

# IMPLEMENTATION OF REAL-TIME VISUAL TRACKING SYSTEM FOR AIRBORNE TARGETS

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**Abstract:** A real-time visual tracking system is presented for tracking airborne targets. The algorithm is based on intensity difference between background and the target in a gray-scale frame. As the background is uniform for videos of airborne targets, decision is made on contrast between tracking gate boundary and the target inside that rectangular gate. The algorithm is embedded on DSP Starter Kit (DSK) 6713 and a 586 embedded controller is used for servo control and processing. A personal computer (PC) provides the user interface for the system. The performance of the system is verified with different airborne targets from birds to helicopters and its reliability and constraints are presented.

## 1 INTRODUCTION

The field of computer vision has matured to an extent that not only allows to research on individual system components and methods but also building fully integrated systems (Schiele and Sagerer, 2003). Different tracking algorithms have been proposed over the years focusing on different problems. Every algorithm proposed is for a specific application with constraints and assumptions made according to that particular application. A lot of work has been done in visual tracking applications for robotic vision, human tracking, surveillance and other civilian and defence applications (Ribaric, et al., 2004).

Depending upon the type of application, different parameters have been used as reference for tracking including intensity, colour, motion etc. For the robotic vision applications particle filtering (Morelande and Challa, 2005; Mihaylova, et al., 2007), mean shift (Comaniciu, et al., 2000) and other algorithms have been proposed. Applications involving tracking objects from airborne platform are of importance in video monitoring and surveillance and because of complex background

conditions, motion detection and tracking is more suitable (Cohen and Medioni, 1998).

An application of surveillance, monitoring, and range instrumentation is to track airborne targets from ground based platforms. A simple tracking algorithm is required to reduce the complexity of the system and to provide robust performance for this type of applications. In this scenario, complex algorithms are not required as the background is uniform for airborne targets except for the cloudy conditions. Hence, simple intensity based algorithm can be used for segregating the target from the background. Classifiers trained on the basis of intensities to distinguish between the target and the background are used by (Avidan, 2007). In order to achieve high speed tracking performance, the ensemble approach of (Avidan, 2007) is simplified to classification of pixels as background or target on frame to frame basis instead of training classifier based on search rectangles. This can be achieved as the background does not change considerably in successive frames for aerial videos and small strips taken around the track gate can be used to represent the background. For high-speed real-time performance, Digital Signal Processors (DSPs) have been used in visual tracking as well as other

applications (Boni, et al., 1996; Gemignani, et al., 1999).

A real-time visual tracking system using contrast between target and background for air borne targets has been implemented for application in range instrumentation. High speed DSP has been used for image processing alongwith 586 embedded controller for servo control of the tracking mount equipped with optical imaging equipment for video capture.

## 2 REAL-TIME VISUAL TRACKING SYSTEM

A detailed description of each module and the algorithm for the real-time visual tracking system will be given followed by the experimental results and discussion on the performance of the system.

### 2.1 System Architecture

The simplified block diagram of the system is depicted in Figure 1.

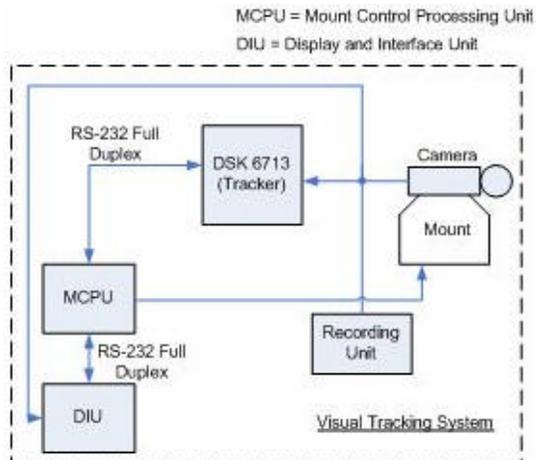


Figure 1: Block Diagram of the visual tracking system.

There are three blocks performing different tasks:

- A personal computer is used as Display and Interface Unit (DIU) to provide a user friendly interface as well as display the tracking video.
- TMS 320C6713 DSP Starter Kit (DSK) is used along with a video daughter card to grab the video frames for image processing and provide real-time target location to the MCPU and DIU for update and display.
- An Intel 586 processor based engine is used as Mount Control and Processing Unit (MCPU)

to transform the tracking error in pixels from the DSP into angular displacement and to position the tracking mount accordingly.

### 2.2 Tracking Algorithm

The tracking algorithm used in the system is based on rejecting the background from a certain region of interest to highlight the target. This is achieved by manually placing a track-gate around the target to specify the region of interest. The boundaries of the track-gate are processed and the corresponding intensity values are marked as the background region. A histogram of the intensities for the region inside the track-gate is made and everything inside the track-gate that has an intensity level different from the range of background intensities is nominated as the target.

As the algorithm is based on the intensity values of the target; therefore, the iris level of the tracking camera should be adjusted to provide high contrast between the target and the background. The initial acquisition is performed by the DIU, where the user clicks on the target such that it is inside the track-gate region identified by the white rectangle on the screen.

### 2.3 Display and Interface Unit

The user interface of the system is designed in Visual Basic (VB) 6.0. A video card is used to capture video in parallel with the DSP kit. The user interface is used to display the real-time video with track gate, the azimuth and elevation feedbacks from the MCPU, and the location of target in pixels from the DSK.

As the DIU is implemented in windows based environment, the track gate is placed by clicking on the video using mouse. The actual video size used for processing in DSK is '352x288' pixels from Common Interchange Format (CIF). However, for better display the video is scaled by a constant multiplier (3 for this system). When the user clicks on the target for initial acquisition, the location of the target is communicated to the DSK and upon receipt of an acknowledgement the track gate turns green to indicate that a lock is obtained. The DSK continually sends the gate target location in pixels to the DIU at a rate of 25 packets per second in conformance with 25 frames/seconds for PAL standard.

Apart from updating gate location, the DIU also provides the facility to change the tracking parameters. The track-gate size can also be adjusted

depending upon the size of the target being tracked by using the arrow keys of the keyboard. Seven different gate sizes supported by the system are given in Table 1.

Table 1: List of gate sizes with their corresponding identification codes.

Gate size	X(pixels)	Y(Pixels)
0	24	20
1	32	32
2	64	32
3	64	64
4	128	64
5	128	128
6	256	128

The location of the target in pixels is received every 40ms from the DSK and is updated on the labels for X and Y axis. The azimuth and elevation values for the mount are also received from the MCPU at the same rate and are displayed on the corresponding label boxes.

## 2.4 Image Processing using DSK 6713

The tracking algorithm used in this system is embedded in the DSK board. Texas Instruments® (TI) TMS 320C6713 DSK board is used for high speed processing and communication. DSK board has been selected to facilitate the up gradation of the tracking algorithm as per requirement in future without much hardware modifications. As the video input/output facility is not available on the DSK board, a third party video daughter card is used for frame capture. The DSK uses the tracking algorithm to calculate the target position in pixels and communicates it to MCPU which relays the packet to DIU. Both the modules update their position accordingly i.e. the DIU updates the track-gate on display, while the MCPU calculates the error between the current and required mount positions and drives the servo to centre the target on screen.

### 2.4.1 Frame Capture and Background Calculation

The video signal from the camera in PAL format is applied to the analogue video input of the daughter card. The video grabbed by the daughter board is

converted into 4:2:2 format of CIF standard with a resolution of 352x288 pixels. Once a frame has been captured by the daughter card, an interrupt is generated to the processor which uses the Enhanced Direct Memory Access (EDMA) channel to load the frame. The communication between the daughter card and the DSK is carried out by high-speed Multi-Channel Buffered Serial Port (McBSP) of the DSK 6713. The second serial port is used as Universal Asynchronous Receiver/Transmitter (UART) for communication between the DSK and other modules of the system.

The region of interest initialised by the user on DIU is extracted from the frame and the gate boundaries are processed within 8 pixels to be labelled as background. The intensity values labelled as background are used as a reference to separate the target within the gate from the background.

### 2.4.2 Histogram Formation and Spatial Model

The gray-scale pixel values from 0 to 255 are initialised as memory locations of an array to represent the histogram. All pixels that fall within background have a value of '0'. The region inside the track-gate is processed and membership function  $\gamma_{target}(x, y)$  given in Equation 1 is used to determine whether the pixel (x, y) belongs to target.

$$\gamma_{target}(x, y) = \begin{cases} 1 & Y(x, y) \notin Y_{Background} \\ 0 & otherwise \end{cases} \quad (1)$$

Where,  $Y(x, y)$  represent the intensity of the pixel (x, y) and  $Y_{Background}$  represents the pixel intensity marked as a member of background region.

The spatial location of the pixels within target as provided by the membership function is used to calculate the centre of the target. The mean location of the target ( $x_{target}, y_{target}$ ) at the time instant k is calculated as (Memon, et al., 2006),

$$\begin{aligned} x_{target} &= \frac{\sum_{(x_i, y_i) \in R} x_i \gamma_{target}(x_i, y_i)}{\sum_{(x_i, y_i) \in R} \gamma_{target}(x_i, y_i)}, \\ y_{target} &= \frac{\sum_{(x_i, y_i) \in R} y_i \gamma_{target}(x_i, y_i)}{\sum_{(x_i, y_i) \in R} \gamma_{target}(x_i, y_i)}, \end{aligned} \quad (2)$$

Where R denotes the search area of the target.



The details of action code and corresponding parameter bytes are given in Table 2. All code values are not used in the system and three bits are reserved for future advancements.

## 2.7 Camera Calibration

Different camera calibration schemes have been proposed over the years for single (Hsu and Aquino, 1999) as well as multiple cameras (Everts, et al., 2006), specially for applications in robot vision systems Corke and Hutchinson, 2000). Recently, self camera calibration schemes have also been introduced to deal with the situations where variable zoom camera is used and no feedback is available for focal length (Li and Shen, 2006).

It has been suggested (Corke and Hutchinson, 2000) that the camera calibration required by robot vision systems is not needed for many applications and simple calibration techniques involving pixel size and focal length can be used for vertical and horizontal angular displacements (Shiao, 2001). If the camera focal length is known, as in this case, Equation 3 can be used to calculate the pan and tilt angles from displacement in pixels.

$$\begin{aligned} q_x &= \tan^{-1} \left( \frac{e_x d_x (t + \Delta t)}{f} \right) \\ q_y &= \tan^{-1} \left( \frac{e_y d_y (t + \Delta t)}{f} \right) \end{aligned} \quad (3)$$

Where,  $f$  stands for focal length,  $e$  represents pixel length and  $d_x$  and  $d_y$  represent the error in pixels for  $x$  and  $y$ -axis respectively.

Equation 3 has been verified using field-of-view of the camera in use and the resolution of the camera by taking different points as reference and moving the mount to get the angular displacement for the predefined pixel displacements. In the case of variable focal length camera, the feedback of the focal length is available via potentiometers, so there is no need for self calibration and same calibration method is used.

## 3 EXPERIMENTAL RESULTS

As the communication protocol is uniform for all communications, initially, only DSK tracker and DIU were used to verify the reliability of the algorithm and its constraints. After initial testing, the MCPU was also interfaced and the loop was

completed with MCPU connected with servo drive and feedback.



Figure 3: Snapshot of the dummy target being tracked by the system.

As the system is designed for airborne targets with assumption of uniform background within track gate, a dummy target was fabricated with a black patch in the centre of a white board. The system was tested on the dummy target with user initialising the tracking system by clicking on the dummy target. The system was able to track the target successfully in stationary as well as moving scenario. The snapshot of the video while the moving dummy target was being tracked is shown in Figure 3.



Figure 4: Snapshot of a helicopter being tracked by the system.

The next step was to track a real airborne target with the system. A number of commercial airlines and helicopters were tracked during this practice. For appropriate contrast conditions (Section 2.2) set by camera opening, the system was able to track the flying targets reliably. Different gate sizes were changed in real-time and it was verified that the system maintains the lock while shifting from one gate size to other. However, if the gate size is much larger than the target size, considerable jitters are added to tracking because of large search area as

compared to the target size. Airborne targets of any speed can be tracked as long as the object does not cover a distance equal to half the track-gate size in successive frames. A snapshot of a helicopter being tracked by the system is given in Figure 4.

Apart from maintaining lock for different gate sizes, the system was also verified to keep the target locked while changing zoom during tracking. As the algorithm uses target and background intensities, it loses lock when the background and the target are very close in intensity i.e. lighting conditions are not good. Further, if there is more than one target in the gate, the system will follow the target with more contrast with the background.

## 4 CONCLUSIONS

A real-time visual tracking system using gray-scale video is implemented for the specific application of tracking airborne targets. The system is designed to identify the target within a track gate, initialised by the user, by rejecting the background extracted from gate boundaries. The system is tested with different airborne targets and speeds and is able to maintain lock on the target provided the required lighting conditions are maintained and the target does not move more than half the gate size between two successive frames. Further, provisions have been provided for future advancements in the system for adding auto-zoom function and algorithm selection for different tracking scenarios.

Future research will be oriented to add motion cue to aid the intensity based tracking system and to improve the algorithm to adapt with different surrounding conditions.

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