

Survey on Gesture Recognition for Hand Image Postures

Rafiqul Zaman Khan¹ & Noor Adnan Ibraheem¹

¹ Faculty of Science, Department of Computer Science, Aligarh Muslim University, Aligarh, India

Correspondence: Rafiqul Zaman Khan, Faculty of Science, Department of Computer Science, Aligarh Muslim University, Aligarh, 202002, India. Tel: 91-955-710-4757. E-mail: rzkhan.cs@amu.ac.in

Received: January 11, 2012 Accepted: February 29, 2012 Online Published: May 1, 2012

doi:10.5539/cis.v5n3p110

URL: <http://dx.doi.org/10.5539/cis.v5n3p110>

Abstract

One of the attractive methods for providing natural human-computer interaction is the use of the hand as an input device rather than the cumbersome devices such as keyboards and mice, which need the user to be located in a specific location to use these devices. Since human hand is an articulated object, it is an open issue to discuss. The most important thing in hand gesture recognition system is the input features, and the selection of good features representation. This paper presents a review study on the hand postures and gesture recognition methods, which is considered to be a challenging problem in the human-computer interaction context and promising as well. Many applications and techniques were discussed here with the explanation of system recognition framework and its main phases.

Keywords: computer vision, hand posture, hand gesture, hand gesture recognition, human computer interaction (HCI), virtual reality

1. Introduction

Gestures considered as a natural way of communication among human, since it is a physical movement of hands, arms, or body which conveying meaningful information. Gesture recognition then, is the interpretation of that movement as semantically meanings command. Gesture recognition has been studied in widely topics, and has a wide range of applications such as recognizing of sign language, human computer interaction (HCI), robot control, machine vision, smart surveillance, visual environments manipulating, etc (Ibraheem, 2011).

Although the term hand gesture and hand posture refers to the same meaning but there are some differences between them. Hand posture can be defined as the static movement, holding the hand with specific pose is a posture, for example a victory sign, pointing, and thumbs up. While in a complex posture, the fingers could be bent at any angle. The gesture can be defined as a dynamic movement, such as waving good-bye (Pavlovic, 1997; Mitra, 2007). A complex gesture is one that includes three things as mentioned by Mitra (2007) which are finger movement, wrist movement and changes in the hand's position and orientation. Examples of this type of gesture are the American Sign Language signs (Pavlovic, 1997).

Present approaches can be divided into Vision Based approaches and Data-Glove approaches. Data-Glove based approaches need a cumbersome devices have to be wore by user which connect the device to the computer, and that would reduce the natural level of the user's interaction with the computer (Mitra, 2007), for more details about data glove approaches, a survey on data glove are available in (Dipietro, 2008). Vision-based approaches, deals with some properties such as texture and color (Mitra, 2007) for a gesture analyzing; while tracking devices cannot. The number of cameras used by those techniques can be different; the speed and latency; and the environment structure, such as lighting condition or movement speed restrictions (Mitra, 2007). Examples of vision-based approaches are mentioned in (Zhu, 1998; Porta, 2002). Figure 1 shows an example of vision based and data glove based system.

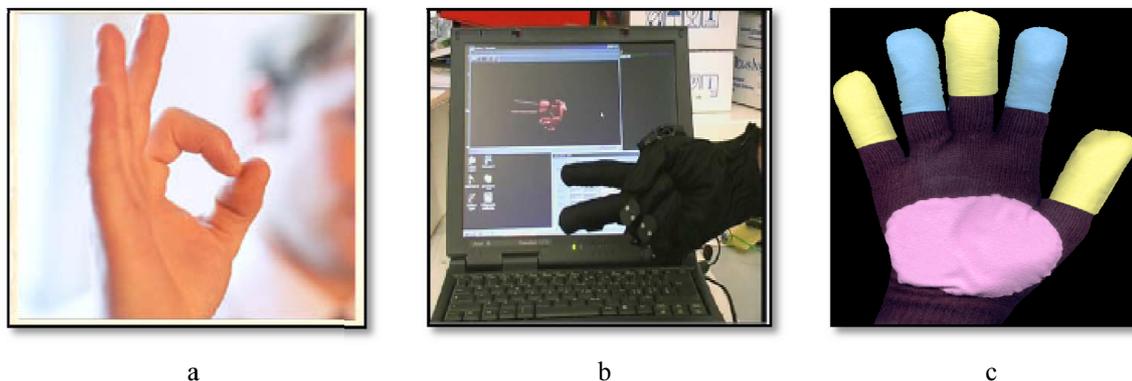


Figure 1. Examples of data glove based and vision based approaches

a. vision based (from image gallery); b. data-glove based (Dipietro, 2008); c. colored glove (Lamberti, 2011).

Min (1997) classified hand gesture recognition system into several categories. Pavlovic (1997) presented a psychological aspects of gestures. A slightly updated version of this classification is given in Table 1.

Table 1. Hand gesture recognition system classification

Category	Type
Application	Sign Language, Robot Control, Tracking Gesture, Games
Motion	Static, Dynamic
Image acquired data	Camera(s), Video, Data Glove Instrumented Device, Colored Glove
Data dimensions	2D , 3D
number of hands used	One hand, two hands
Input features	3D Hand Model, Appearance Based, Low Level Features
Gestures modality	Communicative, Manipulative

Although other surveys have been done with various subsets of hand posture and gesture recognition (Pavlovic, 1997; Moeslund, 2001; Erol, 2007), this work is related to the vision based approaches and is up-to-date, and representing a good starting point for investigators interested in the field of hand postures and gestures as well.

The organization of this paper is as follows: Section 2 demonstrates approaches for hand posture and gesture recognition. Application areas for hand posture and gesture recognition are given in Section 3. Section 4 explains recognition system methodology. Conclusion of this paper is explained in Section 5.

2. Approaches for Hand Posture and Gesture Recognition

Gesture system can be one of the following three states, glove based, vision based and low level features based (Murthy, 2009), the vision based represents the most promising and effective alternative for glove based approaches that depends on sensors and wires which considered costly. The vision based needs camera(s) attached to a robot, and the gesture recognition algorithm responsible for translating the human gestures into a command to be carried out by the machine or robot (Hasan, 2011a).

A. 3D Hand Model based Approaches: Many methods have already been applied to analysis, model, and represent the hand shape, which gives a copious description and make a wide range of human hand to be represented, and a large database for storing the extracted shape characteristics is needed as well. Since 3D hand model has many DOFs besides the hand is an articulated deformable object, features extraction process became more difficult and formed an obstacle with already existing problems with 3D model based approach (Bilal, 2011).

B. Appearance based approaches: Also known as View Based Approaches, which model the hand using the intensity of 2D images and define the gestures as a sequence of views. Appearance based approaches considered easier than 3D model approaches, which led many researchers to search for alternative representations of the hand (Murthy, 2009; Hasan, 2011a).

C. Low Level Features based Approaches: Some gesture applications required a mapping between the input video and the gesture. Many researchers considered the full hand reconstruction is not essential for gesture system (Murthy, 2009; Hasan, 2011a). An example of low level features is, some geometric features which can be extracted quickly and considered robust to noise (Murthy, 2009). Low-level features include: the centroid of the hand region (Pavlovic, 1997), an elliptical bounding region of the hand, edges, regions (Pavlovic, 1997), silhouettes (Erol, 2007), moments, and histograms (Pavlovic, 1997; Bilal, 2011).

3. Application Areas for Hand Postures and Gestures

Various applications have been used for hand postures and gestures as alternative level of interaction in different application domains, as mentioned in (Mitra, 2007): including virtual environments, smart surveillance, sign language translation, medical systems etc. This section gives a brief overview of some gesture recognition application areas (Mitra, 2007; Joseph, 1999). Hardware decreasing and reducing the processing cost can play a major factor for making the gesture recognition system the future setting and can offer more practical areas as well (Garg, 2009). Table 2 demonstrates some applications on gesture recognition system.

3.1 Sign Language Recognition

Sign language considered as an important and interesting application fields of hand posture and gesture recognition system (Joseph, 1999), where many systems have been applied for this purpose (Joseph, 1999). Sign language has special importance for communications since the gestures are the way used for interpretation and explanation of specific subject (Murthy, 2009). It can be used for disabled people when communicating with the other people, and with the computer as well (Murthy, 2009). American Sign Language in (Vogler, 2001; Starner, 2002) is one example that has received significant attention in the gesture literature. Kim (1996) recognized Korean Sign Language (KSL). Cho (2006) define a new gesture recognition algorithm for Korean scripts. Liang (1998) introduced lexicon of 250 vocabularies in Taiwanese Sign Language (TWL), Maraqa (2008) recognized Arabic Sign Language (ArSL). Murakami (1999) recognized Japanese sign language alphabets and words, they could recognize 42 alphabets and 10 words using two types of Neural Networks.

3.2 Robotics, Human Manipulation and Instruction

One of the effective applications that can utilize hand postures and gestures is robot tele-manipulation (Joseph, 1999). Telerobotic applications are typically classified under space exploration and military research domain (Murthy, 2009). Using gestures for controlling robots is corresponding to virtual reality interaction system (Murthy, 2009). Recent researches used postures and gestures to learn the robot some interaction commands by explaining its appropriate meaning for the robot as an action (Joseph, 1999). Various researches for robot control applications are implemented in (Malima, 2006; Wang, 2003; Bertsch, 2009).

3.3 Virtual Reality

For virtual reality application gestures have considered as one of the effective spreading stages in computing area (Murthy, 2009). Virtual reality interaction uses the hand gesture to manipulate the virtual movements using one or two hands for 2D and 3D interactions display (Murthy, 2009). Some virtual reality applications are available in (Bertsch, 2009; Rodriguez, 2008; Guan, 2008). Thomas (2008) worked with multimodal user interfaces that include visual, acoustic and haptic I/O. Based on the Wii controller hardware.

3.4 Gesture-to-speech

Gesture-to-speech application which converts hand gestures into speech, this system enables hearing-impaired people to communicate with their surrounding environments through computers and interacts easily with other people even without the knowing for the sign language (Joseph, 1999). Fels (1993) and Fels (1998) introduced Glove Talk system interface between speech synthesizer using data glove device which mapping hand-gestures to speech using neural networks.

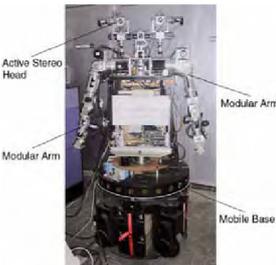
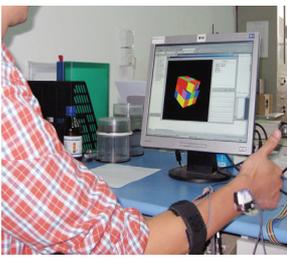
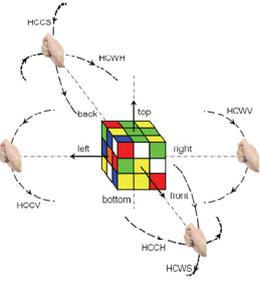
3.5 Games

For computer games, Xu (2009) applied gesture recognition on virtual game applications. Chambers (2002) used hierarchical recognition of human gestures for sports video annotation. Rautaray (2010) implemented computer vision and gesture recognition techniques, and developed a vision based low cost input device for controlling the VLC player through gestures.

3.6 Television Control

Last application for hand postures and gestures is controlling Television devices (Joseph, 1999). Freeman (1995) developed a system to control a television set by hand gestures. Using an open hand and the user can change the channel, turn the television on and off, increase and decrease the volume, and mute the sound.

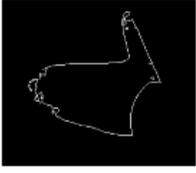
Table 2. Applications on gesture recognition system

Reference	Applicaiton
(Yin, 2007)	<div style="display: flex; justify-content: space-around;"> <div style="text-align: center;">  <p>a</p> </div> <div style="text-align: center;">  <p>b</p> </div> </div> <p>Human robot interaction. (Yin, 2007) a. humanoid service robot HARO-1; b. virtual robot.</p>
(Rautaray, 2010)	 <p>Gesture interface used to control the VLC player: stop operation stop</p>
(Xu, 2009)	<div style="display: flex; justify-content: space-around;"> <div style="text-align: center;">  <p>a</p> </div> <div style="text-align: center;">  <p>b</p> </div> </div> <p>Performing hand gesture to control the virtual game control a. rubik's cub game implementation; b. rubik's cub game.</p>

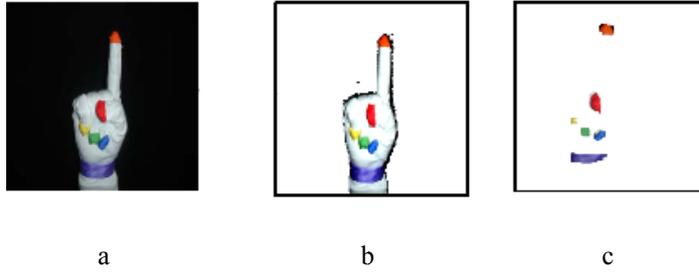
When the input gesture acquired from colored camera, instrumented glove device or colored glove as shown in Figure 1. The first step is segmentation, to extract the hand region from the input image and isolate it from the background (Hasan, 2010). There are two main methods for object segmentation, first method depends on the color model that can be extracted from the existence RGB color model which could be HSV color model (Hasan, 2010; Hasan, 2011a ; Mo, 2011) or YCbCr color space (Stergiopoulou, 2009); which deals with the pigment of the skin of the human hand (Hasan, 2010), the significant property of this color space is that the human different ethnic group can be recognized according to their pigment concentration which can be distinguished according to some skin color saturation (Hasan, 2010). Then, the hand area is isolated from the input gesture with some threshold value. Some normalization for the segmented image might require for obtaining the gestures database which should be invariant against different perturbations like translation, scaling and rotation (Hasan, 2010). The database created with many samples per single gesture, the relation between the number of samples and the accuracy is directly proportional, and between number of samples and the speed is inversely proportional (Hasan, 2010).

Hasan (2010) used HSV color model to extract the skin-like hand region by estimating the parameter values for skin pigment, and used Laplacian filter for detection the edges. Stergiopoulou (2009) used YCbCr color model to segment the hand. Maraqa (2008) used color glove for input gestures and HSI color space for the segmentation process. Ghobadi (2008) treated the segmentation process as clustering method by grouping the image pixels among image objects. Lamberti (2011) used HSI color model to segment the hand object. Table 3 shows some applications of the segmentation methods used in the discussed method.

Table 3. Segmentation process from different hand gesture recognition methods

Reference	Segmentation Process			Description
(Hasan, 2010)	 <p style="text-align: center;">a</p>	 <p style="text-align: center;">b</p>	 <p style="text-align: center;">c</p>	<p>HSV color model used to extract the hand region, and Laplacian filter for detection the edges.</p>
Segmentation phases				
a. input image; b. segmented image; c. edge detection.				
(Stergiopoulou, 2009)	 <p style="text-align: center;">a</p>	 <p style="text-align: center;">b</p>	<p>YCbCr color model used to segment the hand.</p>	
Hand segmentation				
a. original image; b. segmented hand.				

(Maraqa, 2008)

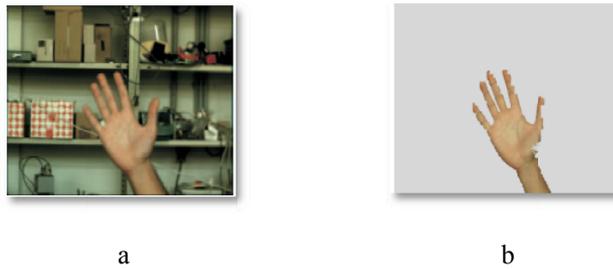


HSI color space used for the segmentation process.

Color image segmentation process

a. input hand glove image; b. segmented hand; c. segmented colors of the glove.

(Ghobadi, 2008)



Clustering method used for segmentation by grouping the image pixels among image objects.

Hand segmentation

a. input image; b. segmented image.

(Li, 2003)

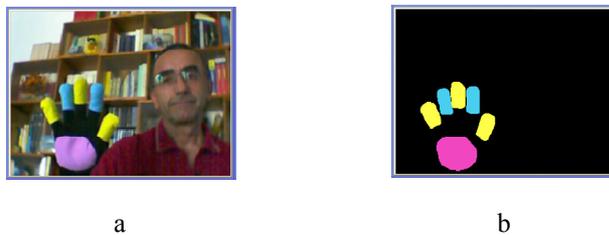


Transformed the image from RGB to HSV space and segment the hand.

Hand segmentation

a. input image; b. segmented image.

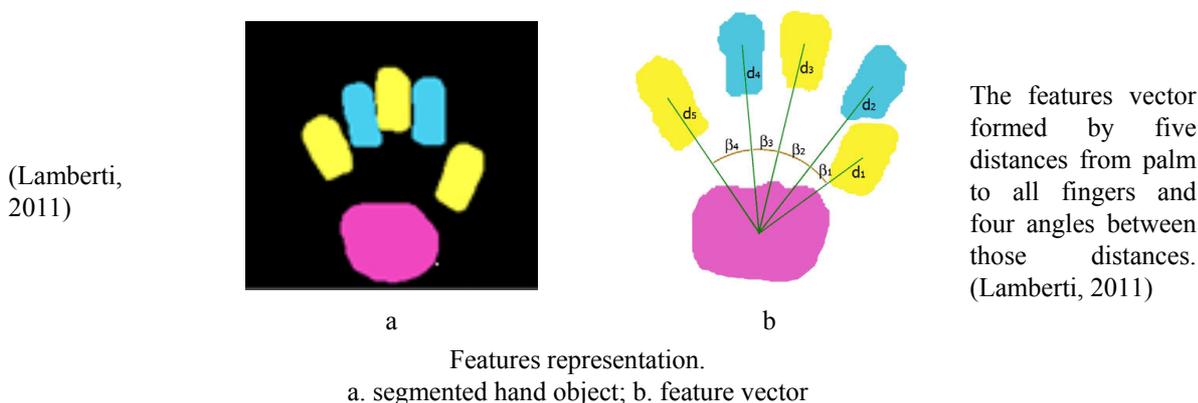
(Lamberti, 2011)



Used HSI color space to segment the hand region.

Hand segmentation

a. original image; b. image after segmentation.



4.3 Recognition

Recognition or classification of hand gestures is the last phase of the recognition system. Hand gestures can be classified using two approaches as mentioned in (Murthy, 2009).

A. Rule based Approaches: which represents the input features as manually encoded rule, and the winner gesture is the one that matched with the encoded rules after his features has been extracted. The main problem of this technique is that the human ability to encode the rules limits the successfulness of the recognition process (Murthy, 2009).

B. Machine Learning based Approaches: the most common approaches that considered the gesture as result of some stochastic processes (Murthy, 2009). Most of the problems that based on machine learning have been addressed based on the statistical modeling (Pavlovic, 1997), such as PCA (Kim, 2008), FSM (Verma, 2009). Hidden Markov Models (HMMs) (Keskin, 2003) have been paid attention by many researchers (Murthy, 2009), Kalman filtering (Mo, 2011), Artificial Neural networks (ANNs) (Maraqa, 2008; Murakami, 1999; Fels, 1993; Fels, 1998) which have been utilized in gesture recognition as well. Some researchers used Gaussian distribution for gestures classification (Stergiopoulou, 2009), and Euclidian distance metric (Hasan, 2010).

5. Conclusion

Human-machine interaction can be achieved by efficient gesture recognition system in which its applications varied from sign language recognition to games and virtual reality interfaces. In this paper a literature review on gesture recognition has been reviewed and analyzed; the major tools for classification process include FSM, PCA, HMMs, and ANNs are discussed. Descriptions of recognition system framework also presented with a demonstration of the main three phases of the recognition system by detection the hand, extraction the features, and recognition the gersture. The major image preprocessing steps necessarily required to features extraction phase are segmentation, edge detection, noise removing, and normalization, these steps may not applied together depending on targeted application.

References

- Bertsch, F. A., & Hafner, V. V. (2009). Real-time dynamic visual gesture recognition in human-robot interaction. *IEEE-RAS 9th International Conference on Humanoid Robots* (pp. 447-453). Paris. <http://dx.doi.org/10.1109/ICHR.2009.5379541>
- Bilal, S., Akmeliawati, R., El, S. M. J., & Shafie, A. A. (2011). Vision-based hand posture detection and recognition for sign language - A study. *IEEE 4th international conference on Mechatronics Proceedings, (ICOM 2011)*, pp. 1-6. <http://dx.doi.org/10.1109/ICOM.2011.5937178>
- Chambers, G. S., Venkatesh, S., West, G. A. W., & Bui, H. H. (2002). Hierarchical Recognition of Intentional Human Gestures for Sports Video Annotation. *IEEE 16th International Conference on Pattern Recognition Proceedings, 2*, pp. 1082- 1085, <http://dx.doi.org/10.1109/ICPR.2002.1048493>
- Cho., M. G. (2006). New gesture recognition algorithm and segmentation method of Korean scripts for gesture-allowed Ink editor. *Elsevier an International Journal Information Sciences, 176(9)*, 1290-1303, <http://dx.doi.org/10.1016/j.ins.2005.04.006>

- Dipietro, L., Sabatini, A. M., & Dario, P. (2008). Survey of glove-based systems and their applications. *IEEE Transactions on systems, Man and Cybernetics, Part C: Applications and reviews*, 38(4), 461-482. <http://dx.doi.org/10.1109/TSMCC.2008.923862>
- Erol, A., Bebis, G., Nicolescu, M., Boyle, R. D., & Twombly, X. (2007). Vision-based hand pose estimation: A review. *Elsevier Computer Vision and Image Understanding*, 108(1-2), 52-73. <http://dx.doi.org/10.1016/j.cviu.2006.10.012>
- Fels, S. S., & Hinton, G. E. (1993). Glove-talk: A neural network interface between a data-glove and a speech synthesizer. *IEEE transaction on Neural Networks*, 4(1), 2-8. <http://dx.doi.org/10.1109/72.182690>
- Fels, S. S., & Hinton, G. E. (1998). Glove-talk II—A neural-network interface which maps gestures to parallel formant speech synthesizer controls. *IEEE transactions on neural networks*, 9(1), 205-212. <http://dx.doi.org/10.1109/72.655042>
- Freeman, W. T., & Weissman, C. D. (1995). Television control by hand gestures. *IEEE International Workshop on Automatic Face and Gesture Recognition*. Zurich. Retrieved from www.merl.com/papers/docs/TR94-24.pdf
- Garg, P., Aggarwal, N., & Sofat, S. (2009). Vision based hand gesture recognition. *World Academy of Science, Engineering and Technology*. Retrieved from www.waset.org/journals/waset/v49/v49-173.pdf
- Ghobadi, S. E., Loepprich, O. E., Ahmadov, F., Bernshausen, J., Hartmann, K., & Lo@eld, O. (2008). Real time hand based robot control using multimodal images. *International Journal of Copmputer Science IJCS*. Vol 35(4). Retrieved from www.iaeng.org/IJCS/issues_v35/issue_4/IJCS_35_4_08.pdf
- Guan, Y., & Zheng, M. (2008). Real-time 3D pointing gesture recognition for natural HCI. *IEEE Proceedings of the 7th World Congress on Intelligent Control and Automation WCICA*, pp. 2 (Fels, 1998) 3 - 2 (Fels, 1998) 6. <http://dx.doi.org/10.1109/WCICA.2008.4593304>
- Hasan, M. M., & Mishra, P. K. (2010). HSV brightness factor matching for gesture recognition system. *International Journal of Image Processing (IJIP)*, vol. 4(5), Retrieved from www.cscjournals.org/csc/manuscript/Journals/IJIP/.../IJIP-250.pdf
- Hasan, M. M., & Mishra, P. K. (2011a). Gesture recognition using modified HSV segmentation. *IEEE International Conference on Communication Systems and Network Technologies*. <http://dx.doi.org/10.1109/CSNT.2011.75>
- Hasan, M. M., & Mishra, P. K. (2011b). Brightness factor matching for gesture recognition system using scaled normalization. *International Journal of Computer Science & Information Technology (IJCSIT)*, 3(2). <http://dx.doi.org/10.5121/ijcsit.2011.3203>
- Ibraheem, N. A., & Khan, R. A. (2011). *Survey on various gesture recognition technologies and techniques*. Department of Computer Science, Aligarh Muslim University, Aligarh, India.
- Joseph, J., & LaViola, J. (1999). A survey of hand posture and gesture recognition techniques and technology. *Master Thesis, NSF Science and Technology Center for Computer Graphics and Scientific Visualization*, USA. Retrieved from <ftp://ftp.cs.brown.edu/pub/techreports/99/cs99-11.ps.Z>
- Keskin, C., Erkan, A., & Akarun, L. (2003). Real time hand tracking and 3d gesture recognition for interactive interfaces using HMM. Retrieved from www.cs.nyu.edu/~naz/docs/icann.pdf Similar
- Kim, J., & Song, M. (2008). Three dimensional gesture recognition using PCA of stereo images and modified matching algorithm. *IEEE Fifth International Conference on Fuzzy Systems and Knowledge Discovery, FSKD '08*, pp. 116 - 120, Jinan Shandong. <http://dx.doi.org/10.1109/FSKD.2008.610>
- Kim, J., Jang, W., & Bien, Z. (1996). A dynamic gesture recognition system for the Korean sign language (KSL). *IEEE transactions on systems, man, and cybernetics-part B: Cybernetics*, 26(2), 354 - 359. <http://dx.doi.org/10.1109/3477.485888>
- Lamberti, L., & Camastra, F. (2011). Real-time hand gesture recognition using a color glove. *Springer-Verlag Berlin Heidelberg. ICIAP 2011, Part I, LNCS 6978*, pp. 365-373. Retrieved from www.springerlink.com/index/02774HP03V0U4587.pdf
- Li, X. (2003). Gesture recognition based on fuzzy C-Means clustering algorithm. Retrieved from citeseerx.ist.psu.edu/viewdoc/download?doi=10.1.1.136.3935.pdf

- Liang, R., & Ouhyoung, M. (1998). A real-time continuous gesture recognition system for sign language. *IEEE Third International Conference on Automatic Face and Gesture Recognition Proceedings*, pp. 558 - 567. <http://dx.doi.org/10.1109/AFGR.1998.671007>
- Malima, A., Özgür, E., & Çetin, M. (2006). A fast algorithm for vision-based hand gesture recognition for robot control. *IEEE 14th conference on Signal Processing and Communications Applications*, pp. 1- 4. <http://dx.doi.org/10.1109/SIU.2006.1659822>
- Maraqa, M., & Abu-Zaiter, R. (2008). Recognition of Arabic Sign Language (ArSL) using recurrent neural networks. *IEEE First International Conference on the Applications of Digital Information and Web Technologies, ICADIWT 2008*, pp. 478-48. [http://dx.doi.org/10.1109/ICADIWT.2008.466\(Fels, 1998\)96](http://dx.doi.org/10.1109/ICADIWT.2008.466(Fels, 1998)96)
- Min, B., Yoon, H., Soh, J., Yangc, Y., & Ejima, T. (1997). Hand gesture recognition using hidden markov models. *IEEE International Conference on computational cybernetics and simulation*, vol 5. <http://dx.doi.org/10.1109/ICSMC.1997.637364>
- Mitra, S., & Acharya, T. (2007). Gesture recognition: A survey. *IEEE Transactions on systems, Man and Cybernetics, Part C: Applications and reviews*, 37(3), 311-324. doi:10.1109/TSMCC.2007.893280
- Mo, S., Cheng, S., & Xing, X. (2011). Hand gesture segmentation based on improved kalman filter and TSL skin color model. *International Conference on Multimedia Technology (ICMT)*, Hangzhou. <http://dx.doi.org/10.1109/ICMT.2011.6002133>
- Moeslund, T. B., & Granum, E. (2001). A survey of computer vision-based human motion capture. *Elsevier, Computer Vision and Image Understanding 81 - Modeling people toward vision-based understanding of a person's shape, appearance, and movement*, 81(3), 231-268. <http://dx.doi.org/10.1006/cviu.2000.0897>
- Moni, M. A. & Ali, A. B. M. S. (2009). HMM based hand gesture recognition: A review on techniques and approaches. *2nd IEEE International Conference on Computer Science and Information Technology, (ICCSIT 2009)*. <http://dx.doi.org/10.1109/ICCSIT.2009.5234536>
- Murakami, K., & Taguchi, H. (1999). Gesture recognition using recurrent neural networks. *ACM, Proceedings of the SIGCHI conference on Human factors in computing systems: Reaching through technology CHI '91*, pp. 237-242. <http://dx.doi.org/10.1145/108844.108900>
- Murthy, G. R. S., & Jadon, R. S. (2009). A review of vision based hand gestures recognition. *International Journal of Information Technology and Knowledge Management*, 2(2), 405-410. Retrieved from http://www.csjournals.com/IJITKM/PDF/34-G.R.S.Murthy_R.S.Jadon.pdf
- Pavlovic, V. I., Sharma, R., & Huang, T. S. (1997). Visual interpretation of hand gestures for human-computer interaction: A review. *IEEE Transactions On Pattern Analysis And Machine Intelligence*, 19(7), 677- 695. <http://dx.doi.org/10.1109/34.598226>
- Peter, H. P. (2011). *Image Segmentation.(Isted.)*. India. (Part 2). Image Segmentation Methods Image Segmentation through Clustering Based on Natural Computing Techniques. Retrieved from www.scribd.com/doc/70993072/Image-Segmentation
- Porta, M. (2002). Vision-based user interfaces: Methods and applications. *Elsevier, International Journal Human-Computer Studies*, 2002(57), 27-73. <http://dx.doi.org/10.1006/ijhc.1012>
- Rautaray, S. S., & Agrawal, A. (2010). A vision based hand gesture interface for controlling VLC media player. *International Journal of Computer Applications*, 10(7). Retrieved from www.ijcaonline.org/volume10/number7/pxc3872012.pdf
- Rodriguez, O. P., Gonzalez, O. O., Avizzano, C. A., Ruffaldi, E., Vercelli, D., & Bergamasco, M. (2008). Development of a 3D real time gesture recognition methodology for virtual environment control. *IEEE Proceedings 17th International Symposium on Robot and Human Interactive Communication*, pp. 279-284. <http://dx.doi.org/10.1109/ROMAN.2008.4600679>
- Starner, T., Weaver, J., & Pentland, A. (2002). Real-time American Sign Language recognition using desk and wearable computer based video. *IEEE Transactions on Pattern Analysis and Machine Intelligence*, 20(12), 1371 - 1375. <http://dx.doi.org/10.1109/34.735811>
- Stergiopoulou, E., & Papamarkos, N. (2009). Hand gesture recognition using a neural network shape fitting technique. *Elsevier Engineering Applications of Artificial Intelligence* 22, 1141-1158. <http://dx.doi.org/10.1016/j.engappai.2009.03.008>

- Thomas, S., Benjamin, P., Niels, H., & Susanne, B. (2008). *Gesture recognition with a Wii controller*. ACM, Proceedings of the Second International Conference on Tangible and Embedded Interaction (TEI'08), Germany. <http://dx.doi.org/10.1145/1347390.1347395>
- Verma, R., & Dev, A. (2009). Vision based hand gesture recognition using finite state machines and fuzzy logic. *IEEE International Conference on Ultra Modern Telecommunications & Workshops, ICUMT '09*, pp. 1-6, Petersburg. <http://dx.doi.org/10.1109/ICUMT.2009.5345425>
- Vogler, C., & Metaxas, D. (2001). A framework for recognizing the simultaneous aspects of American Sign Language. *Ideal Computer Vision and Image Understanding 81*, pp. 358-384. <http://dx.doi.org/10.1006/cviu.2000.0895>
- Wang, H. H. X., Mandal, M. K., Meng, M., & Li, D. (2003). Efficient face and gesture recognition techniques for robot control. *IEEE Canadian Conference on Electrical and Computer Engineering, CCECE 2003*, 3, 1757-1762. <http://dx.doi.org/10.1109/CCECE.2003.1226250>
- Xu, Z., Xiang, C., Lantz, V., & Kong-qiao, W. (2009). Hand gesture recognition and virtual game control based on 3D accelerometer and EMG sensors. *ACM Proceedings of the 14th international conference on Intelligent user interfaces IUI '09*. <http://dx.doi.org/doi:10.1145/1502650.1502708>
- Yin, X., & Xie, M. (2007). Hand posture segmentation, *Recognition and Application for Human-Robot Interaction*. Retrieved from www.intechopen.com/download/pdf/pdfs_id/5276
- Zhu, Y., Huang, Y., Xu, G., Ren, H., & Wcn, Z. (1998). *Vision-based Interpretation of Hand Gestures by Modeling Appearance Changes in Image Sequences*. WA '98 IAPH Workshop on Machine Vision Applications. Makuhm, Japan. Retrieved from www.mva-org.jp/Proceedings/.../1998/papers/1998573.pdf