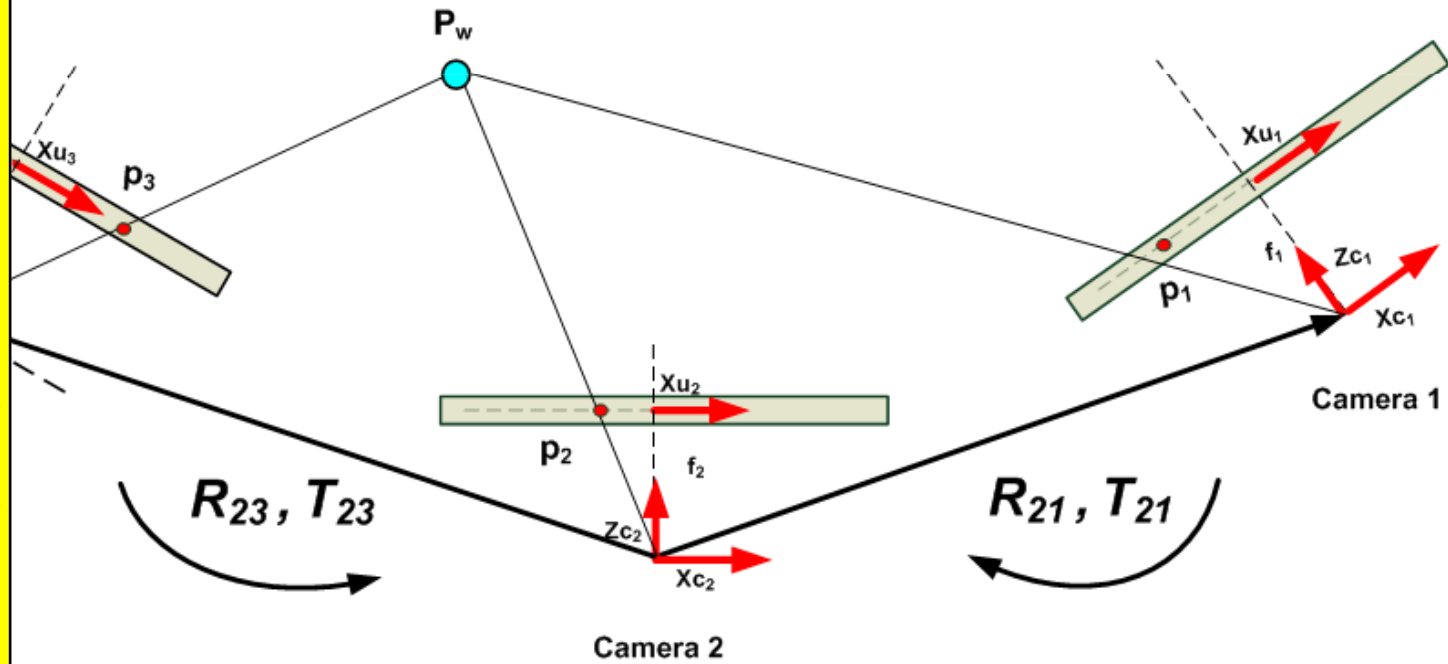
Determine the 3D position by detecting the coordinates of the object in the image



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Using an external camera system

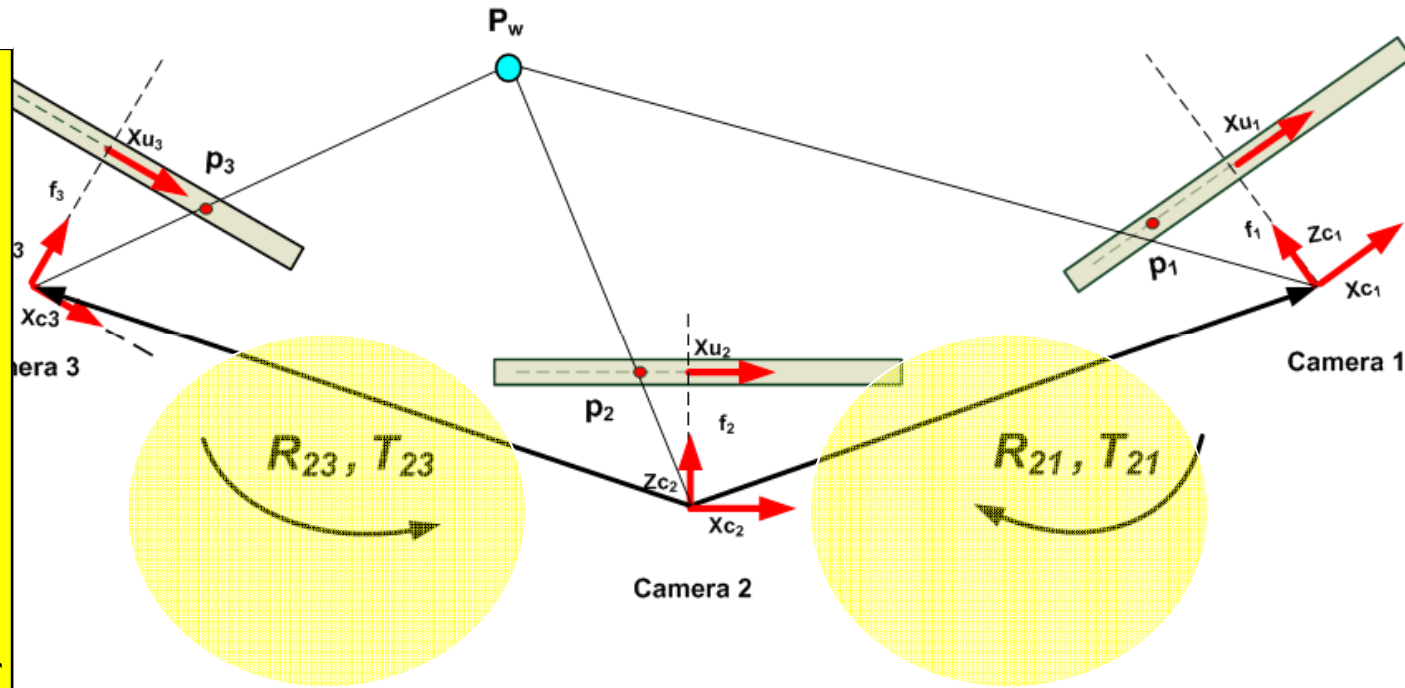
Determine the world position by detecting the coordinates of the object in the camera images



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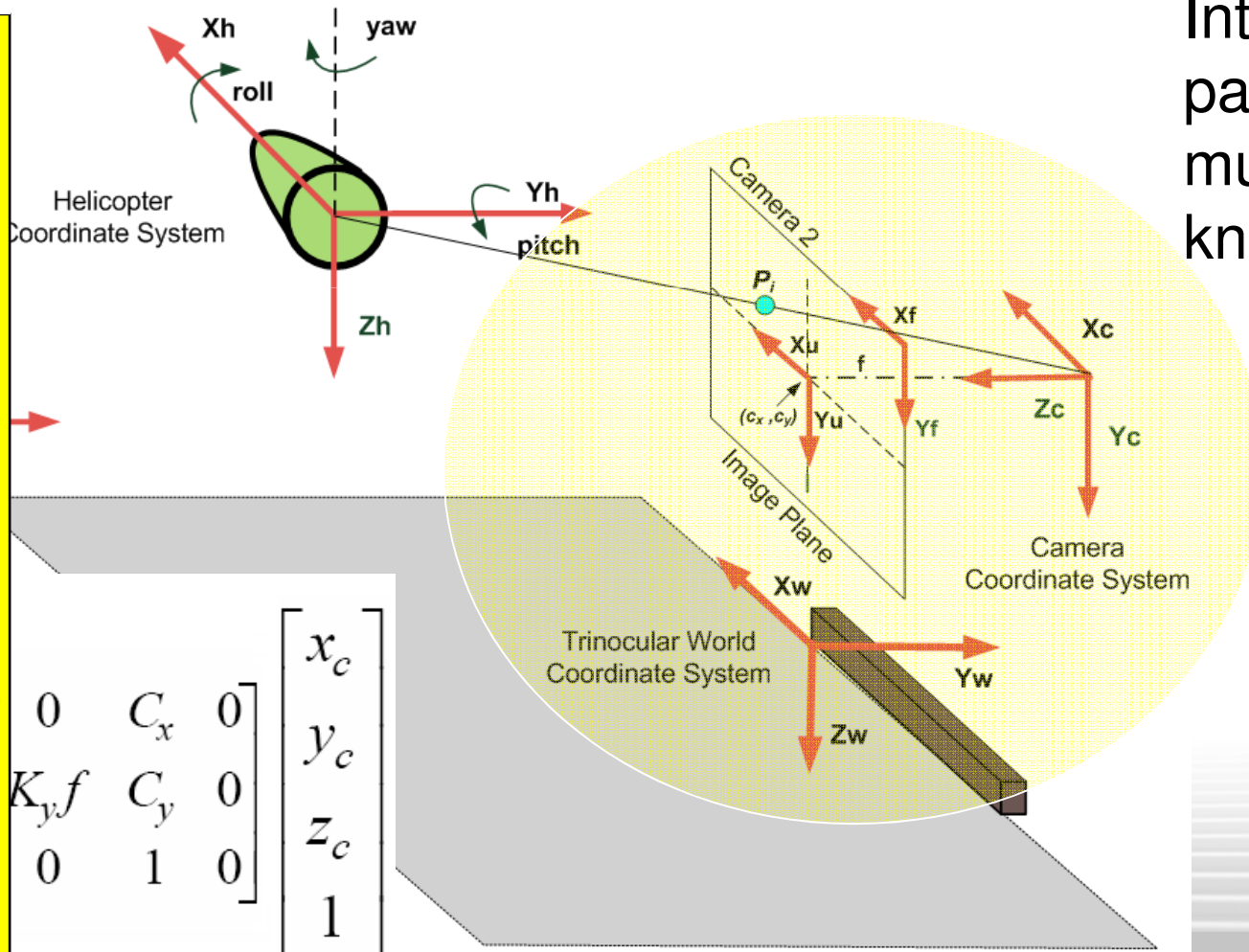
Using an external camera system



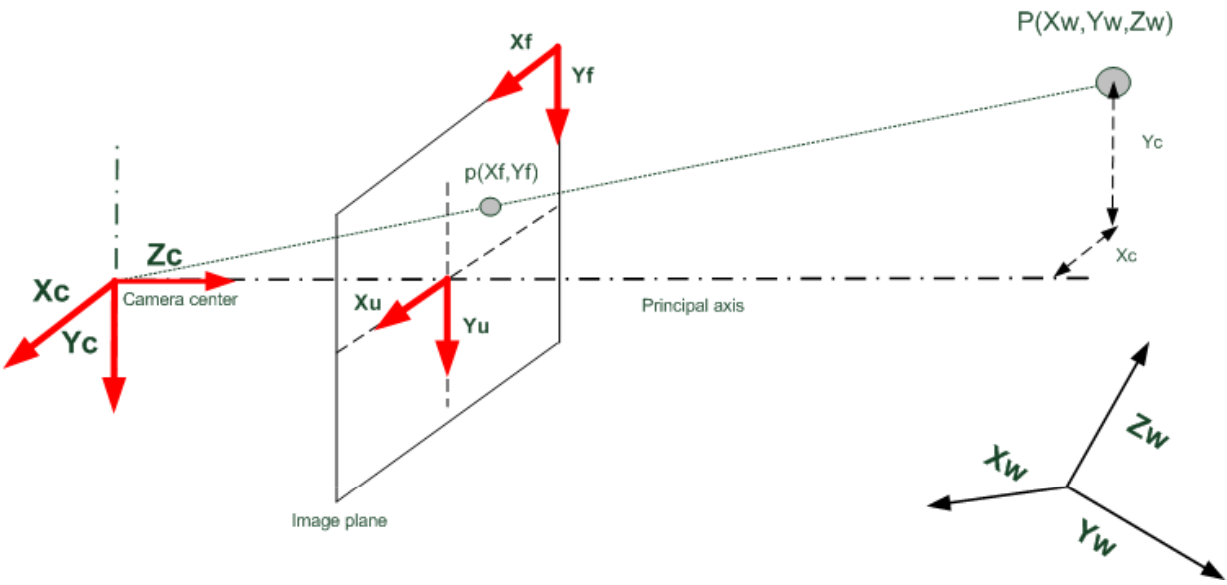
Extrinsic parameters must be known

Using an external camera system

Intrinsic parameters must be known



Pose Estimation



$$x_d = \frac{x_f - C_x}{K_x f}$$

$$y_d = \frac{y_f - C_y}{K_y f}$$

$(x_f, y_f) \Rightarrow (x_u, y_u)$ Complicado. Iterativo con valor inicial

$$(x_u, y_u) \equiv (x_d, y_d) ; r^2 \equiv x_d^2 + y_d^2 \Rightarrow (x_{fu}, y_{fu})$$

$$x_u \approx x_d - D_x(x_u, y_u)$$

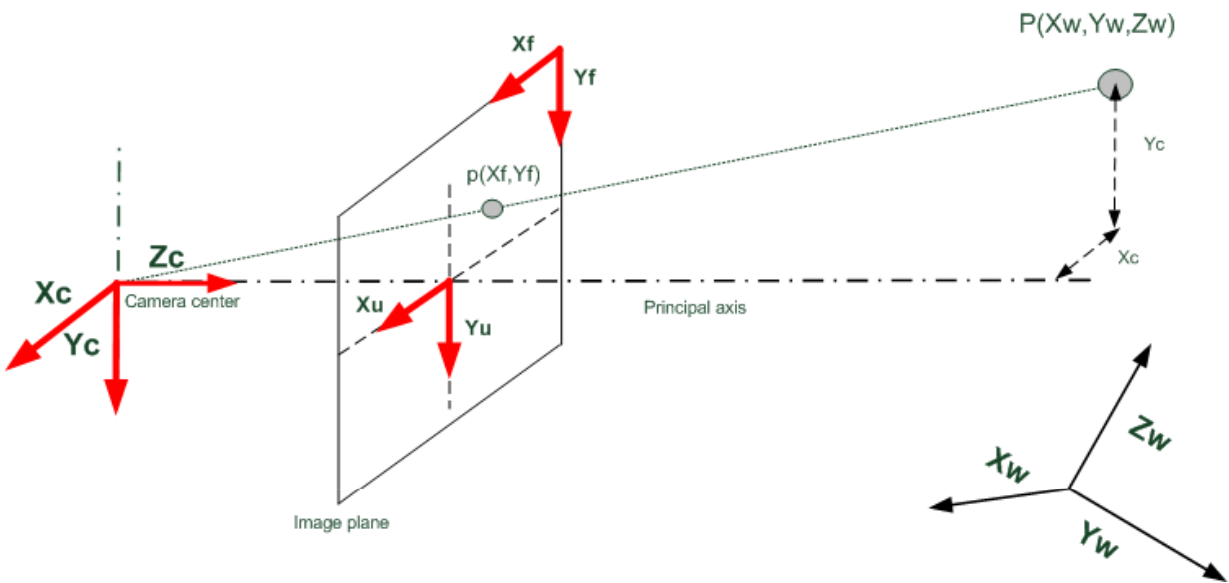
$$y_u \approx y_d - D_y(x_u, y_u)$$

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Pose Estimation

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$$x_u \approx x_d - D_x(x_u, y_u) \quad y_u \approx y_d - D_y(x_u, y_u)$$

$$d_{rad} = (1 + k_1 r^2 + k_2 r^4 + k_5 r^6) \quad dx = \begin{bmatrix} 2p_1 x_u y_u + p_2 (r^2 + 2x_u^2) \\ 2p_2 x_u y_u + p_1 (r^2 + 2y_u^2) \end{bmatrix}$$

$$x_u = \frac{x_u - dx(1)}{d_{rad}}$$

$$y_u = \frac{y_u - dx(2)}{d_{rad}}$$

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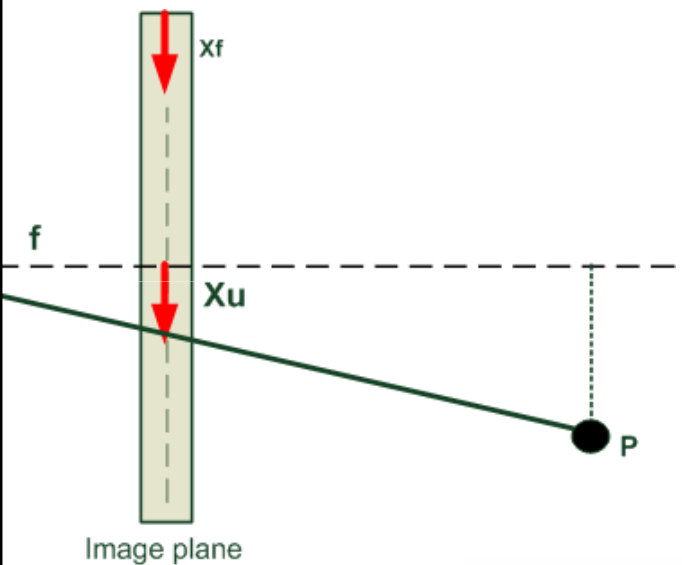
Pose Estimation

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$$\frac{x_u}{f} = \frac{x_c}{z_c}$$

$$\frac{y_u}{f} = \frac{y_c}{z_c}$$



$$\begin{bmatrix} n x_u \\ n y_u \\ n \end{bmatrix} = \begin{bmatrix} 1 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 \\ 0 & 0 & 1/f & 0 \end{bmatrix} \begin{bmatrix} x_c \\ y_c \\ z_c \\ 1 \end{bmatrix}$$

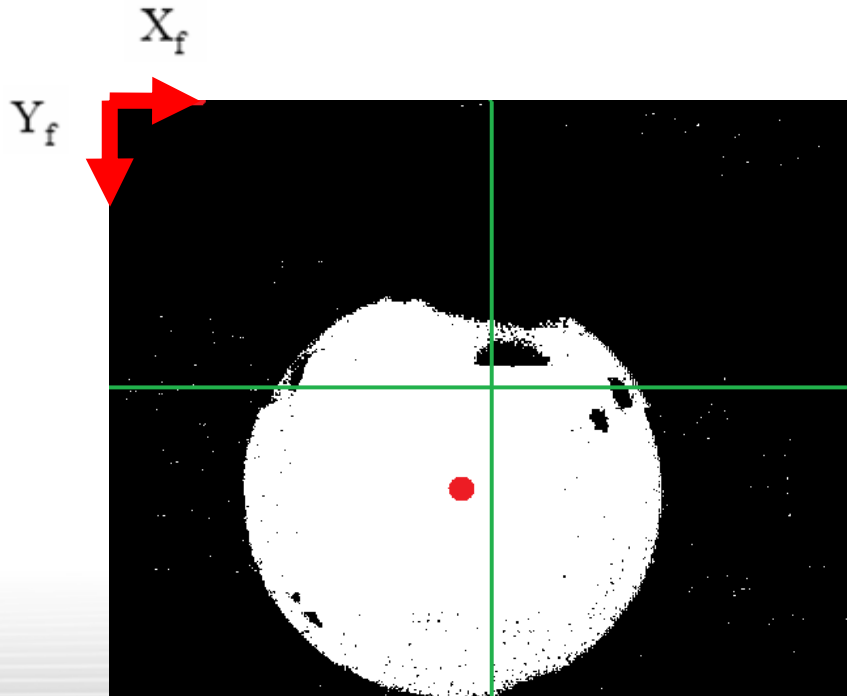
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Feature extraction and tracking

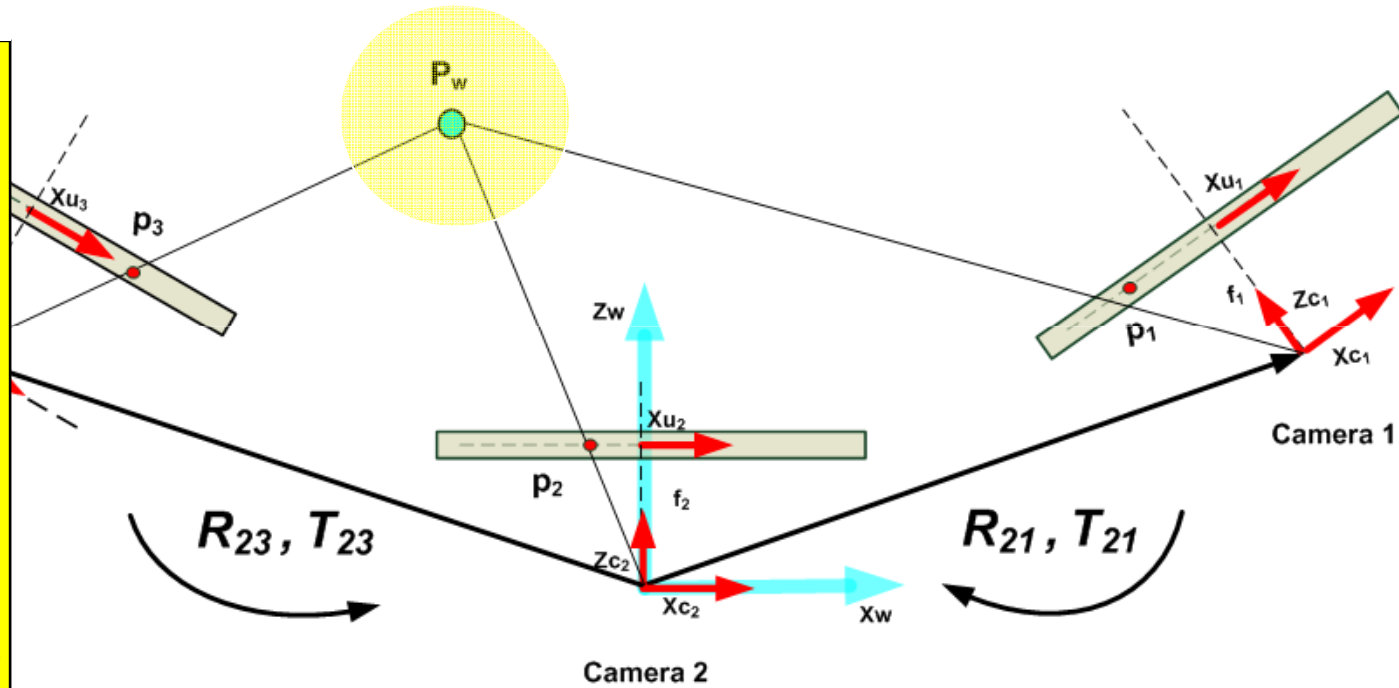
Color information

Feature: center of gravity



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Using an external camera system



$$y_{u_i} = f \frac{r_{21}^1 X_w + r_{22}^1 Y_w + r_{23}^1 Z_w + t_x^1}{r_{31}^1 X_w + r_{32}^1 Y_w + r_{33}^1 Z_w + t_z^1}$$

$$A_i L_i = b_i,$$



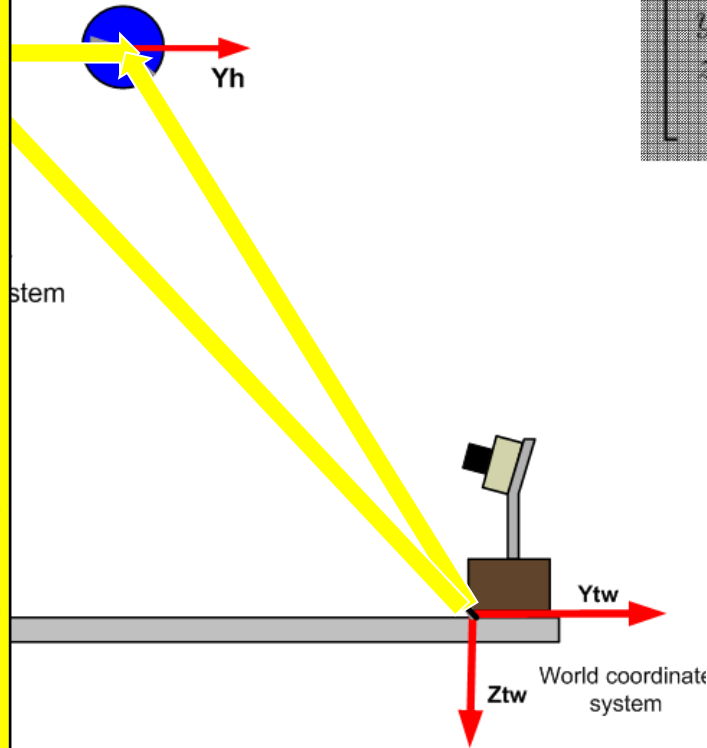
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Using an external camera system

$$\begin{bmatrix} x_{tw} \\ y_{tw} \\ z_{tw} \\ 1 \end{bmatrix} = \begin{bmatrix} \cos(\theta) & -\sin(\theta) & 0 & t_x \\ \sin(\theta) & \cos(\theta) & 0 & t_y \\ 0 & 0 & 1 & t_z \\ 0 & 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} x_h \\ y_h \\ z_h \\ 1 \end{bmatrix}$$



$$\begin{bmatrix} x_{tw}^1 \\ y_{tw}^1 \\ z_{tw}^1 - z_h^1 \\ \vdots \\ z_{tw}^4 - z_h^4 \end{bmatrix} = \begin{bmatrix} x_h^1 & -y_h^1 & 1 & 0 & 0 \\ y_h^1 & x_h^1 & 0 & 1 & 0 \\ 0 & 0 & 0 & 0 & 1 \\ \vdots & \vdots & \vdots & \vdots & \vdots \\ y_h^4 & x_h^4 & 0 & 1 & 0 \\ 0 & 0 & 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} A \\ B \\ C \\ D \\ E \end{bmatrix}$$

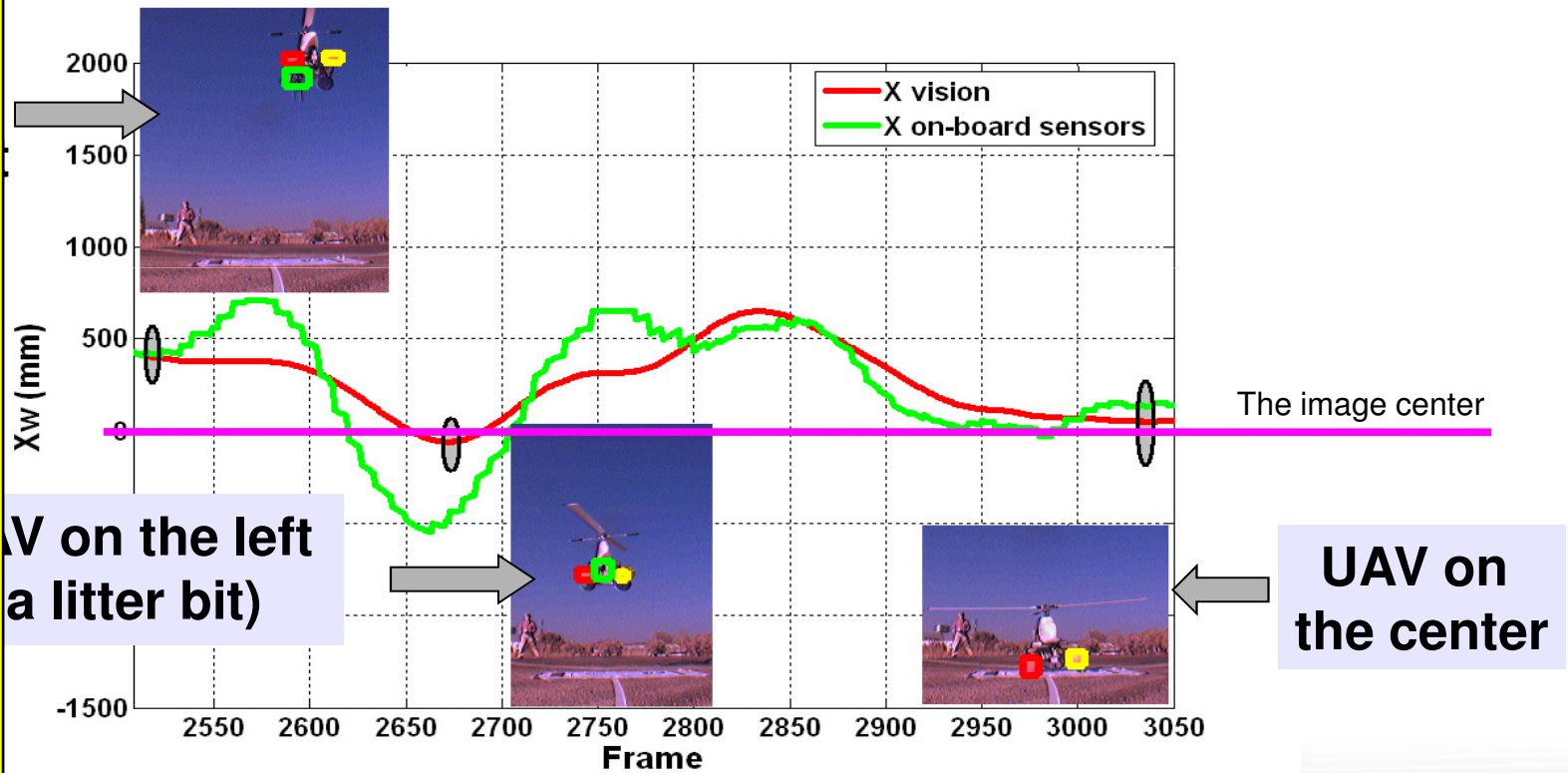
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Pose Estimation

Pose Estimation --> TRINOCULAR SYSTEM

ation during a **landing task in manual mode (RC)**



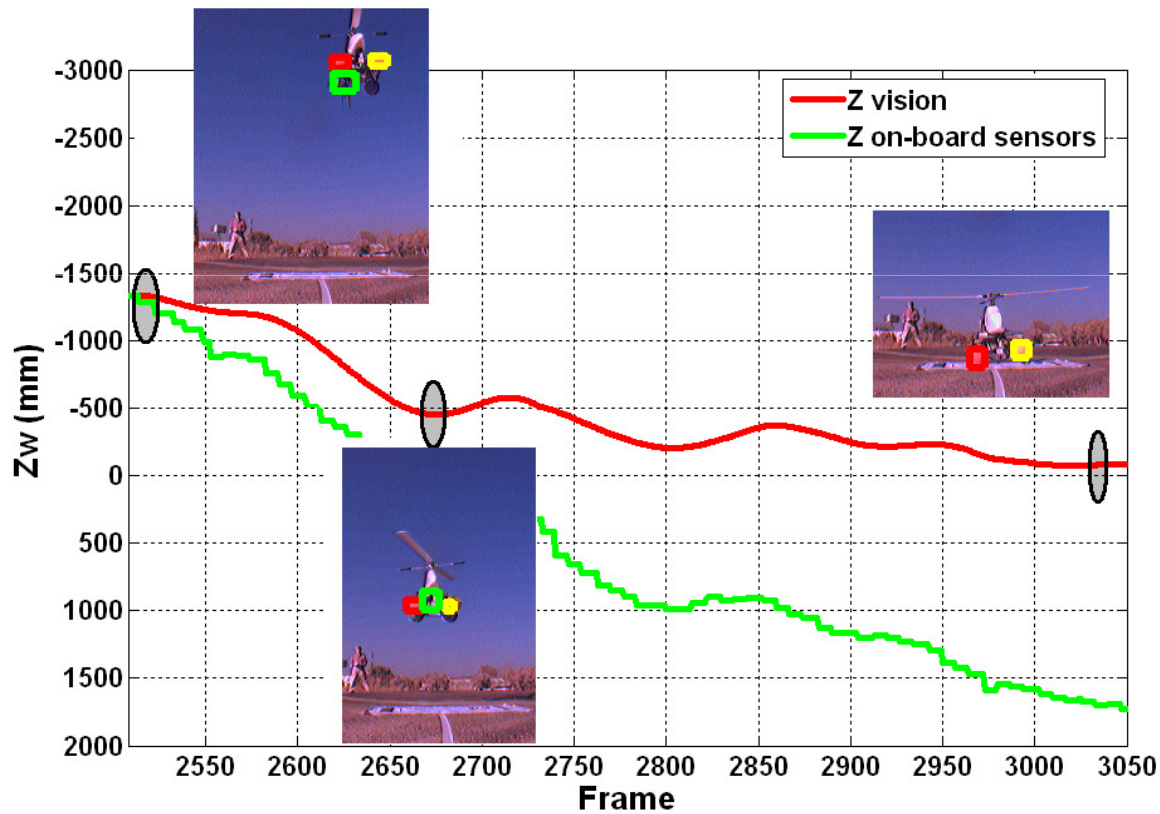
ual estimation **corresponds with real UAV position**

Pose Estimation

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Pose Estimation --> TRINOCULAR SYSTEM

estimation during a **landing** task in **manual mode (RC)**



Final estimation **corresponds** with **real UAV position**
Improvement of the UAV's position estimation



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Results

UAV's YAW ANGLE ESTIMATION

USING AN EXTERNAL TRINOCULAR SYSTEM

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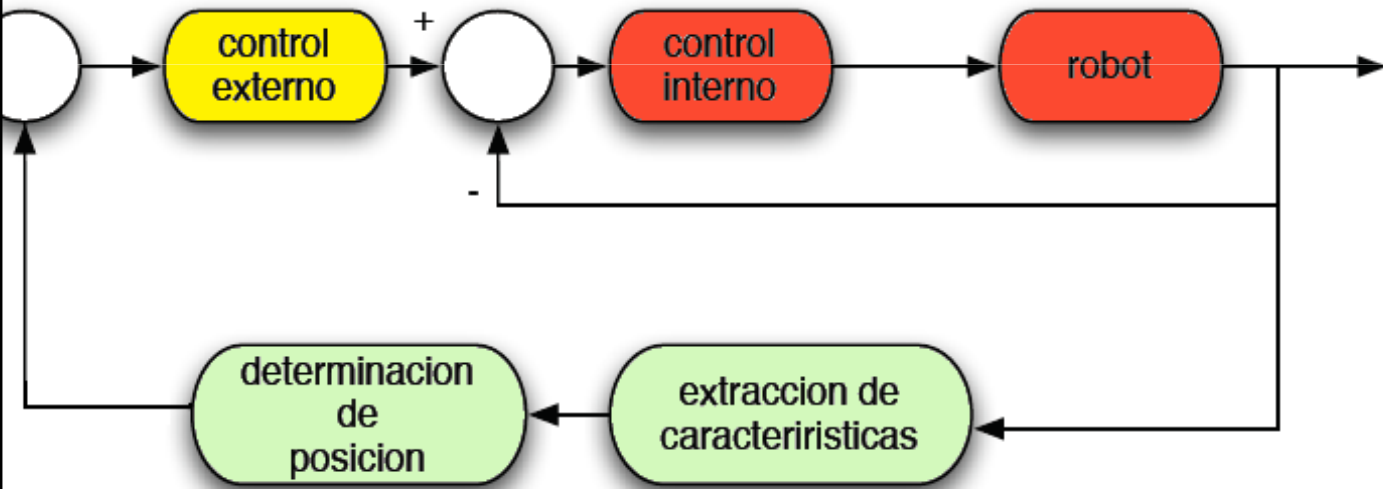
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Position Based Visual Servoing PBVS Results



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Robo-Tenis

Hand eye in hand, dynamic look and move strategy

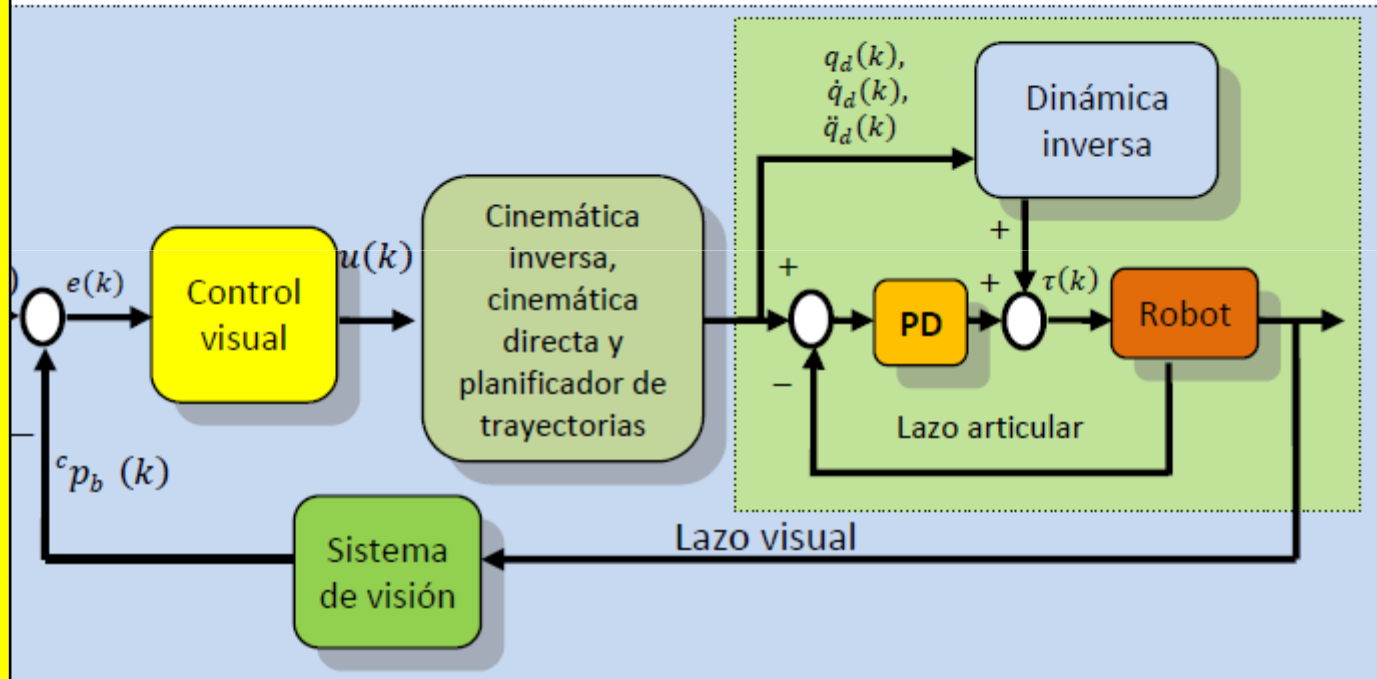


Fig. 6.2 Esquema básico de control del sistema Robotenis.

$$e(k) = {}^c p_b^*(k) - {}^c p_b(k)$$

$$e(k) = {}^c p_b^*(k) - {}^c R_w \left({}^w p_b(k) - {}^w p_c(k) \right)$$

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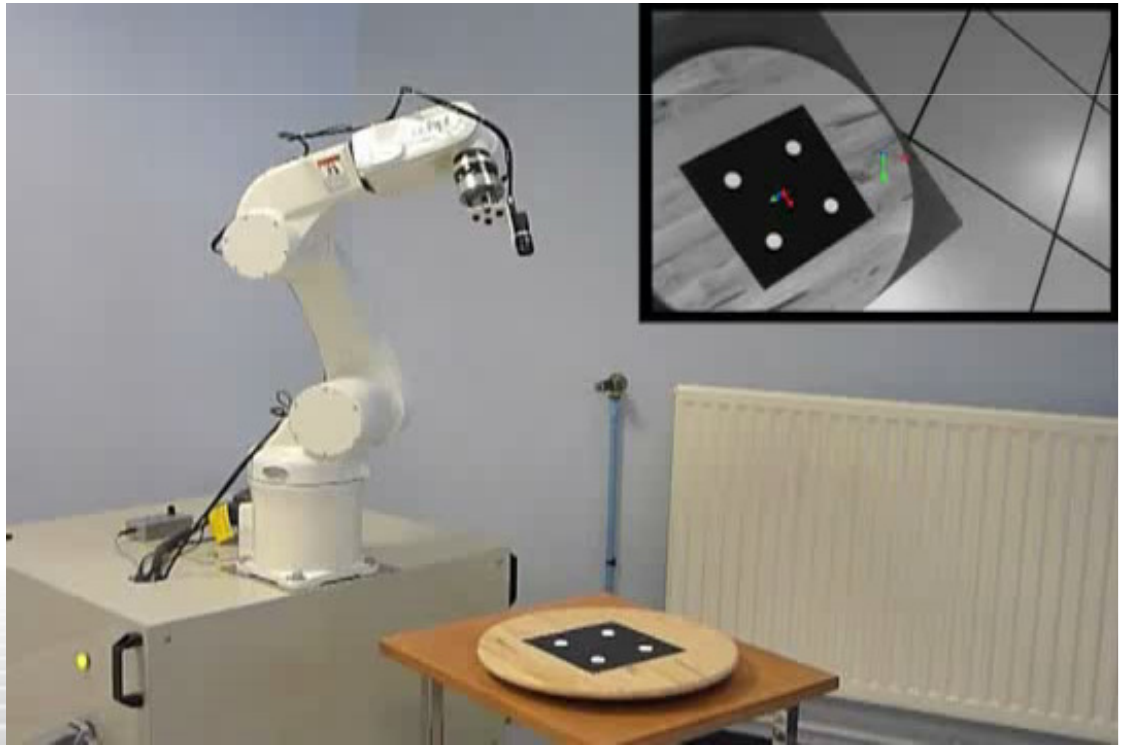
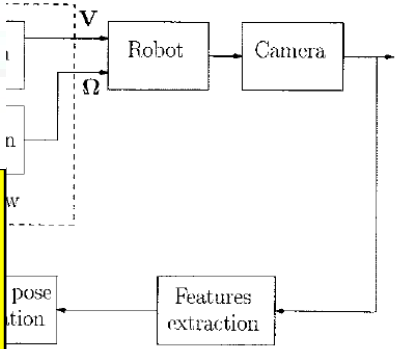
o-Tenis

lar eye in hand, dynamic look and move strategy



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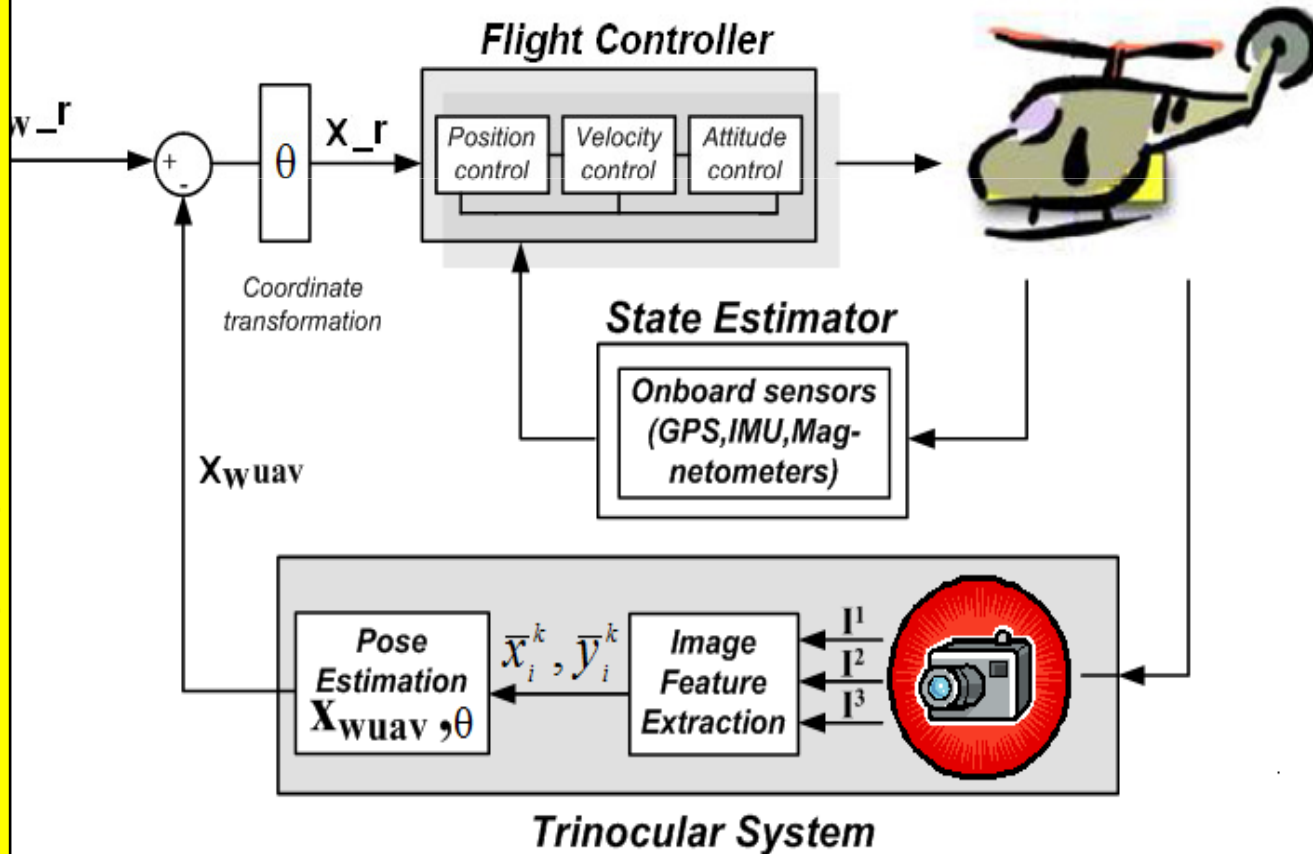
Hybrid approach



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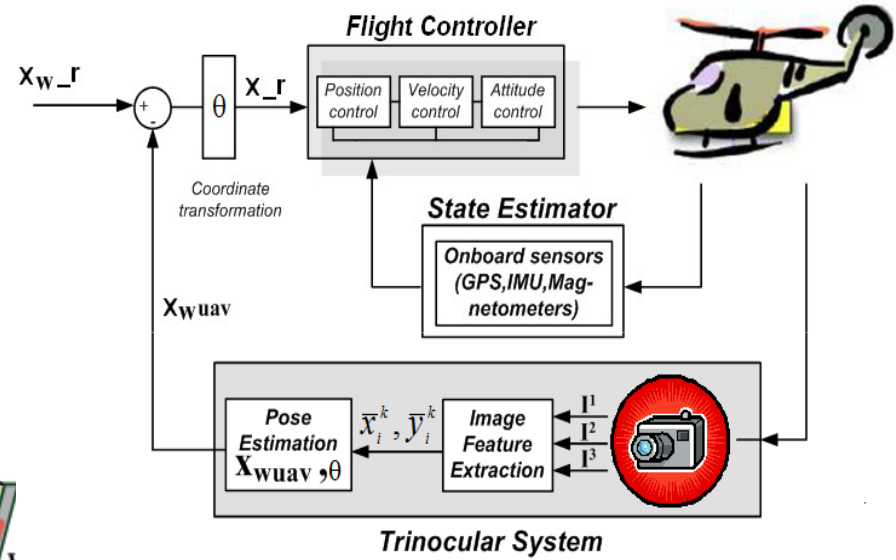
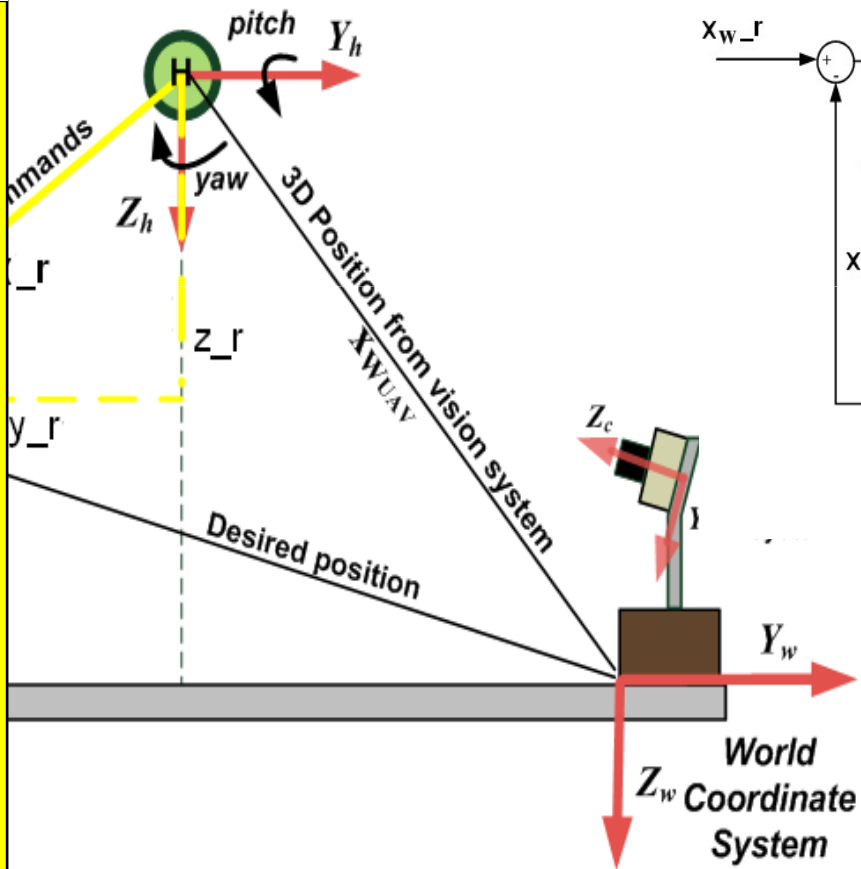
External camera system

Far eye to hand, dynamic look and move strategy



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External camera system



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External camera system

Controlling Z axis

vision-based landing task

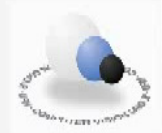
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VISION-BASED LANDING

UAV's HEIGHT CONTROL
USING AN EXTERNAL
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External camera system

ystem: <http://www.vicon.com/>

Precise Aggressive Maneuvers for Autonomous Quadrotors

Daniel Mellinger, Nathan Michael, Vijay Kumar
GRASP Lab, University of Pennsylvania

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Summarizing ...

visual control strategies depending on the error function:

Sumaria

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Summarizing ...

visual control strategies depending on the error function:

pose based visual servoing **depends on the pose estimation**

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Summarizing ...

visual control strategies depending on the error function:

pose based visual servoing **depends on the pose estimation**

estimation algorithms (**depending on the number of cameras**):

monocular: require **additional information** to solve the depth problem
multi-camera systems: by **triangulation**, problem speed.

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Summarizing ...

visual control strategies depending on the error function:

pose based visual servoing **depends on the pose estimation**

estimation algorithms (**depending on the number of cameras**):

monocular: require **additional information** to solve the depth
multi-camera systems: by **triangulation**, problem speed.

depending on the references: PBVS with **velocity commands** or **position commands**.

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based on:

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al Basado en Características de un Sistema Articulado. Estimación del Jacobiano
n Utilizando Múltiples Vistas

locheros Michel
plementación y Evaluación de Estrategias de Control Servo Visual para Robots
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¡Thanks!

The Flying Machine Arena Quadrocopter Ball Juggling



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Pose Estimation and Position Based Visual Servoing

Carol Martínez

May 2011

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