

An approach to camera calibration in industrial robotics using HexSight

Facoltà di Ingegneria dell'informazione, informatica e statistica
Corso di Laurea Magistrale in Artificial Intelligence and Robotics



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How the presentation is organized

- I. Vision systems in industrial robotics
- II. Camera calibration in industrial robotics
- III. Proposed solution
- IV. Results



I. Vision systems in industrial robotics



Common applications :



Measurement



Localization



Counting

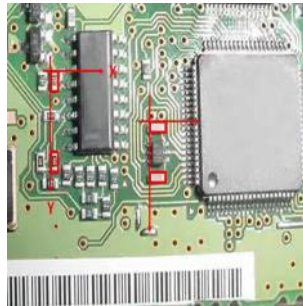


Decoding

Vision systems in industrial robotics



Estimate 3D information



Common applications :



Measurement



Localization



Counting



Decoding

Vision systems in industrial robotics



Estimate 2D information



Common applications :



Measurement



Localization




Counting



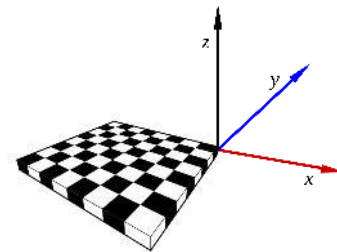
Decoding

II Camera calibration in industrial robotics



2D point $\begin{bmatrix} u \\ v \\ 1 \end{bmatrix} = \begin{bmatrix} f_x & 0 & c_x \\ 0 & f_y & c_y \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} r_{11} & r_{12} & r_{13} & t_x \\ r_{21} & r_{22} & r_{23} & t_y \\ r_{31} & r_{32} & r_{33} & t_z \end{bmatrix} \begin{bmatrix} X \\ Y \\ Z \\ 1 \end{bmatrix} = K \cdot [R|t] \cdot \begin{bmatrix} X \\ Y \\ Z \\ 1 \end{bmatrix}$

Intrinsic Extrinsic
Camera matrix



1. Coordinates Acquisition

$$\begin{bmatrix} u_i \\ v_i \end{bmatrix} \longleftrightarrow \begin{bmatrix} x_i \\ y_i \\ z_i \end{bmatrix}$$

01100
10110
11110

2. Parameters Estimation

→ calibration algorithm (Zhang, Tsai..)



3. Reprojection Tests

$$\sum_i d(\mathbf{x}_i, \hat{\mathbf{x}}_i)^2$$

\mathbf{x}_i estimation

$\hat{\mathbf{x}}_i$ ground truth

Camera calibration in industrial robotics

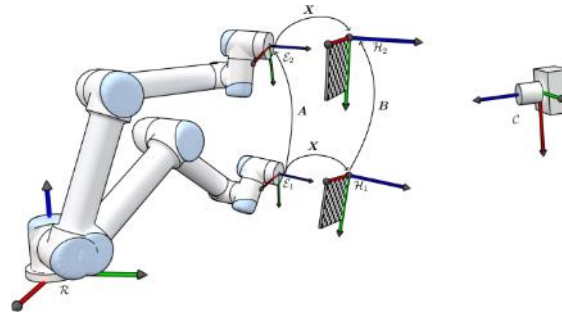
1. Fixed calibration support

$$\begin{bmatrix} u_1 & u_2 & u_3 & u_n \\ v_1 & v_2 & v_3 & v_n \end{bmatrix} = \text{IP}$$

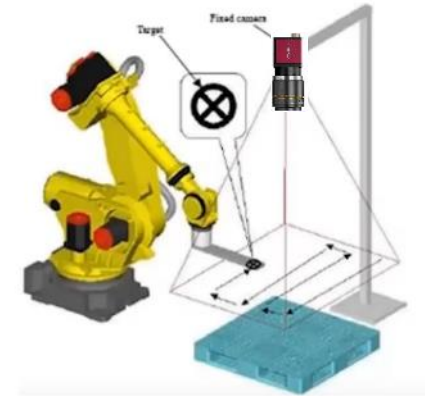
$$\begin{bmatrix} x_1 & x_2 & x_3 & x_n \\ y_1 & y_2 & y_3 & y_n \\ z_1 & z_2 & z_3 & z_n \end{bmatrix} = \text{WP}$$



2. Robot-held support



3. Robot-generated support



Camera calibration in industrial robotics

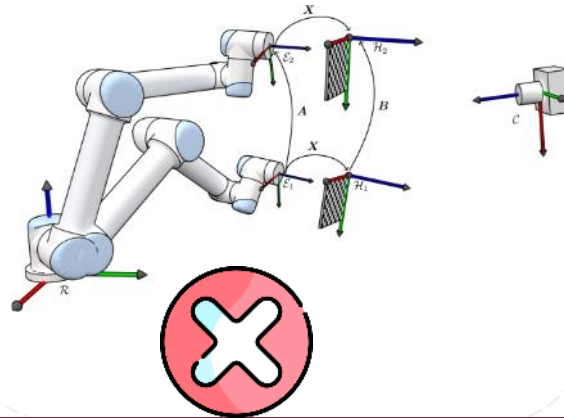
Fixed support

- **Manual** approach
- It needs specialized operator
- Single-point acquisition



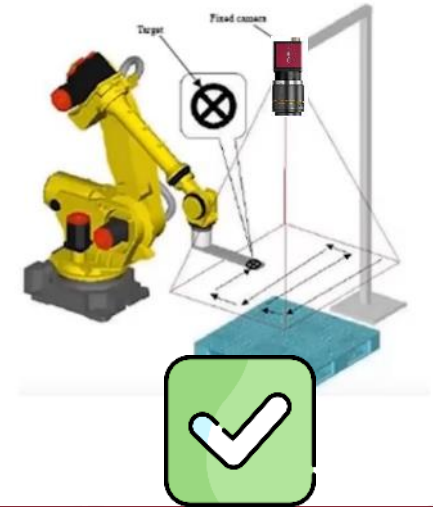
Robot-held

- Automatic approach
- **Needs accuracy**
- Multi-point acquisition



Robot-generated

- Automatic approach
- **Flexible**
- Single-point acquisition



III Proposed Solution

List of ingredients

Goal of the **project**



Develop a flexible
and accurate
automatic
calibration process

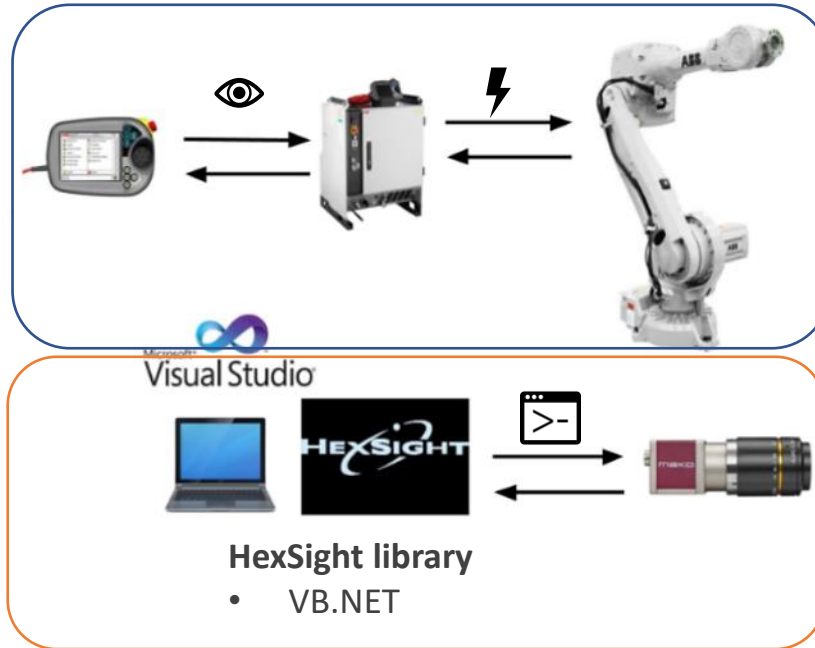


ABB IRB4600

- 6 axis
- 2.5m reach

Mako G-503

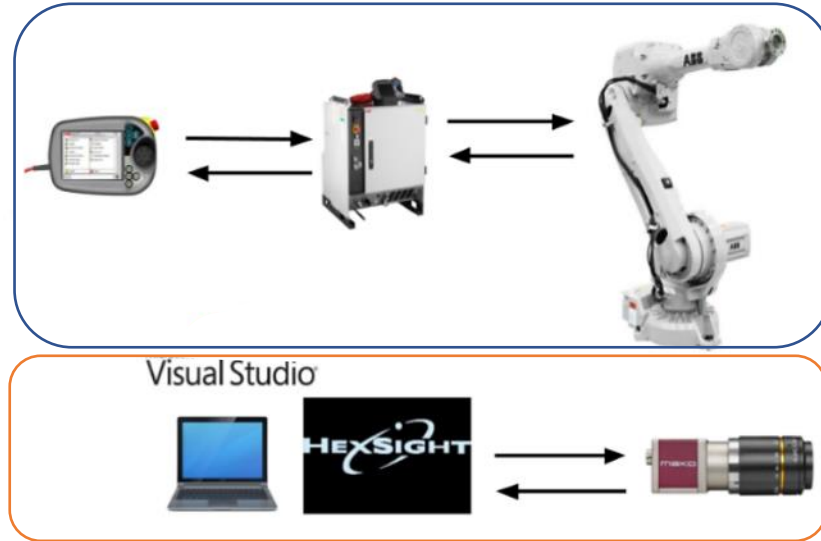
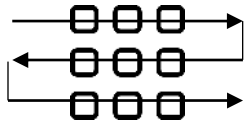
- 2592 x 1944 resolution
- 5 megapixel
- 14 frames/second
- Gigabit Ethernet

III Proposed Solution

Goal of the
robotics branch



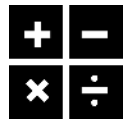
Move the
calibration target
along a grid path
decided by the user



Goal of the
vision branch

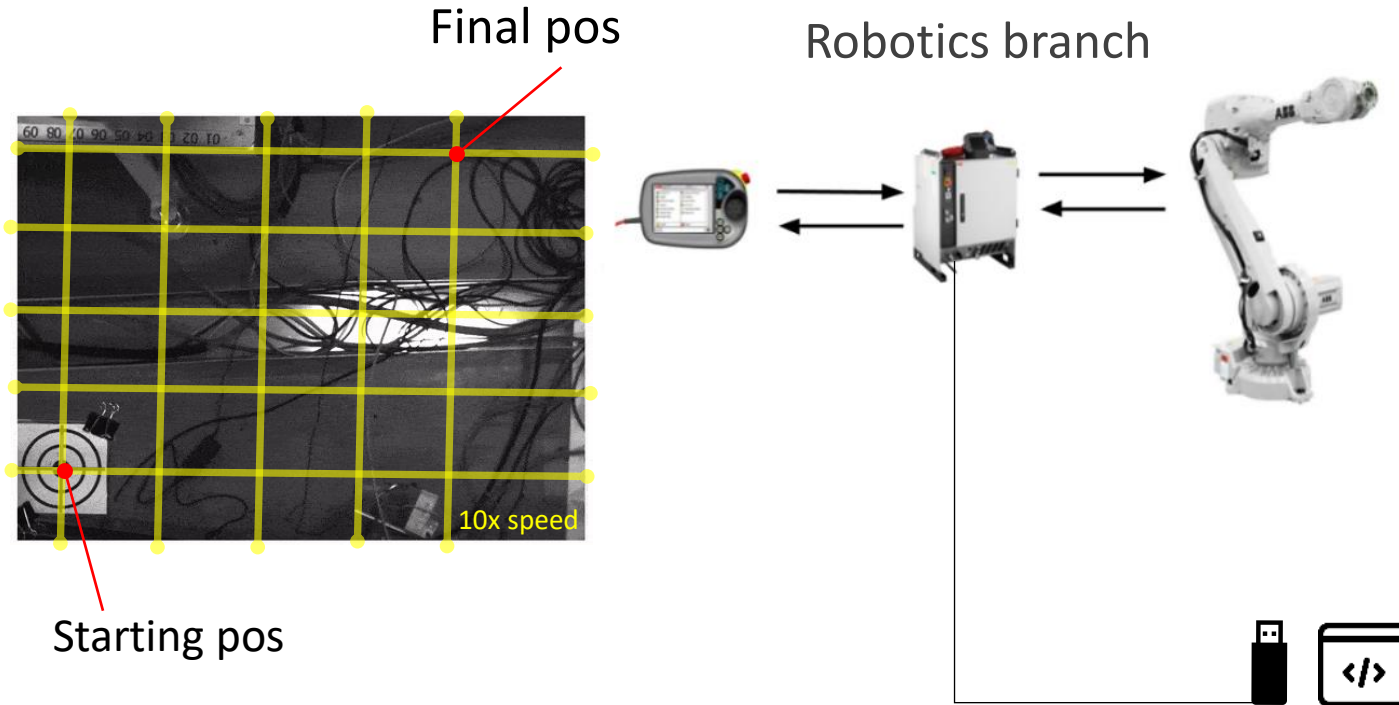


Acquire the target
coordinates and
compute the
calibration



III Proposed Solution

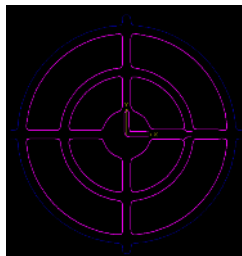
Result



III Proposed Solution

More details

1. **Model** of the target to find



2. **Calibration method** to execute

Tsai calibration[1]

- Planar control points
- 2 Stage optimization
- Lens correction

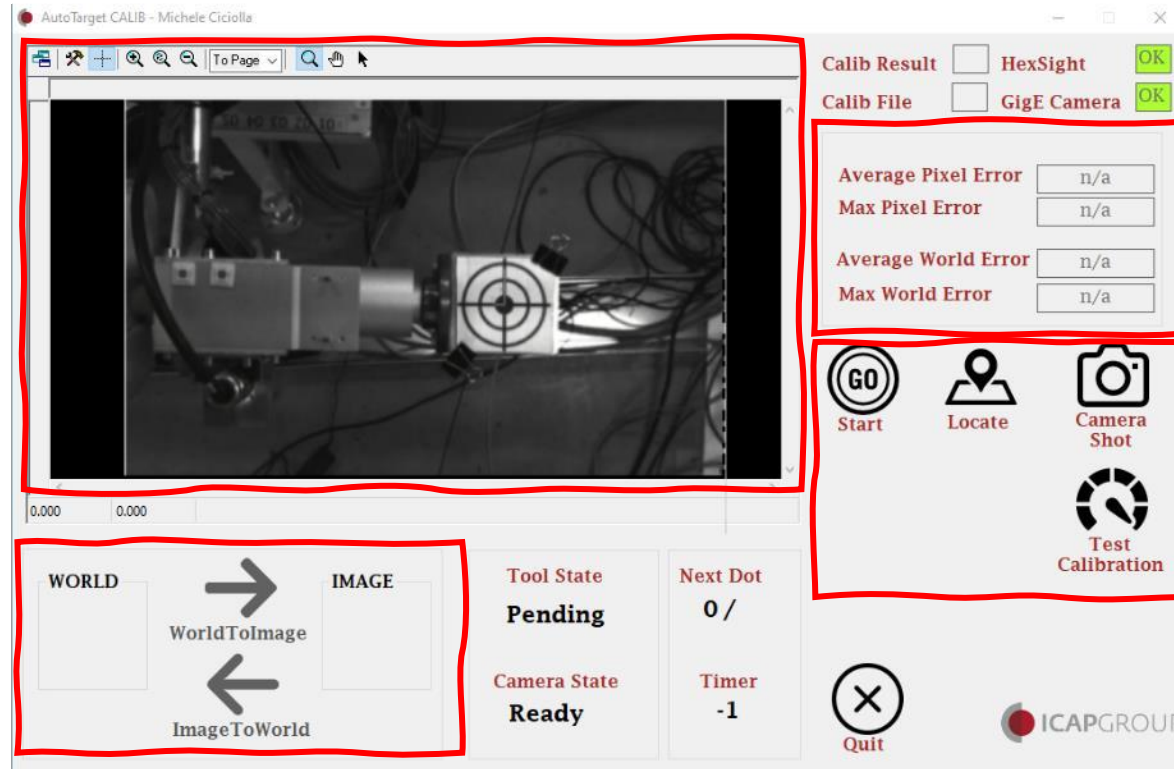


III Proposed Solution

HMI : Visual Basic HexSight

Display

Testing interface



Result dashboard

Action buttons

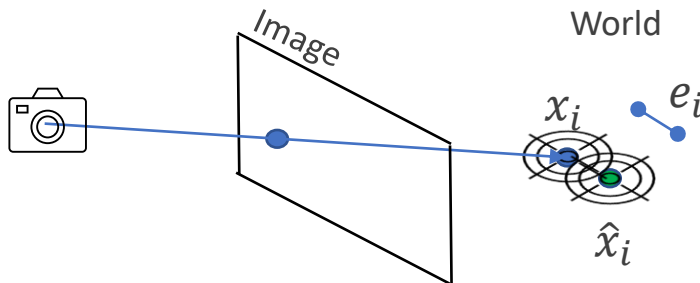
IV Results

Performance evaluation:

Image-To-World estimation

$$\sum_i d(\mathbf{x}_i, \hat{\mathbf{x}}_i)^2$$

\mathbf{x}_i World estimation
 $\hat{\mathbf{x}}_i$ World ground truth



Estimate 3D information



Measurement



Localization

$$\mathbf{e} = [e_1, e_2, e_3, e_4, e_i, \dots e_n]$$

$i = 1 \dots N$



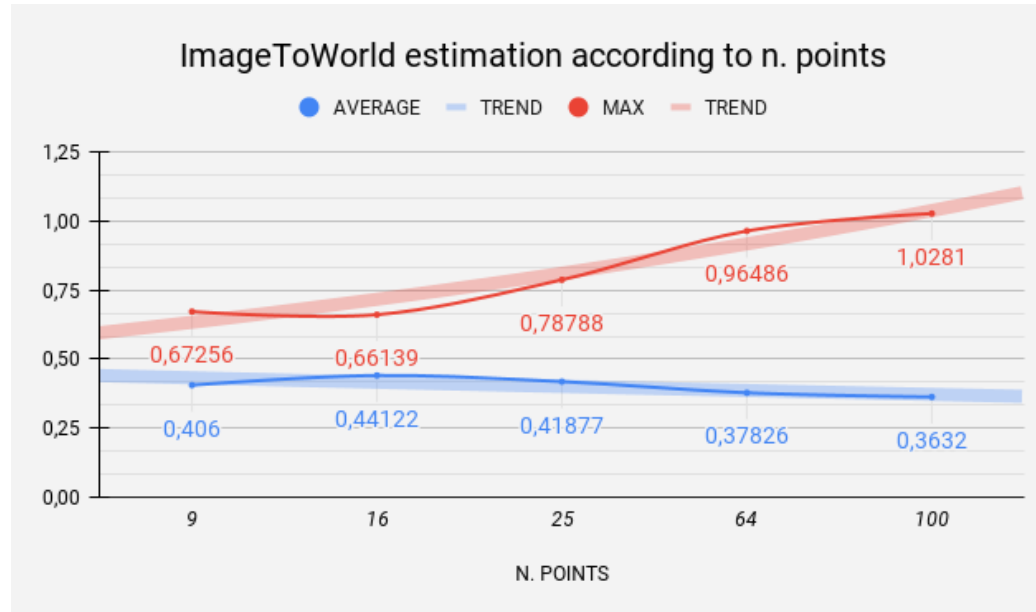
$$\mathbf{max_e} = \max(\mathbf{e})$$



$$\mathbf{avg_e} = \mathbf{e}/N$$

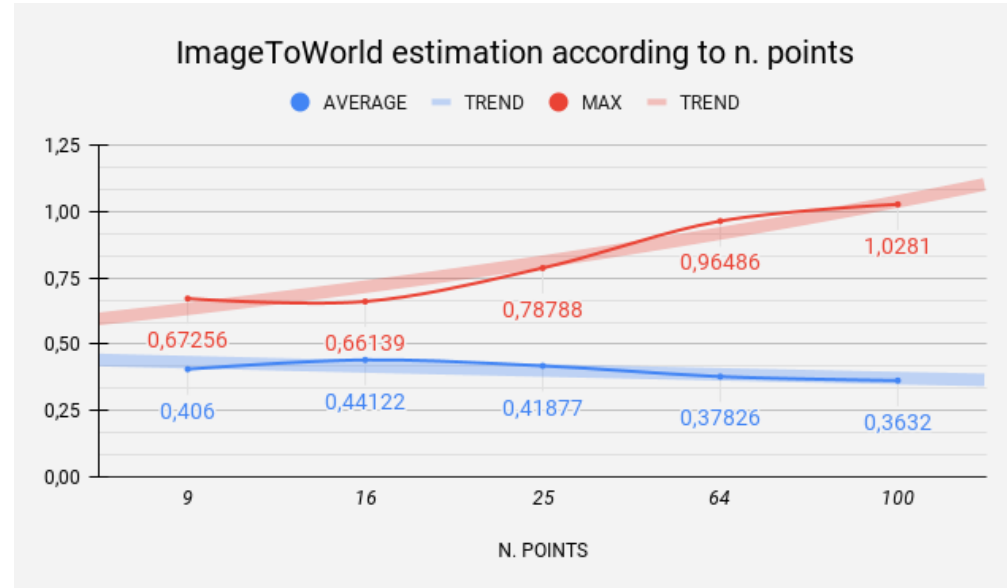
IV Results

1. Performance trend according to **number of points** N



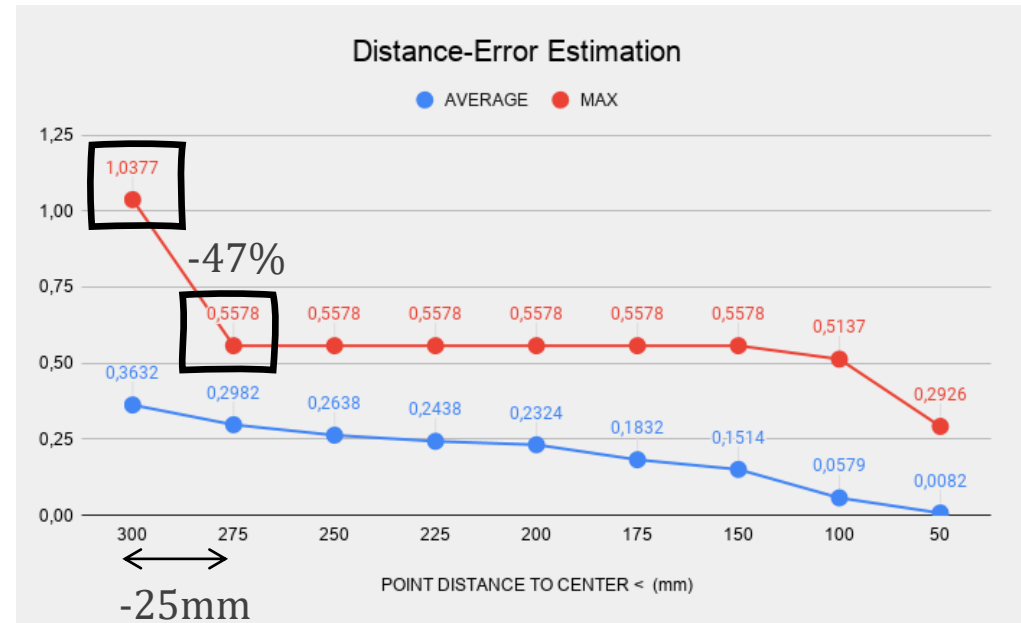
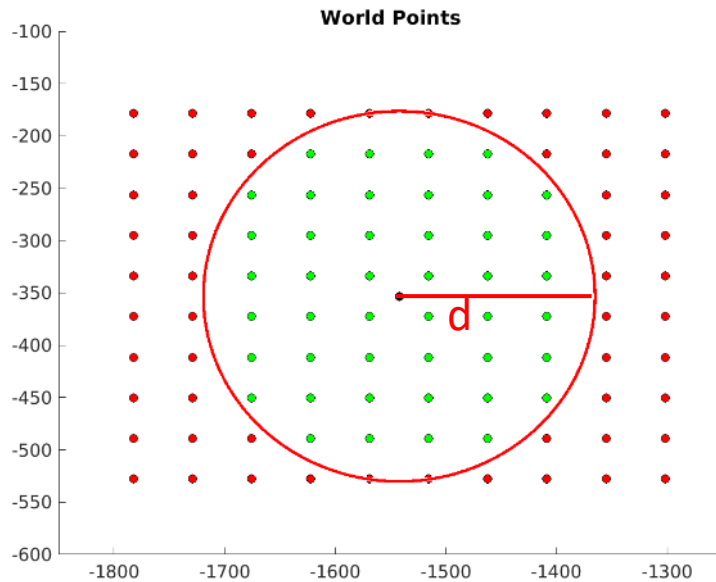
IV Results

1. Performance trend according to **number of points** N



IV Results

1. Performance trend according to **number of points N**



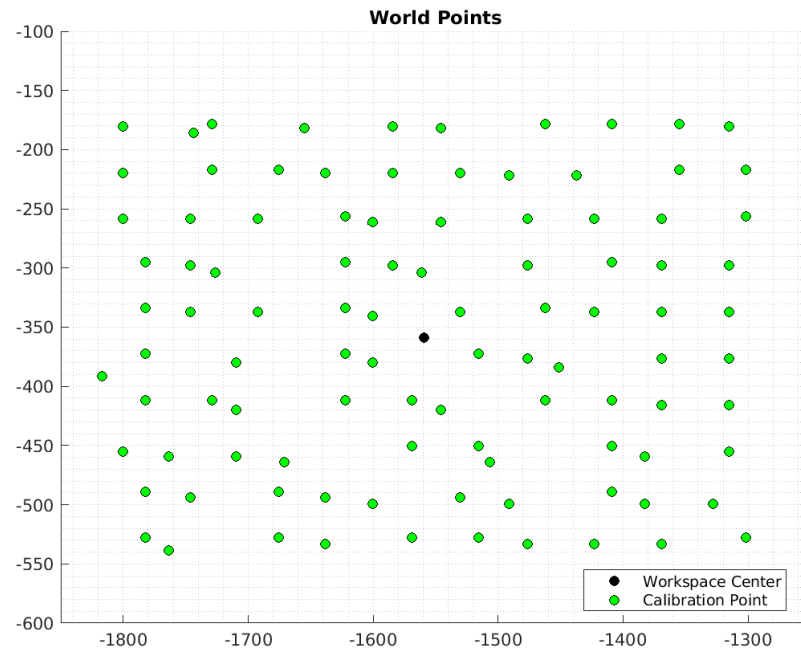
IV Results

2. Procedure robustness to noise : **World** coordinates

noise = ± 1.5 mm

% Points	%Disturb	Average I2W	Max I2W
5	0.5	0.967	8.933
5	0.1	0.427	2.04
5	0.01	0.369	1.03
25	0.5	3.03	14.14
25	0.1	0.740	3.043
25	0.01	0.363	1.062
50	0.5	4.66	21.11
50	0.1	0.975	2.66
50	0.01	0.372	1.071
75	0.5	5.6	18.27
75	0.1	1.08	3.67
75	0.01	0.38	1.15
100	1	15.11	67.53
100	0.5	6.6	21.22
100	0.1	1.9	4.6
100	0.01	0.39	1.09

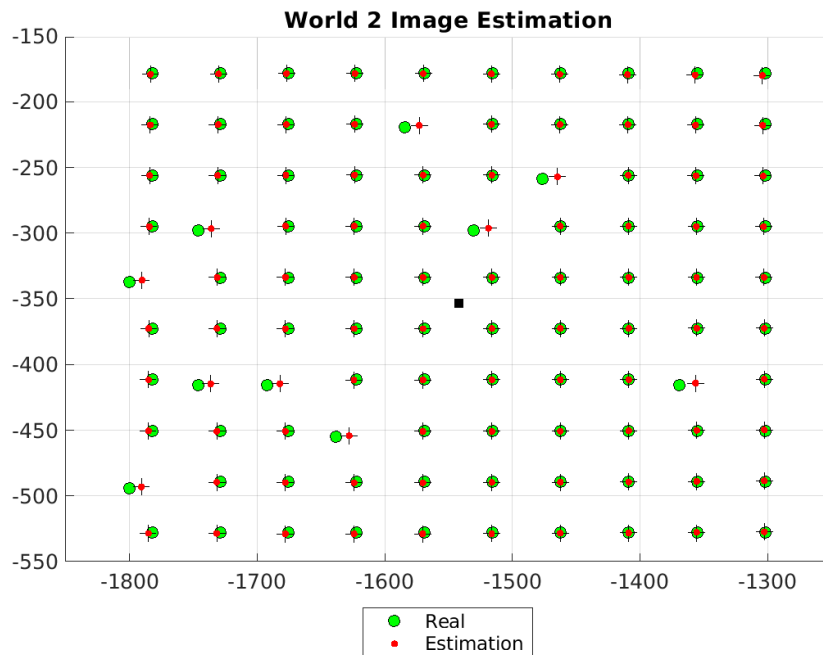
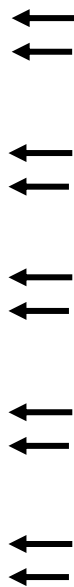
10x10 grid



IV Results

2. Procedure robustness to noise : **Pixel** coordinates

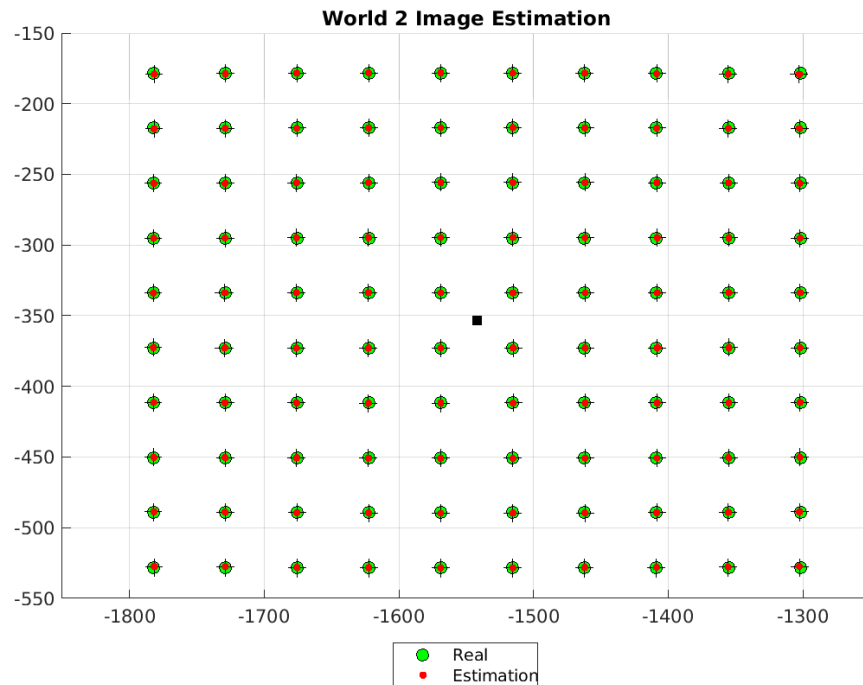
% Points	%Disturb	Average I2W	Max I2W
5	1	0.550	5.17
5	0.5	0.476	2.72
5	0.1	0.365	1.052
5	0.01	0.364	1.039
25	1	1.68	15.94
25	0.5	0.7979	2.28
25	0.1	0.399	1.058
25	0.01	0.3637	1.038
50	1	2.27	15.7
50	0.5	1.179	5.25
50	0.1	0.44	1.23
50	0.01	0.363	1.04
75	1	2.90	12.28
75	0.5	1.553	6.354
75	0.1	0.506	1.575
75	0.01	0.366	1.031
100	1	3.02	11.91
100	0.5	1.42	6.40
100	0.1	0.466	1.2521
100	0.01	0.36	1.0304



IV Results

2. Procedure robustness to noise : **Pixel-World** coordinates

% Points	%Disturb	Average I2W	Max I2W
10	1	2.24	12.55
10	0.5	1.22	6.16
10	0.1	0.45	2.59
50	1	7.48	42.41
50	0.5	3.73	21.62
50	0.1	0.81	2.28
100	1	10.04	36.72
100	0.5	4.57	19.53
100	0.1	1.02	4.41
100	0.01	0.36	1.05

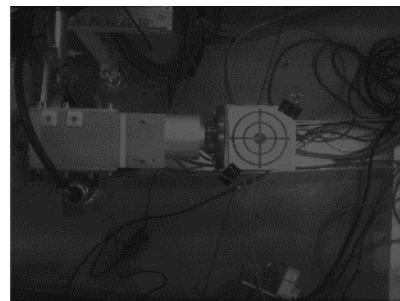


IV Results

3. Procedure **repeatability**

N attempts	Average I2W	Max I2W
5	0.41862	0.78688
10	0.41236	0.76257
15	0.42344	0.76535

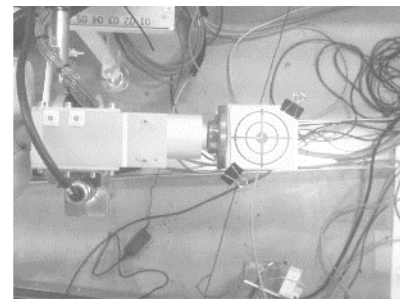
5x5 grid



4. **Robustness to light** exposure

Exposure Type	Average I2W	Max I2W
Gain +15db	0,47105	1,06852
Gain +20db	/	/
Gain -15db	0,47169	1,0577
Gain -20db	0,454242	1,04193

9x9 grid



V Conclusions

What has been done



Robot movement **algorithm**



Plug-and-play **vision application**



Comprehensive **tests**

Results obtained



Ready to be commercialized/employed



Flexible procedure



Desired accuracy performance

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