## Brief discussion on 3D pose estimation based on article: "3D pose estimation of visual markers"

Author: Antonio Badal Regàs

Aziel Martins de Freitas Júnior

SENAI CIMATEC

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Introduction

#### Motivation

Study arised from the need to understand, analyze and improve a computer vision software based on the *ARToolKitPlus* software library.

#### **ARToolKit**

- · First article published in 1999;
- Intended for augmented reality in collaborative office work;
- One user would wear a HMD (head mounted display) to provide others augmented reality visuals.

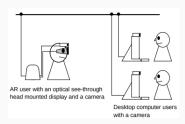


Figure 1: Intended usage.



Figure 2: HMD image.

#### MBV: Marker-based vision systems

- · Dependent on fiducial markers;
- ARtag are commonly used;
- · Tag family for this study was not specified;
- · ARToolKitPlus system was used because of it's accurate readings.

#### Square and circular ARtags

Cons: square AR tags have the disadvantages of occlusion and minimum size detection when in comparison.

Pros: square have low false negative and very low confusion rate when used in groups.



Figure 3: Examples of tags used by the author. Only the square ones were used in the article.

#### Concept - space transformation

- The act of fitting a space image information into a plane;
- Typical of pinhole cameras;
- Two space transformations **may happen** to the acquired image: a rotation and a translation.

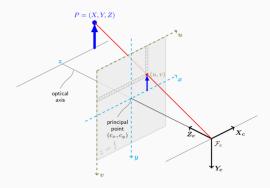


Figure 4: Projection example.

#### Core concept - space transformation

Transformation represented by:

$$v_i = K \times \mathcal{R} \times p_i + \mathcal{T}$$

 $v_i$  is each projected  $p_i$  point of the real world object. K depends on the camera lenses. The world object **may have suffered** a rotation  $\mathcal{R}$  and a translation  $\mathcal{T}$ :

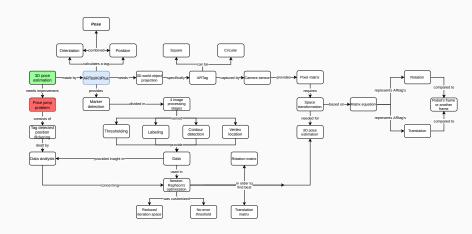
$$s \cdot \begin{pmatrix} u \\ v \\ 1 \end{pmatrix} = K_{3 \times 3} \times \begin{pmatrix} r_{11} & r_{12} & r_{13} \\ r_{21} & r_{22} & r_{23} \\ r_{31} & r_{32} & r_{33} \end{pmatrix} \times \begin{pmatrix} x \\ y \\ z \end{pmatrix} + \begin{pmatrix} T_x \\ T_y \\ T_z \end{pmatrix}$$
(1)

Goal - obtain  $\mathcal R$  and  $\mathcal T$  with iterative error minimization via Newton-Raphson's method.

#### Goals

- · Obtain applicable information on marker identification;
- · Examine software problems and improve item;
- · Test, criticize and improve.

#### Concept map



Problem presentation

#### Pose jump

#### What is pose jump?

 Tag kept in place while RViz shows tag frame in two different places and orientations;

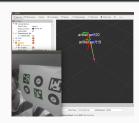


Figure 5: First tag placement.



Figure 6: Second tag placement.

#### Pose jump table

			frame0008.jpg	frame0009.jpg
ARMarker	Position	X	0.17679	-0.18143
t/19		Υ	0.035369	-0.032131
		Z	0.75646	-0.75866
	Orientation	Х	0.85272	-0.015951
		Υ	0.0087774	0.85064
		Z	-0.47053	0.22046
		W	-0.22671	-0.47702
ARMarker	Position	Х	0.067981	-0.076237
t/20		Υ	-0.12292	0.12306
		Z	0.83612	-0.81321
	Orientation	Х	0.88425	-0.088096
		Υ	0.080764	0.87309
		Z	-0.44254	0.12506
		W	-0.12542	-0.46295

Figure 7: Different placement in two different moments.

#### Placement over time

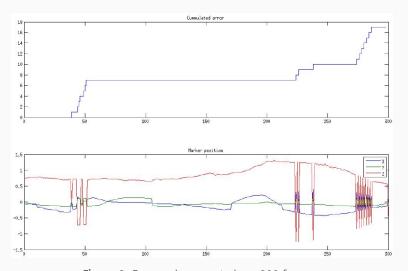


Figure 8: Frame placement along 300 frames.

### Symmetry hint

Clearer sign that symmetry is part of the problem.

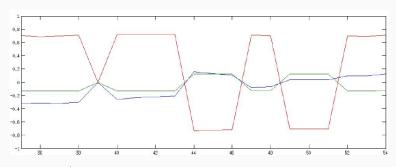


Figure 9: Abrupt changes of Z are origin symmetric.

## and possible issues

Software operation

#### Operation steps

- Camera calibration;
- Marker detection;
- Pose calculation;
- Pose visualization.

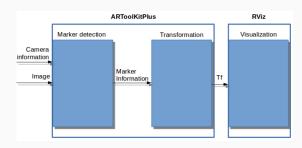


Figure 10: Steps to the output.

#### Core process: marker detection

- · Thresholding;
- · Labeling;
- · Contour detection;
- · Vertex localization;
- Tag identification and localization.

#### Thresholding

Establish intensity limits to tag readability;

Each pixel is evaluated:

$$r + g + b < \text{threshold} \times 3$$

Saves processing efforts on Labeling step.

#### Labeling - image segmentation

Evaluation of image continuity by pixel surroundings analysis.

Top Left	Тор	Top Right	
Left		Right	

Figure 11: Matrix for labeling process.

A pixel shares it's neighbors label whenever they are continuous.

#### Contour detection

Intuitive contour discerning method.

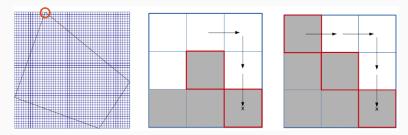


Figure 12: Contour detection process.

#### **Vertex location**

Most distant point pair is located; Line is traced between them; Other vertices are found.

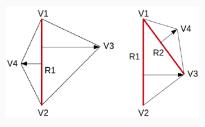


Figure 13: Vertex location.

#### Why all this?

The computations made before provide the inputs; If evaluation results in a valid tag, there will be outputs; The outputs will then provide for the pose estimation.

INPUT	OUTPUT
area	area
position	id
coordinate number	dir
coordinate X	cf
coordinate Y	position
vertex	vertex
	lines

Figure 14: Partial table for evaluated tag.

#### Iterative pose transformation

Newton-Raphson iterative method for minima is applied; Targets:  $\mathcal R$  and  $\mathcal T$  of each vertex.

- Initial guess for  $\mathcal{R}$  and  $\mathcal{T}$ ;
- Guess is applied to the 3D-2D transformation equation;
- The residuals x and y for each vertex are calculated;
- Each pair x<sub>i</sub>, y<sub>i</sub> of residue for each vertex is used to compute the corrections to translation and rotation;
- · Iteration ends when residues are small enough.

#### The culprit

The author excludes camera calibration, marker detection and quaternion transformation as reasons for the pose jump based on the low % error values seen in the table.

That leaves the iteration as the reason.

marker_info	frame0008.jpg	frame0009.jpg	% error
area	2704	2868	6.07
id	20	20	0.00
dir	2	2	0.00
cf	1	1	0.00
Pos[0]	365.6	370.41	1.32
Pos[1]	191.65	189.82	0.95
Line[0]	0.26	0.26	0.00
	-0.96	-0.96	0.00
	124.04	118.07	4.81
Line[1]	0.99	0.99	0.00
	0.067	0.061	8.96
	-354.43	-357.49	0.86
Line[2]	0.13	0.14	7.69
	-0.99	-0.98	1.01
	105.58	99.14	6.10
Line[3]	0.99	0.99	0.00
	0.09	0.09	0.00
	-406.7	-411.15	1.09
Vertex[0]	386.75	391.19	1.15
	232.64	231.52	0.48
Vertex[1]	340.35		1.33
	220.14	218.63	0.69
Vertex[2]	345.02	349.05	1.17
	151.17	150.12	0.69
Vertex[3]	393.77	398.19	1.12
	157.48	157.15	0.21
Conv	0.61		
	0.0623	0.0564	9.47
	-0.7899	-0.7894	0.06
	0.0561	0.0627	11.76

Figure 15: Pose jump error accounted. 22

# Conclusion - proposed solution

#### Actions taken

The iteration error threshold should be turned off so the optimization algorithm does one more attempt at getting small error values;

Iteration algorithm attempts 30 sweeps of 15°; Reduction to sweeps of 5°.

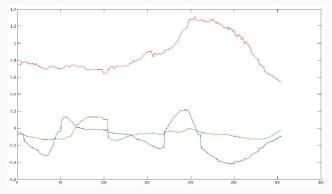


Figure 16: No position jumps registered.