

Vision-based Hand Gesture Recognition for Human-Computer Interaction

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1 Introduction

In recent years, research efforts seeking to provide more natural, human-centered means of interacting with computers have gained growing interest. A particularly important direction is that of

the object of interest. The reason appears to be its local scope in combination

canvas [LWH02, WLH01]. Methods that relate to hand-driven control focus on the detection and tracking of some feature (e.g. the fingertip, the centroid of the hand in the image etc) and can be handled with the information extracted through the tracking of these features. The second type of interaction involves the recognition of hand postures, or signs, and gestures. Naturally, the vocabulary of signs or gestures is largely application dependent. Typically, the larger the vocabulary is, the hardest the recognition task becomes. Two early systems

Clearly, because of the pixel-by-pixel image comparison, template matching is

network is tr

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the image, based on optical flow. The extremal points of the trajectory were detected and used as gesture classification features. In [CBA⁺96a], the 3D trajectories of hands are acquired by stereo vision and utilized for HMM-based learning and recognition of gestures. Different feature vectors were evaluated as to their efficacy in gesture recognition. The results indicated that choosing the

mand or message from the user to the system, require that the posture and motion of hands is recognized and interpreted. Early gesture recognition applications supported just a few gestures that signified some basic commands or concepts to the computer system. For example in [DP93], a monocular vision system that

control a slide presentation. The systems in [ZNG⁺04] and [CRMM00, MMR00], recognize a few hand postures for the control of in-car devices and non-safety systems, such as radio/CD, AC, telephone and navigation system, with hand

3 The Proposed Approach to Human-Robot Interaction based on Hand Gestures

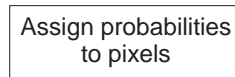
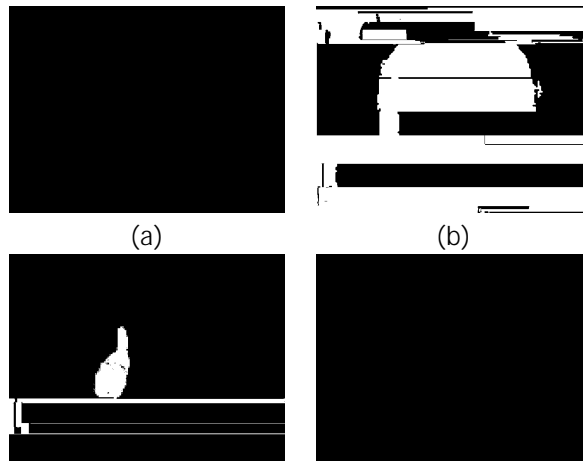


Fig. 1: Block diagram of the proposed approach for hand tracking and gesture



Fig. 4:

3 The Proposed Approach to Human-Robot Interaction based on Hand G(ot)-342Ds



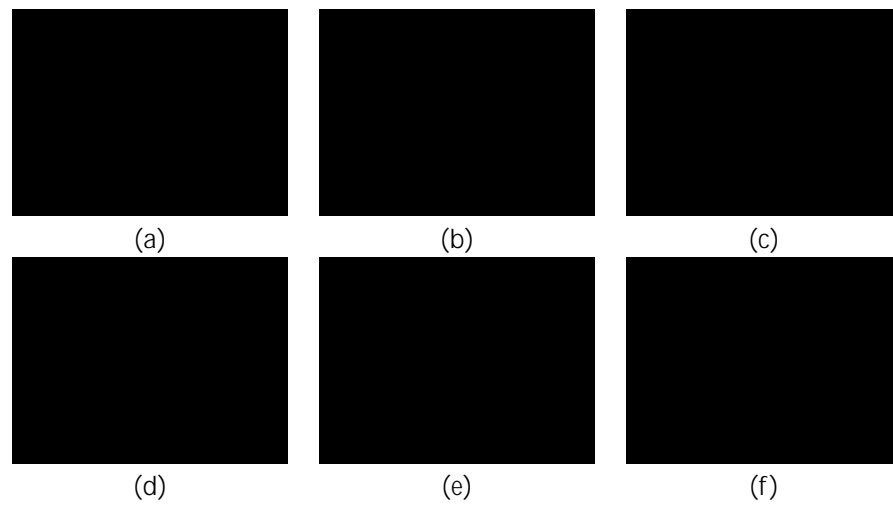


Fig. 7: Six frames of a sequence depicting a man performing gestures in an office environment.

Additionally, in this paper we have presented a novel gesture recognition system intended for natural interaction with autonomous robots that guide visitors in museums and exhibition centers. The proposed gesture recognition system

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