# Design and Implementation of Embedded Driver Fatigue Monitor System

#### H.M. Shen

School of Electromechanical Engineering and Automation Shanghai University, China

Abstract-In order to improve the performance of embedded driver fatigue monitor system, this article designed and implemented a new system based on Soc. This design adopts the ARM as the core processor which is connected to other peripheral by FPGA. The system also uses the embedded Linux to run the main algorithm which consists two Haar-Adaboost classifier to locate the eyes and classify the status of eye by support victor machine. At last by using PERCLOS standard the system will judge whether the driver is fatigue. Experimental results show that the system has a good real-time performance and the processing rate can reach 25 frames per second.

#### Keywords-fatigue; embedded; PERCLOS; classifier

#### I. Introduction

Fatigue driving is one of the main reasons for the frequent occurrences of traffic accident today, so the research design and implementation of fatigue driving early warning technology are urgently needed.

Because of the massive calculations of features and limited embedded processor ability, the current realizations on embedded platforms are mainly on DSPs platform. Zhu's detection algorithm is only 3 frames per second on the DSP [1]. Cheng achieved 19 frames per second on DSP platform[2]. Although the detection rate at 19 frames per second has entered the threshold of the real-time detection, it is still not enough to prevent fatigue driving.

In this article, a new system is designed and implemented and the speed can reach to 25 frames per second which can timely alert when the driver is fatigue.

#### II. SYSTEM DESIGN

The whole system hardware framework is shown in figure 1. The APU is the main processing core.850-nm wavelength of infrared camera is used to obtain face images. The FPGA is used to drive AD7511 to display. High-speed SD memory card is used to store the embedded system and FPGA configuration files. The whole system uses DDR3.

#### M.H. Xu

School of Electromechanical Engineering and Automation Shanghai University, China

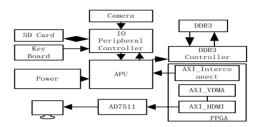


FIGURE I. THE HARDWARE DESIGN OF DRIVER FATIGUE MONITOR SYSTEM

The process of the Fatigue driving warning system is shown in figure 2. The whole system can be divided into four modules: image detection, image process, fatigue detection and real-time display.

The image detection module mainly uses the infrared camera which can reduce the influence of light. Image process module mainly includes image scaling, grayscale conversion and calculation of the integral figure. The fatigue detection module includes face detection, eye detection and fatigue judging. The real-time display module displays real-time face images, test results, and fatigue states of alarm information.

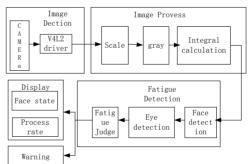


FIGURE II. SYSTEM WORK FLOW

# III. THE REALIZATION OF THE ALGORITHM

## A. Image Capture

Because of the great influence of environmental light, especially in the day, normal camera is unable to meet the requirements. So the system adopts the infrared camera with the infrared light source. And in order to improve the accuracy,

infrared human faces and traditional faces should be collected and trained.

## B. Image Process

After captured the infrared image, the image will be reduced and conversed to grayscale. As mentioned in the previous section, the system need to detect human faces and eyes before judging the state of eyes. Viola and Jones [3] proposed a method of fast target detection framework which is one of the best methods, so this article adopts their framework. In the framework the integral figure should be calculated. Integral figure is in order to accelerate the Haar feature extraction. And the equation is

$$I(x,y) = \sum_{\substack{x \le x \\ y \le y}} i(x,y) \tag{1}$$

After the traversal of integral graph, a rectangular area on the grey value can be calculated by the following formula which can be seen as figure 3.

$$I(x,y) = I(x,y) + I(x-1,y) - I(x,y-1) - I(x-1,y-1)$$
(2)

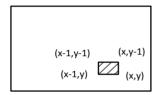
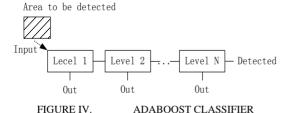


FIGURE III.

THE EXAMPLE OF INTEGRAL CALCULATION

#### C. Face Location

After the calculation of the integral figure, haar features will be imported to face Adaboost classifier. The Adaboost cascade classifier is composed of a series of weak classifiers. And most of the area can be ruled out after previous levels of weak classifiers which is shown in figure 4.



The target's coordinates will be return once the target has been successfully classified.

# D. Eye Location

After located the human face, eyes will also be located by Haar-Adaboost classifier. In this article, the classifier is trained by 36 x 15. Similarly, after the eyes has been detected, the image coordinates will be return.

#### E. The Classification of Eye State

After the location of eyes, system will analyze the eyes' state by the support vector machine[4] to determine whether the eye meet PERCLOS standard[5]. According to the P80 of

PERCLOS standard, the eyes are closed when the eyelids cover 80% of the pupils. And experiences show that the binary pixels are directly related to the samples' characteristics. Generally, the general linear classifier will be considered at first. And the expression of the liner classifier is as follow.

$$f(x) = \operatorname{sgn}(\sum_{i=1}^{n} \alpha_i y_i(x_i \cdot x) + b)$$
(3)

Due to the nonlinear characteristic, the system adopts the nonlinear classifier which uses the RBF kernel rather than the linear classifier[6][7]. And the expression of the nonlinear classifier is as follow:

$$f(x) = \operatorname{sgn}(\sum_{i=1}^{n} \alpha_i y_i K(x_i \cdot x) + b)$$
(4)

$$k(x_i, x) = \exp(-\frac{||x_i - x||}{\sigma^2})$$
 (5)

Among them, the  $\sigma$  takes 0.01.

#### F. Fatigue Analysis and Judgment

According to the standard of P80 of PERCLOS, the equation to judge the driver's fatigue is

$$PERCLOSE = \frac{frames of closed eyes}{all frames} \times 100\%. \tag{6}$$
 Within a certain time T, frames of closed eyes N make up

Within a certain time T, frames of closed eyes N make up 80% or more of the total number of frames in T will be called fatigue driving which is shown in figure 7.

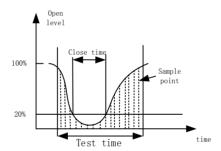


FIGURE V. PERCLOS DIAGRAM

When the human's body is tired, in the blink of an eye, the time of closed eyes will be more than 1 second. The results show that when detection time T is stetted to be one second, the frames of closed eyes will be more than 17.And the value of PERCLOS will be greater than 68% which can be used to judge whether the driver is fatigue.

# IV. DESIGN AND IMPLEMENTATION OF THE EMBEDDED SYSTEM

# A. The Design of Soc

The realization of the system mainly on the platform of Zynq-702 suite. The ARM-A9 is used as the processor. The implementation of system need to use the Soc design software[8]and the configurators of the system which are shown in figure 8 and 9.



FIGURE VI. FPGA MODULE CONNECTION DIAGRAM

Zynq Bus Interfaces Port	s Addresses						
instance	Base Name	Base Address	High Address	Size	Bus Interface(s)	Bus Name	Lock
processing_system7_0's Addres							
processing_system7_0	C_DDR_RAM_B	0x000000000	0x3FFFFFFF	1G			4
-axi_iic_0	C_BASEADDR	0x41600000	0x4160FFFF	64K	■ S_AXI	axi_interconnec	- 17
axi_vdma_0	C_BASEADDR	0x43000000	0x4300FFFF	64K	S_AXI_LITE	axi_interconnec	E
- axi_hdmi_tx_0	C_BASEADDR	0x70E00000	0x70E0FFFF	64K	■ S_AXI	axi_interconnec	
axi_spdif_tx_0	C_BASEADDR	0x75C00000	0x75C0FFFF	64K	DXA_2 🐷	axi_interconnec	
- axi_clkgen_0	C_BASEADDR	0x79000000	0x7900FFFF	64K	■ S_AXI	axi_interconnec	
processing_system7_0	C_UART1_BASE	0xE0001000	0xE0001FFF	4K			7
- processing_system7_0	C_USBO_BASEA	0xE0002000	0xE0002FFF	4K			1
processing_system7_0	C_GPIO_BASEA	0xE000A000	0xE000AFFF	4K			V
processing_system7_0	C_ENETO_BASE	0xE000B000	0xE000BFFF	4K			1
processing_system7_0	C_SDIOO_BASE	0xE0100000	0xE0100FFF	4K			7

FIGURE VII. ADDRESS ASSIGNMENT OF EACH MODULE

#### B. Experiment

In this article, the embedded system consists of two parts, including Linaro file system and the Linuxkernel [9][10]. The hardware is shown in figure 10, which mainly include infrared camera, SD card, power supply and development board. The working system is shown in figure 11.



FIGURE VIII. MAIN DEVICES OF THE SYSTEM

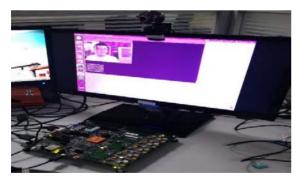


FIGURE IX. THE WORKING SYSTEM

Through the tests of five volunteers, the experimental results show that in the distance of 0.5 meters to 0.9 meters, this system can run very well. In the night, when the volunteer is tired the alarm information will be displayed which is shown in figure 12. The processing rate on PC can be seen in Figure 13.



FIGURE X. THE SCREENSHOT OF EMBEDDED PLATFORM



FIGURE XI. SYSTEM TEST ON PC

TABLE I. HE TESTING RESULTS

tester	Testing time	Success detection	accuracy
A	200s	91.6%	91.2%
В	200s	91.3%	92.1%
C	200s	90.7%	90.2%
D	200s	92.5%	92.6%
E	200s	90.1%	91%

V. CONCLUSION

These results show that this system not is only real-time but also can achieve high precision. And the implementation of this system has great significance for the miniaturization of auxiliary system in the future.

#### ACKNOWLEDGEMENTS

This work was financially supported by the financial support of Shanghai Economic and Information Technology Committee by the Annual Projects for Absorption and Innovation of Shanghai Imported Technology under Grant (No.11XI-15), the funded project of the national natural science foundation under Grant (No. 61376028) and the funded project of the Shanghai Science and Technology Commission under Grant (No. 13111104600).

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