# Handwriting Recognition of Gurmukhi Script: A Survey of Online and Offline Techniques

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Abstract: Character recognition is very interesting area of pattern recognition. From past few decades an intensive research on character recognition for Roman, Chinese, and Japanese and Indian scripts have been reported. In this paper, a review of Handwritten Character Recognition work on Indian Script Gurmukhi is being highlighted. Most of the published papers were summarized, various methodologies were analysed and their results are reported.

**Keywords:** Gurmukhi Character Recognition, Online, Offline, HCR Survey.

## I. INTRODUCTION

India is a Multi-Lingual, Multi-Script country. Devnagari, Gurmukhi, Bangla, Tamil, Telgu, Urdu, Oriya, Gujarati, Kannada and Malayalam are 10 official Indian Scripts. Gurmukhi is popular Script used to write Punjabi language. Punjabi language is an Indo-Aryan language spoken by 102 million native speakers worldwide.

Pattern recognition has become interesting research area from last few decades. As compared to handwritten characters, typed characters can be efficiently, accurately and easily recognized by computer machine. Many researchers have done work to recognize machine printed and handwritten characters and many algorithms have been proposed. Researchers have been working on handwritten recognition for more than 30 years. Over the few past years, the numbers of organizations are involved in research on handwritten recognition.

Some practical applications of handwriting recognition are: (i) pen based form filling, (ii) word processing, (iii) natural language processing, reading aid for the blind, (v) language processing, (vi) multi-media system design, (vii) usage of online handwriting recognition in conjunction with speech synthesis, to empower people with vocal disability to communicate with others etc.

## II. PROPERTIES OF GURMUKHI SCRIPT

Gurmukhi script is 14<sup>th</sup> most widely used script in the world. The name Gurmukhi means "from the mouth of the Guru". Guru Nanak, the first Sikh guru developed the Gurmukhi alphabet during the 16<sup>th</sup> century. Some properties of Gurmukhi Script are:

- Gurmukhi has 41 consonants (vianjan), 9 vowel symbols (lāga mātrā), 2 symbols for nasal sounds (bindī and tippī), and one symbol which duplicates the sound of any consonant (addak). In addition, four conjuncts are used: three subjoined forms of the consonants Rara, Haha and Vava, and one half-form of Yayya.
- Most of the characters have a horizontal line at the upper part. The characters of words are connected mostly by this line called head line and so there is no vertical inter-character gap in the letters of a word.
- A word in Gurmukhi script can be partitioned into three horizontal zones. The upper zone denotes the region above the head line, where vowels reside, while the middle zone represents the area below the head line where the consonants and some sub-parts of vowels are present. The middle zone is the busiest zone. The lower zone represents the area below middle zone where some vowels and certain half characters lie in the foot of consonants.
- There are many topologically similar shaped characters in Gurmukhi. (च, च, च), (ਪ, प, ५),

 $(\mathbf{\overline{3}}, \mathbf{\overline{3}})$  are some examples of similar shaped characters.

- The bounding boxes of 2 or more characters in a word may intersect or overlap vertically. For example ਿ and ਦ intersects in word ਦਿਨ.

All above properties and different writing style of users complicate the Segmentation and recognition of Gurmukhi text.

#### III. HANDWRITTEN GURMUKHI CHARACTER RECOGNITION

Recognition of handwritten text can be done offline or online. Online handwriting refers to writing through a special pen on an electronic surface. Recognition of Online handwriting is the tracking of hand movements, the way user writes. This type of data is treated as a dynamic representation of handwriting. Offline handwriting recognition (OHR) involves the conversion of handwritten text on an image into a computer readable format. The text in image is considered as a static representation of handwriting. Steps involved in online/offline handwritten character recognition are illustrated in Figure 1: General Steps in Handwritten Character Recognition System.



## Figure 1: General Steps in Handwritten Character Recognition System

The major difference between Online and Offline Character Recognition is that Online Character Recognition has real time contextual information but in case of offline recognition pattern is stored in the form of image prior to recognition.

#### IV. WORK FOR GURMUKHI SCRIPT RECOGNITION

Garg (2009) proposed a system for recognition of offline handwritten gurmukhi characters. System is based on structural features, multi-input multi layered Neural Networks are used for the recognition purpose. Accuracy in the range of 69 to 96% is reported [2]. A Sharma (2009) introduced a writer independent system for online Gurmukhi script recognition. A new recognition method, Small Line Segment was introduced which was based on chain code rule and elastic matching technique. Recognition rate of 94.59% was achieved using small line segments method. Post processing phase is also discussed which includes verification of recognized strokes through features of character in the script [3].

Sharma(2010) developed a System for D Recognition of Hand-filled forms in Gurmukhi Script. Methodology template consist of generation, skew correction, data extraction, segmentation, slant correction, size normalization, classification feature extraction. and post processing steps[4].

Sharma and Ubeeka Jain (2010) presented a system for recognition of isolated handwritten Gurmukhi characters. Horizontal and vertical profiles, stored height and width of each character and neocognitron artificial neural network are used for feature extraction and classification. Average accuracy of 92.78% is reported [5].

System for Recognition of offline Isolated Handwritten Characters in Gurmukhi Script is proposed by Sharma and Jhajj (2010). Feature extraction method Zoning is used for extracting features. Recognition accuracy of 72.54% using KNN and 72.83% using SVM (RBF Kernel) is reported [6].

Author	Input	Features	Method/Classifier	Training Set/ Test Set	<b>Recognition Rate</b>
Naveen	Offline	Structural	Neural Network	-	69% to 96%
Garg	Handwritten				
(2009)	Characters				
Anuj	Online	High Level Features-	Small	Test Set	94.59%
Sharma	Handwritten	Loop, crossing, dots, straight	Line Segment Method	2460	Using Small Line
(2009)	Characters	line and headline.	Based on Elastic	characters	Segmentation
		Low Level Features-	Matching and chain code	from 60	_
		Position of stroke ,area,	Technique	users	
		length, curliness, slope	1		
Ubeeka	Offline	Profile, width, height, aspect	neocognitron artificial	Data Set	92.78%
Jain	Handwritten	ratio	neural network	1500	
(2010)	Characters				
Sharma,	Offline	Zone Features	K-NN and SVM	3075/2050	72.54%(K-NN),
Jhajj	Handwritten			images	72.83%(SVM RFB
(2010)	Characters			_	Kernel)
Manoj K	Online	Distributed Directional	(a)Extraction of strokes	Test Set	76%
Sachan	Handwritten	Features	(b) Merging of	2150 words	
(2011)	Words		Sub strokes	from 50	
				users	
Shivali	Online	Points Generated after pre-	Support Vector Machine	80% of Data/	97.5% (Using
(2011)	Handwritten	processing phase is used as		20% of Data	linear kernel)
	Numerals	feature for recognition			

 Table 1: Existing Gurmukhi Handwriting Recognition Systems

K S Siddharth (2011)	Offline Handwritten Characters	16 zoning density features, 128 background directional distribution features	SVM with RBF Kernel	7000 Samples	95.04%
Munish Kumar (2011)	Offline Handwritten Characters	Diagonal, intersection and open end point features	Support Vector Machine	3500 images 90%/10%	94.29%
Pritpal S (2012)	Offline Handwritten Characters	Feature Extracted using different wavelets	Back Propagation Neural Network(BPNN)	400/100 Samples	94.41%
Gita (2012)	Offline Handwritten Characters	Zone Based Feature Extraction	K-NN and SVM	Data set 7000 samples	95.11%(SVM) 90.64%(K-NN)
S Singh (2012)	Offline handwritten Characters	Gabor Features-GABM Gabor Features-GABN	SVM with RBF Kernel	200 Samples	94.29%
Aggarwal (2012)	Online Handwritten Strokes	Points Generated after pre- processing phase is used as feature for recognition	Support Vector Machine	Test Set 300 words from 3 users	98.45% (without pre-processing) 98.92% (with Pre- processing)
Khurana (2013)	Online Handwritten Characters	Points Generated after pre- processing phase is used as feature for recognition	Support Vector Machine	75% of Data/ 25% of Data	94.4%

Sachan, Lehal and Jain (2011) proposed a system for online Gurmukhi script recognition. The segmentation algorithm consist of two phases namely extraction of strokes and merging of strokes. Segmented shapes are processed to extract Distributed directional features. Feature data is fed to the recognition engine which is nearest neighbour classifier. Average accuracy of 76% is achieved by the system [7].

Shivali (2011) has reported work for recognition of Online Handwritten Punjabi Numerals using Support Vector Machine. Recognition accuracy of 97.5% is achieved with 40 resampled points using linear kernel [8].

System for offline Gurmukhi character recognition using zoning density and background directional distribution features is presented by Siddharth, Dhir and Rani (2011). SVM classifier with RBF kernel is used for classification. Average accuracy of 95.04 is reported [9].

A scheme for offline handwritten Gurmukhi character recognition based on SVMs is presented by Munish, Jindal and Sharma (2011). Maximum recognition accuracy of 94.29% with 90% training data and 10% testing data using intersection and open end points as features is reported [10].

Pritpal S and S Budhiraja(2012). Method uses different Daubechies Discrete Wavelet Transforms for feature extraction and back propagation for recognition task. Average accuracy of 93.41% is reported [11].

Gita, Rani and Dhir (2012) presented a system using K-NN and SVM classifier for offline handwritten gurmukhi character recognition. Recognition accuracy of 95.11% using SVM and 90.64% using K-NN is reported [12].

Singh, Aggarwal and Dhir (2012) used Gabor filters for recognition of offline handwritten Gurmukhi characters. Recognition accuracy of 88.27% using GABM and 94.29% using GABN is reported [13].

Aggarwal (2012) has been reported work for recognition of Online Handwritten Gurmukhi Strokes using SVM. An overall accuracy of 98.45% without applying pre-processing and 98.92% with pre-processing phase has been reported [14]. Khurana (2013) has also reported work for online Gurmukhi text recognition by using SVM with accuracy rate of 94.4% [15].

Little work has also been reported for Handwritten Character Recognition for Mobile Devices. A. Sharma (2012) proposed a system to recognize online handwritten Gurmukhi and Devanagari characters in touch screen based mobile phones. They have used small line segments to recognize Gurmukhi and Devanagari characters [16].

Table 1: Existing Gurmukhi Handwriting Recognition Systems gives an overview of the online and offline handwriting recognition systems for Gurmukhi characters and numerals. Researchers tried to explore the possibilities of directional, structural, zonal, statistical features. The majority of the researchers have used neural network, K-NN and SVM based classifiers. There is lack of availability of benchmarking databases for research. From the literature, it is clear that many of the researchers have used their own databases for evaluating their techniques. So it is very difficult to compare the various techniques and methods proposed by the researchers.

## V. CHALLENGES

There are many challenges for identifying handwritten scripts. Script identification from printed documents is much easier than handwritten documents. Handwritten script identification is complex and difficult because the writing style varies from person to person. It is also affected by the state of mind, mood of the person, writing medium, environment etc. Because of this, it is a challenging task to find proper features for their accurate identification. Presence of some similar shape characters (e.g.  $\overline{\upsilon}$ ,  $\overline{\upsilon}$ ,  $\overline{\upsilon}$ ) creates other

challenges in the identification. Due to limitations of the device or speed of writing, it is possible for a single character to be broken into different parts, hence creating confusion in recognition. In case of offline handwriting recognition there is a problem of degraded documents, poorly scanned documents make the recognition task challenging.

#### **VI.** FUTURE WORK

The work reported on HCR for Gurmukhi script may be extended in various directions. Some of them are listed below:

- Little work has been reported toward the recognition of handwritten Gurmukhi words.
- Development of bilingual and multilingual HCR.
- Incremental learning can be incorporated so that a new stroke or character can be incorporated without the requirement of retraining the entire system.
- Extension of handwriting recognition to the recognition of large or very large vocabularies.

#### VII. CONCLUSION

This paper summarizes work on Gurmukhi handwritten text recognition. Many of the researchers do research for a short period of time as a part of their academic courses. So there is a great amount of redundancy in the work related OHR. Although research in the field of HCR has been done, recognition algorithms still do not achieve 100% of the high recognitions.

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