

# Development of Computer Algorithms to Control a Wheelchair through the Movement of the Head by Artificial Vision

Ricardo Fuentes Covarrubias<sup>1</sup>, Andrés Gerardo Fuentes Covarrubias<sup>1</sup>, Cristina Conde Vilda<sup>2</sup>,  
Isaac Martín de Diego<sup>2</sup> and Enrique Cabello<sup>2</sup>

<sup>1</sup>Facultad de Ingeniería Mecánica y Eléctrica, Universidad de Colima, Coquimatlán, Colima, C.P. 28440, Mexico

<sup>2</sup>Universidad Rey Juan Carlos (URJC), Escuela Técnica Superior de Ingeniería Informática,  
Tulipán s/n, Mostoles, Madrid, C.P. 62490, Spain

**Keywords:** Biometry, Machine Vision, Automatic Recognition.

**Abstract:** The Purpose of this project is the control of motion and direction in real time of a wheel chair, using machine vision algorithms. The main goal of this project is the signal acquisition from the video camera and collision sensors for post processing in the C# algorithms and later obtaining motor control in the traction mechanism of the wheelchair. The C# algorithm has several tasks. The first is to obtain the real time image from web cam and later processing for the identification of the direction of movement of the human face. The second is to calculate the speed of the movement for generation of the PWM output for motor movement. This information output using the RS232C driver to a microcontroller card attached to a motor control box in the wheel chair mechanism. The final task is to obtain the collision sensor status for security implementation, all in real time. The main reason for development of an implementation of this solution is the use of open source software tools for a more stable platform in the base system due to the characteristics of the end use of the system. The end user of the system will be quadriplegic people.

## 1 INTRODUCTION

This project integrates a solution aimed at controlling a wheelchair by moving the face, using artificial vision techniques and voice command. This article only describes the vision module, and details its main components.

## 2 STATE OF THE ART

Tracking and measuring drivers' eyes published by David Tock and Ian Craw, describing a system of support for driving an automobile by means of the movement of the eyes.

Tracking moving heads--processed by Larry S. Shapiro, Michael Brady, and Andrew Zisserman. This work describes the design of computational algorithms to detect movement of the head using three-dimensional analysis of images.

Control of visually guided behaviors by Jana Kosecka, Ruzena Bajcsy, and Max Mintz. This includes/understands the design of a scheme of guidance for a robot from adjustments of infrared sensors that detect the shift of position of objects

that comprise a scene and is analyzed based on the analysis of the system of coordinates of the real world.

Active exploration of dynamic and static scenes written by David W. Murray, Ian D. Reid, Kevin J. Bradshaw, Phillip F. McLauchlan, Paul M. Sharkey, and Stuart M. Fairley. This describes a technique to recover in real time the trajectories of sprites which move on a plane in a scene. The detection of movement and its segmentation are made in each scene in time, having compared the changes of scenes.

Magic Environment by Luis Figueiredo, Tiago Nunes, Filipe Caetano. With the developed application of environment control, the authors intend to provide the user with a simple and configurable tool according to his or her needs, involving low cost hardware that enables the control of any infrared device or any electric device connected to a radio frequency receiver. A function can be associated to each button in order to control an infrared device, an electric device, or both. The only thing that an eye gaze user will have to do is select the communication picture button whose function he or she intends to activate.

### 3 METHODOLOGY USED

#### 3.1 The Analysis and Recognition of the Face Image

The global structure of the proposed system and interaction with control software is illustrated in Figure 1. The scene is analyzed and the face of the person is located; the person must be at a maximum distance of 20 cm. from the camera without physical contact with the device. It is located at a reference point called the centroid from which references to the centre between the eyebrows is the calculation of the distance between the eyes, nose, and mouth. In this last place the next waypoint marked as detector is the mouth. Once located, the mouth is the comparison between the previous and the current image identifying the movements and changes, as these are defined as optical flow, which indicate the direction towards which such movements are made: left, right, up, or below them that will translate into motor commands sent to the wheelchair.

We use a webcam as the image acquisition device and the image quality is shown in figure 2 in a test pattern routine.

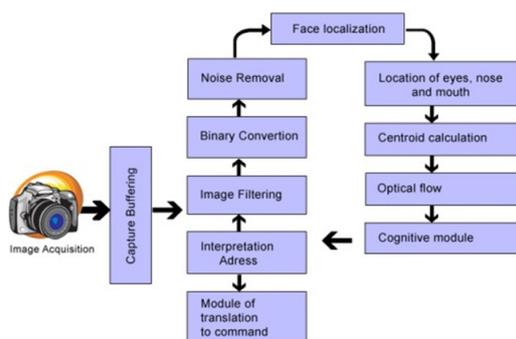


Figure 1: Main scheme of vision system.

The image is captured by a webcam and sent to the capture buffer. The image is filtered and binarized, cleans or removes noise, and later sweeps the scene to locate the face. Once the face is located, it draws a box to locate within the eyes, nose and mouth with a calculation to be described in another section to generate a centroid point which will be between the eyes. This is important because it allows us to detect the mouth to the analysis of the last two frames of the image to identify the sense in which we generated the displacement of the mouth in the optic flow module which will send the cognitive module which is responsible for storing data blocks related to the optical flow. These send the command converter module which sends a command to the

power module and this will activate the motor, thereby achieving wheelchair travel upward to the left, right or backward. This is shown in Figure 2.

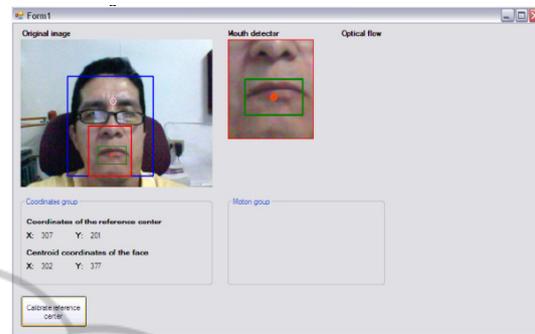


Figure 2: Locating the face image.

#### 3.2 Data Processing

Data processing in the vision system can be played from two perspectives (Seul et al., 2000):

1. Alterations in pixels of data on a global scale (individual)
2. Operations based in multiple locations (neighbourhood)

The generation of the pixels in a new image will be a function of either the value of each individual pixel location or the values of the pixels in the vicinity of a given pixel, as shown in Figure 3.

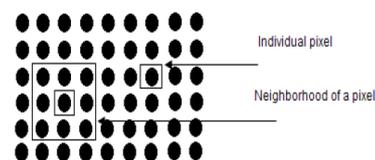


Figure 3: Functions of point and Neighbourhood.

This figure shows the individuality of a pixel which shows the representation of this in a picture. We can also see that the pixel neighbourhood can be 4 or 9 depending on use. Neighbourhood increases the number of neighbours (Parker, 2011).

#### 3.3 Individual Operations (Convolution)

Individual operations involve the generation of a new modified image pixel value in a single location based on a global rule applied to each location of the original image. The process involves having the pixel value at a given location in the image, modifying it by a linear operation or movement, and placing the new pixel value in the corresponding

location of the new image. The process is repeated for each and every one of the locations of the pixels in the original image.

One of the algorithms used in this project is the Haar transform, the simplest of the wavelet transforms. This transform cross-multiplies a function against the Haar wavelet with various shifts and stretches, like the Fourier transform cross-multiplies a function against a sine wave with two phases and many stretches. (Bradsky and Kabler, 2008).

The Haar transform is derived from the Haar matrix. An example of a 4x4 Haar transformation matrix is shown in the figure 4.

$$H_4 = \frac{1}{\sqrt{4}} \begin{bmatrix} 1 & 1 & 1 & 1 \\ 1 & 1 & -1 & -1 \\ \sqrt{2} & -\sqrt{2} & 0 & 0 \\ 0 & 0 & \sqrt{2} & -\sqrt{2} \end{bmatrix} \quad (1)$$

Figure 4: The Haar transform.

The Haar transform can be thought of as a sampling process in which rows of the transformation matrix act as samples of finer and finer resolution.

#### Haar matrix

The 2x2 Haar matrix that is associated with the Haar wavelet is

$$H_2 = \begin{bmatrix} 1 & 1 \\ 1 & -1 \end{bmatrix} \quad (2)$$

Using the discrete wavelet transform, one can transform any sequence  $a_0, a_1, \dots, a_{2n}, a_{2n+1}$  of even length into a sequence of two-component vectors  $(a_0, a_1), \dots, (a_{2n}, a_{2n+1})$ . If one right-multiplies each vector with the matrix  $H_2$ , one gets the result  $((s_0, d_0), \dots, (s_n, d_n))$  of one stage of the fast Haar-wavelet transform. Usually one separates the sequences  $s$  and  $d$  and continues with transforming the sequence  $s$ .

If one has a sequence of length in a multiple of four, one can build blocks of 4 elements and transform them in a similar manner with the 4x4 Haar matrix

$$H_4 = \begin{bmatrix} 1 & 1 & 1 & 1 \\ 1 & 1 & -1 & -1 \\ 1 & -1 & 0 & 0 \\ 0 & 0 & 1 & -1 \end{bmatrix} \quad (3)$$

which combines two stages of the fast Haar-wavelet transform.

Compare with a Walsh matrix, which is a non-localized 1/-1 matrix.

## 4 OPTICAL FLOW

Optical flow is the pattern of apparent motion of objects, surfaces, and edges in a visual scene caused by the relative motion between an observer (an eye or a camera) and the scene. (Aires et al., 2008); (John, 1998). The concept of optical flow was first studied in the 1940s and ultimately published by American psychologist James J. Gibson (Istance et al., 2008) as part of his theory of affordance. Optical flow techniques such as motion detection, object segmentation, time-to-collision, and focus of expansion calculations, motion compensated encoding, and stereo disparity measurement utilize this motion of the objects surfaces, and edges. (Hans and Bernd (eds), 1998); (Parker, 2011).

### 4.1 Lucas Kanade Algorithm

The Lucas-Kanade method (Gary Rost Bradsky, Adrian Kabler, 2008) assumes that the displacement of the image contents between two nearby instants (frames) is small and approximately constant within a neighbourhood of the point  $p$  under consideration. Thus the optical flow equation can be assumed to hold for all pixels within a window centered at  $p$ . namely, the local image flow (velocity) vector  $(V_x, V_y)$  must satisfy

$$\begin{aligned} I_x(q_1)V_x + I_y(q_1)V_y &= -I_t(q_1) \\ I_x(q_2)V_x + I_y(q_2)V_y &= -I_t(q_2) \\ &\vdots \\ I_x(q_n)V_x + I_y(q_n)V_y &= -I_t(q_n) \end{aligned} \quad (4)$$

where  $q_1, q_2, \dots, q_n$  are the pixels inside the window, and  $I_x(q_i), I_y(q_i), I_t(q_i)$  are the partial derivatives of the image  $I$  with respect to position  $x, y$  and time  $t$ , evaluated at the point  $q_i$  and at the current time.

These equations can be written in matrix form  $Av = b$ , where

$$A = \begin{bmatrix} I_x(q_1) & I_y(q_1) \\ I_x(q_2) & I_y(q_2) \\ \vdots & \vdots \\ I_x(q_n) & I_y(q_n) \end{bmatrix}, v = \begin{bmatrix} V_x \\ V_y \end{bmatrix}, \text{ and } b = \begin{bmatrix} -I_t(q_1) \\ -I_t(q_2) \\ \vdots \\ -I_t(q_n) \end{bmatrix} \quad (5)$$

This system has more equations than unknowns and thus it is usually over-determined. The Lucas-Kanade method obtains a compromise solution by the least squares principle. Namely, it solves the 2x2 system

$$\begin{aligned} ATA v &= ATb \text{ or} \\ v &= (ATA)^{-1} ATb \end{aligned}$$

where  $AT$  is the transpose of matrix  $A$ . That is, it computes

$$\begin{bmatrix} V_x \\ V_y \end{bmatrix} = \begin{bmatrix} \sum_i I_x(q_i)^2 & -\sum_i I_x(q_i)I_y(q_i) \\ \sum_i I_x(q_i)I_y(q_i) & \sum_i I_y(q_i)^2 \end{bmatrix}^{-1} \begin{bmatrix} -\sum_i I_x(q_i)I_t(q_i) \\ -\sum_i I_y(q_i)I_t(q_i) \end{bmatrix} \quad (6)$$

with the sums running from  $i=1$  to  $n$ .

The matrix ATA is often called the structure tensor of the image at the point  $p$ .

## 4.2 Canny Algorithm

This method was further refined by J. Canny in 1986 into what is now commonly called the Canny edge detector (Pajarez and De la Cruz, 2002). One of the differences between the Canny algorithm and the simpler, Laplace-based algorithm is that in the Canny algorithm, the first derivatives are computed in  $x$  and  $y$  and then combined into four directional derivatives. The points where these directional derivatives are local maxima are then candidates for assembling into edges. (Bradsky and Kabler, 2008); (Jain et al., 1995).

Canny assumed a step edge subject to white Gaussian noise. The edge detector was assumed to be a convolution filter  $f$  which would smooth the noise and locate the edge. The problem is to identify the one filter that optimizes the three edge-detection criteria (Parker, 2011).

An edge in an image may point in a variety of directions, so the Canny algorithm uses four filters to detect horizontal, vertical and diagonal edges in the blurred image. The edge detection operator (Roberts, Prewitt, Sobel for example) returns a value for the first derivative in the horizontal direction ( $G_y$ ) and the vertical direction ( $G_x$ ). From this, the edge gradient and direction can be determined:

$$\begin{aligned} G &= \sqrt{G_x^2 + G_y^2} \\ \theta &= \arctan\left(\frac{G_y}{G_x}\right). \end{aligned} \quad (7)$$

The edge direction angle is rounded to one of four angles representing vertical, horizontal and the two diagonals (0, 45, 90 and 135 degrees for example).

## 5 EXPERIMENTAL RESULTS

### 5.1 Image Processing

The system source code was developed in C # using open source tools of OpenCV. The main algorithms

involve:

- 1) Acquisition of the image using a Webcam
- 2) Conversion to grayscale
- 3) Binarization and filtering
- 4) Face Detection algorithm by HAAR
- 5) Calculation of centroid to locate points of interest: eyebrows, nose and mouth
- 6) Location of mouth
- 7) Identification of the movements of the face
- 8) Application of Optical Flow algorithm Lukas Kanade (David J. Fleet and Yair Weiss, 2006).
- 9) Data Conversion motor direction commands to the wheelchair

### 5.2 Stage Control

This project aims to develop computer algorithms to provide a sliding unit for quadriplegic people as a guide, by interpreting the movement of the face, finding the mouth, eyes, and nose using artificial vision techniques. It also includes the control stage engine displacement unit which interacts with a computer and in turn with humans in real time as shown in Figure 5.



Figure 5: Integrated system.

The system includes a software-hardware interface which enables or disables the drivers of the wheelchair, interacting with the cognitive module which takes decisions to guide the wheelchair to the place directed by the real-time system.

This system includes the vision module, software-hardware interface, and the control system. It includes the manufacture of a joystick for manual control of the wheelchair and the extended control that includes control of the wheelchair using movements locating the head position of the face.

The proposed project includes the modules shown in Figure 6 below:

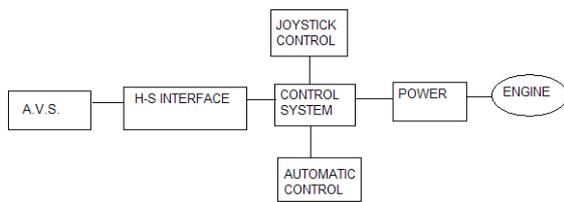


Figure 6: Block diagram of control system.

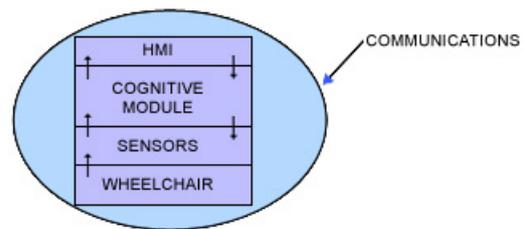


Figure 8: Architecture of the cognitive module.

### 5.3 Artificial Vision System

This module contains the vision algorithms for real-time biometric control which will allow indication of the direction of travel of the wheelchair from the identification of the position of the face. Generated algorithms have been mounted in an embedded system that contains a camera that sends sequences of frames that are processed in real time. Through its analysis, it sends a movement command to the wheelchair control module.

In principle, the system would define the direction of travel of the vehicle from the analysis of facial movement by placement of the user's mouth, as shown in Figure 7.



Figure 7: Integrated system in operation.

## 6 COGNITIVE MODULE

The scope of the proposal includes a set of sensors which interact with the machine vision system to detect environmental conditions that allow the integrated device to provide a level of security. Cognitive applications and human interfaces of the system and the application of cognitive skills are needed to develop awareness of the environmental situation monitored. Cognitive capabilities of the system will allow both the differential capacity supervised and unsupervised (though always validated by a human operator), to learn from the experience. The following figure 8 presents a high-level architecture of the proposed system.

The system will integrate an automatic "cognitive" to ensure a high level of security through the following capabilities in real time:

- Detection and evaluation of the environment surrounding the wheelchair
- Intrusion detection (people, animals or moving objects) in the security area of the wheelchair
- The detection of dangerous situations for the driver of the wheelchair, such as end of the road, dangerous edge, and objects prone to collision with the wheelchair
- Automatic reports of the situation when the right set of people use predefined procedures based on risk level assigned previously

The proposal includes the development of a model for profiling risks that can be used to recognise abnormal behaviour, as well as the means to identify the source of the security alert, tracking and back-tracking capabilities to establish the abnormal pattern, decision support mechanisms to establish an action plan, as well as the means to report to the operator and to distribute the information to the appropriate security personnel.

## 7 CONCLUSIONS AND FUTURE DEVELOPMENTS

In this paper we propose a control application of a device for driving the movement of a disabled person using computer vision techniques in real time. Due to space restrictions we are not including a description of the other algorithms and hardware modules used in future studies, or the description of the algorithms used in the vision system from the point of view of the system integrated with the rest of the modules that make up the system, including a control module for voice command which is in its early development and testing.

## REFERENCES

- Michael Seul, Lawrence O’Gorman, Michael J. Sammon. 2000. *“Practical Algorithms for Image Analysis”*. Cambridge University Press.
- Kelson R. T. Aires, Andre M. Santana, Adelardo A. D. Medeiros. 2008. *Optical Flow Using Color Information*. ACM New York, NY, USA. ISBN 978-1-59593-753-7.
- Daugman John, 1998. Phenotypic versus Genotypic approaches to face recognition. University of Cambridge, *The Computer Laboratory*.
- Howell Istance, Olga Štěpánková and Richard Bates. September 2008. “Communication, Environment and Mobility Control by Gaze.” Prague. *Proceedings of COGAIN 2008*, Edited by Howell Istance, Olga Štěpánková and Richard Bates. ISBN 978-80-01-04151-2.
- Burkhardt Hans y Neumann Bernd (eds). 1998. Computer vision ECCV’98. *5th European conference on computer vision*. Vol. I. Alemania: Springer.
- J. R. Parker. 2011. “Algorithms for Image Processing and Computer Vision” *Wiley Publishing Inc*.
- Gary Rost Bradsky, Adrian Kabler. 2008. *“Learning OpenC.”* O’Reilly.
- Pajarez Martinsanz Gonzalo, De la Cruz Garcia Jesus M. 2002. *“Vision por Computador”* Alfaomega Ra-Ma.
- Ramesh Jain, Rangarchar Kasturi and Brian G. Schunck. 1995. *Machine Vision*. Mc Graw Hill.
- David J. Fleet and Yair Weiss. 2006. “Optical Flow Estimation.” In Paragios et al. *Handbook of Mathematical Models in Computer Vision*. Springer. ISBN 0387263713.