AN EXHAUSTIVE FONT AND SIZE INVARIANT CLASSIFICATION SCHEME FOR OCR OF DEVANAGARI CHARACTERS

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ABSTRACT

Main challenge in any Optical Character Recognition (OCR) system is to deal with multiple fonts and sizes. In OCR of Indian languages, one also has to deal with a huge number of conjunct characters whose shape changes drastically with fonts. Separating the conjunct characters into its constituent symbols leads to segmentation errors. The proposed approach handles both the above listed problems in the context of Devanagari script. An attempt is made to identify all possible connected symbols of Devanagari (could be a consonant, vowel, half consonant or conjunct consonant henceforward shall be referred as a basic symbol) in the middle zone without segmenting the conjunct characters. On observing 469580 words from a variety of sources in our study, it is found that only 345 symbols are used more frequently in the middle zone and cover 99.97% of the text. They are then classified into 16 different classes on the basis of structural properties which are invariant across fonts and sizes. To validate the proposed classification scheme, results are presented on 25 fonts and three sizes.

KEYWORDS

Optical Character Recognition, Conjunct Character, Structural Features, Header line (Shirorekha), Vertical Bar

1.INTRODUCTION

In a typical OCR system, the input document is scanned by an optical scanner to produce a gray level or binary bit mapped image. It is a common practice in OCR applications to convert image into binary for easy processing. The image is then segmented into lines, words and isolated characters.

After segmentation, characters in the form of binary matrices are subjected to smoothing, noise elimination, size normalization, and maintenance of the aspect ratio to facilitate the extraction of features in the subsequent stage. Identification of characters is achieved by comparing the extracted features with the features obtained from the set of samples used in the learning phase. A typical block diagram is shown as Figure 1

Figure 1. Block Diagram of a standard feature based OCR

The main preprocessing techniques are smoothing, normalization and segmentation. Smoothing performs the functions of filling and thinning. Filling eliminates small breaks, gaps and holes. Thinning is the process of reducing the width of a line comprising many pixels to just one pixel. Normalization involves an algorithm that not only corrects the slant of the individual character or the whole word but also modifies the size of a character size to the standard size.

In the Feature Extraction stage, features that can discriminate one class of characters from others are considered. These can be pixel-based, structure-based or stroke-based.

Post processing is usually done to increase the performance of a recognition system. The performance increases if it can detect and correct errors. It may also be necessary to use contextual information. The application of context makes it possible to detect and correct errors. OCR has been known to be a difficult problem although making a computer read documents just as the humans do it has been a dream for long. Some of the difficulties in creating “perfect” OCR systems (or at least systems with human level performance) are as follows.

- a. Documents can be created with multiple fonts and sizes and with different styles like bold, italics, strikethrough etc. Some of these may appear to be quite different from the others.
- b. Text may be written at different orientations and even on curved lines.
- c. Recognition of text and data in tabular format provides its own difficulty.
- d. Noise in the document images may corrupt the character shapes and make them difficult to recognize.
- e. Scanning errors may result in characters that touch each other making segmentation difficult.

The above problems have resulted in making even development of OCR systems for relatively simple Roman Script a difficult problem. Commercial software performs well on “well behaved” or “OCR friendly” documents but not otherwise.

Devanagari script has 13 vowels and 36 consonants resulting in a total of 49 basic characters. Apart from these, there are compound characters which are formed by combining two or more basic characters. The shape of compound character is usually more complex than the constituent basic characters. The individual characters are joined by a header line called “Shiro Rekha”. Various types of Devanagari characters are depicted in Table 1.

Table 1. Examples of Various Types of Devanagari Characters

Sno	Type	Example
1	Vowels	अ आ इ ई उ ऊ ऋ ए ऐ ओ औ अं अः
2	Modifier symbols corresponding to the vowels	। ॠ ॡ ॢ ॣ । ॥ ० १ २ ३ ४ ५ ६ ७ ८ ९
3	Consonants Modifier symbols attached with consonant क	क ख ग घ ङ च छ ज झ ञ ट ठ ड ढ ण त थ द ध न प फ ब भ म य र ल व श ष स ह क्ष त्र ज्ञ का कि की कु कू कृ के कै को कौ
4	Pure Consonants	क ख ग घ ङ च छ ज झ ञ ट ठ ड ढ ण त थ द ध न प फ ब भ म य र ल व श ष स ह क्ष त्र ज्ञ
5	bi-consonantal conjuncts	क्चक्च ख्वच्च ज्वच्च श्स त्स न्स
6	tri-consonantal conjuncts	क्स्त ज्ञ्य त्स्य न्ध्य ल्य म्य
7	Conjunct with modifier 'ra'	फ्र ट्र ज्र ष्र क्र न्द्र म्ब्र
8	Conjuncts with ह	ह्य ह्य ह्य ह्य ह्य ह्य

The script has core characters in the middle strip comprising of basic characters or compound characters along with optional vowel modifiers above and/or below core characters. They can be divided into 3 zones and a header line as shown in Figure 2

Figure 2. Example of Various Zones in Devanagari Character

Motivation for the present work: In OCR of Indian language, a fundamental issue that needs to be addressed is: what is the basic unit of recognition? Whether one should attempt to split the conjunct character into its constituent basic characters or conjunct character should be treated as a whole. Also whether one should deal with all possible characters or only characters that are used generally. Is it worthwhile to go for the first level of classification using the structural properties that do not vary across fonts and sizes? These are pertinent questions behind the motivation for undertaking this research work.

The paper is organized as follows: Section 2 describes the challenges in Devanagari OCR and representative approaches. Section 3 presents the proposed approach. Identification of basic symbols is dealt in Section 4. The results of frequency and coverage analysis of basic symbols are summarized in Section 5 of this paper. Section 6 develops a classification scheme. Validation of the proposed classification scheme over 25 fonts is discussed in Section 7. Finally, Conclusions are given in Section 8.

2. CHALLENGES IN DEVANAGARI OCR AND REPRESENTATIVE APPROACHES

All the difficulties highlighted in Section 1 on OCR in general hold true even for Indic Scripts that pose more challenges due to the unique writing styles permitted in these scripts.

The complexity in Devanagari script arises due to the presence of a large number of symbols. Some of them have similar shapes leading to misclassifications. In particular, the main sources of difficulty pertaining to Devanagari script, apart from those listed above as generic causes are as follows.

- a. The shapes of the characters may vary drastically across fonts especially in the case of conjunct characters.
- b. The symbols employed in the script are not restricted to the basic vowels and consonants but also to the enormous number of conjunct characters generated by the combination of the simple vowels and consonants with different marks and half characters estimated to run into several hundred thousand.

Various methods used in the past for OCR of Devanagari text include the use of shape based features, separation of pattern classes into several groups based on some similarity of characters, Statistical features, and gradient and curvature based feature extraction methods [1].

Kompalli et al. [2] use the gradient features to classify segmented images into 74 classes: 4 ascenders, 2 descenders, and 68 core components. The 68 core components contain 36 vowels and consonants and 32 frequently occurring conjuncts. A nearest neighbour classifier is used for ascenders and descenders. Core components are pre-classified into four groups based on the presence of a vertical bar, no vertical bar, vertical bar at the centre, vertical bar at the right or at multiple locations

In the rule-based segmentation approach [3], the shirorekha is determined using projection profile and run length. Structures above the shirorekha are isolated as ascenders. Average character height is used to predict a region of interest (ROI) to locate descender. The ROI is examined using run-length analysis to separate descender from core components.

The recognition-driven segmentation by Kompalli et al. in [3] moots the recognition hypothesis which involves the use of non-linear boundaries to separate Devanagari components, and classifier hypothesis for frequently occurring characters (consonants/vowels or consonant-ascenders) before attempting at the segmentation of conjuncts and consonant-descenders on the basis of the classifier results.

Chaudhuri and Pal [4] assign a character to one of the three groups namely basic, modifier and compound character group on the basis of bounding box width, number of border pixels per unit width and accumulated curvature over the border per unit. Feature based approach is used for basic and modifier character recognition while a combination of feature based template matching approach is used for the compound character recognition.

Bansal and Sinha [5] divide the character set of Devanagari script into three groups based on the coverage of the region of the core strip viz. FULL BOX e.g. , UPPER HALF BOX e.g. and LOWER HALF BOX characters e.g. . A total 62 symbols is identified by them in these three groups. The conjuncts are segmented into character and half character and are grouped into FULL BOX, UPPER HALF BOX and LOWER HALF BOX characters. The FULL BOX characters are

further divided into three groups based on the presence and position of vertical bars, namely end bar characters, middle bar characters and no bar characters. End bar characters are further subdivided into two groups based on number of junctions with header line.

Hanmandlu et al. [6] have described a system to classify off-line handwritten Hindi characters into several groups based on some similarity measure. They have identified the header line based on end points and pixels positions in the top half part of the character image. After the identification and removal of header line, all the characters are coarsely classified according to the space between the components of the same character (connected and non-connected characters), presence and position of the vertical bar (End, Mid and No Bar) and presence of closed loops.

3. THE PROPOSED APPROACH

The conjuncts are formed by adding consonant and vowel marks to the consonants. There is a variety of ways in which this is done. Some modifiers or their portions could be above the header line, some added to the character below the character and some in the middle zone. The position and the way in which the marks are joined to the base character may vary from font to font. In some fonts the vowel or consonant modifier may touch the character it modifies and in others it may not. All these differences create complications in segmentation. What works for one font may not be so for another.

Dividing the words into upper, middle and lower zones reduces the count of characters present in the middle zone and which appear to be connected. Theoretically there can be 1296 (36×36) biconsonantal conjunct characters formed by collating 36 fundamental symbols. Further there can be 46656 (1296×36) triconsonantal conjunct characters formed by combining the 1296 biconsonantal conjuncts with 36 fundamental symbols. This indicates the possibility of presence of fairly a large number of connected symbols in the middle zone.

In the development of OCR, a fundamental issue that needs to be resolved is level of recognition. We can go for the recognition of the connected components that are left after the removal of the Shirerekha or smaller sub-units with the middle line segment, ascenders and descender separately or the constituent basic characters of a conjunct character or the conjunct character as a whole?

It is really difficult to separate a conjunct into a consonant and pure consonant as it is not always that the two are connected exactly at the middle of the conjunct. Problems in Ascender segmentation occur when ascenders get connected with each other. The position of descender changes with alphabet height and font. In the recognition-driven segmentation paradigm Devanagari characters originate from fusion left to right and top to bottom and are to be segmented along nonlinear boundaries. The modifiers are separated from the character and recognized separately in Indian languages. In this, segmentation takes place without an understanding of what is to be expected as the outcome of recognition when it is not performed but only the segmentation is performed for recognition.

Owing to the presence of default touching characters in Devanagari, segmentation of conjuncts is inefficient and highly font dependent as the position of touching is not fixed in any two conjuncts.

The total number of conjuncts to be segmented and recognized being unmanageable from OCR point of view it is necessary to devise ways and means of bringing their number down to manageable levels.

Primarily the complexity lies in the middle zone. One way to do this is to consider only the conjuncts occurring in the middle zone i.e. removing all the symbols including and above the header line (“Shirorekha”) and also the modifiers attached at the bottom. This relevant portion is clearly shown in Figure 2.

Vasanth Lakshmi and Patvardhan [7] have dealt with the basic symbols for Printed text (TOSP) in Telugu OCR System. A Basic Symbol is defined as a single connected entity in Telugu script and is treated as the unit of segmentation and recognition.

A similar approach can be adapted for Devanagari with a difference that only the connected components in the middle zone are treated as units of recognition. An attempt is made to identify how many basic connected symbols can be present in the middle zone in addition to finding their distinguishing characteristics such as structure, shape and presence/absence of certain character segments.

Once the symbols in the middle zone are separated out and features identified for their recognition, the OCR problem is considerably simplified because the other portions, i.e. the top zone (above the header line) and the bottom zone can then be separately processed. The number of symbols to be handled at each stage remains within manageable levels. This approach therefore offers a way to mitigate the complexities of handling a huge number of conjunct characters.

An analysis is done to identify the basic symbols that are used more often. Structural properties of these symbols that are invariant across fonts and sizes are identified and classification is performed using these invariant structural properties as far as possible. This approach makes it much easier to create a classifier.

This approach brings out certain interesting observations listed here.

- a. Contrary to our expectations, the number of unique conjunct characters in the middle zone is not too large.
- b. Further a small number of symbols provide a very high percentage of coverage. Therefore, if means can be devised to segment and recognize these symbols accurately, considerable part of the OCR problem could be regarded as solved.
- c. The conjunct characters occurring in the middle zone can be classified into small manageable classes by means of identification of some easily distinguishable features, e.g. the presence or absence of the vertical bar and so on. The advantage of using these easily recognizable features is that being gross features they remain the same across fonts and sizes.

Building a classifier capable of recognizing the conjuncts in each class and consisting of a relatively small number of symbols is much less difficult and therefore less error prone.

4. IDENTIFICATION OF BASIC SYMBOLS IN THE MIDDLE ZONE

To generate an exhaustive list of basic symbols in the middle zone, several weekly magazines[8][9], newspapers [10][11], children's' magazine[12][13], Essay books[14], books on ayurvedic tips[15], books on cooking tips[16], vyakaran books[17] and other children's course text books [18][19][20] are probed. A list of variety of sources used for identification of symbols is shown in Table 2.

Table 2. List of Variety of Sources used for Identification of symbols

SNO	Source Document	No. of Pages	No. of Words in a page (appx.)	Total No. of Words (appx.)
1	Weekly Hindi Magazine 'Sukravar', 18 dec-24 dec, 2010	78	900	70200
2	Weekly Hindi Magazine, 'India Today', 23 march, 2011	64	600	38400
3	Hindi News Paper, 'Sunday Navbharat Times', 10 Nov. 2013	22	2500	55000
4	Hindi News Paper, ' Rashtriya Sahara', 14 Nov., 2013	24	2000	48000
5	Panchtantra ki 101 kahaniya	170	300	51000
6	Tenaliram ki kathain	38	170	6460
7	Hindi nibandh avam patra lekhan	256	280	71680
8	Ayurved ka chamatkar haldi	80	250	20000
9	Hawkins Akhil Bhartiya pak pustika	81	400	32400
10	Manak vyakaran vyavahar, part-I	184	270	49680
11	Gyan Sagar 6	70	260	18200
12	Gyan Sagar 3	34	120	4080
13	Satrangi hindi pathya pustak 1	56	80	4480
	Total			469580

It is found from a variety of sources that out of 469580 words there are only 345 symbols as shown in Table 3 in the middle zone used frequently. It also includes symbols with half characters disconnected from the character.

Table 3. List of 345 Devanagari Symbols in the Middle Zone

Type	No. of char	Characters
Single char	42	अ इ उ ऊ ऋ ए क ख ग घ ङ च छ ज झ ञ ट ठ ढ ण त थ द ध न प फ ब भ म य र ल व १ ष स ह क्ष त्र ज्ञ श्र
Starting With क	21	क्य क्न क्ल क्व क्क कथ कख कप क्म क्य क्स क्फ क्क क्क क्क क्क क्क क्क क्क क्क क्क क्क क्क
Starting With ख	7	ख्त ख्व ख्म ख्स ख्य खश् ख्भ
Starting With ए	3	एत एव एय
Starting With च	5	च्य च्व च्य च्छ च्क
Starting With ज	7	ज्य ज्व ज्य ज्झ ज्य ज्झ
Starting With झ	5	झ्य झ्व झ्य झ्झ झ्य झ्झ
Starting With त	19	तत् त्व त्त त्त् त्म त्स त्प त्य त्र त्र्य त्स्य त्स्य त्थ त्क्ष त्क त्फ त्श त्त त्त् त्त्
Starting With थ	3	थ्व थ्य थ्स
Starting With द	4	द्व द्व द्य द्व
Starting With ध	4	ध्व ध्व ध्य ध्म
Starting With न	26	न्य न्त न्न न्व न्त्र न्म न्स न्य न्भ न्थ न्ध न् न् न्य न्म न्म न्म न्म न्म न्म न्म न्म न्म न्म न्म न्य न्म न्म न्म न्म न्म न्म न्म न्म न्म न्म
Starting With ण	8	स ण ण ण ण ण ण ण
Starting With प	10	प्य प्य प्य प्य प्य प्य प्य प्य प्य प्य
Starting With ब	13	ब्य ब्य ब्य ब्य ब्य ब्य ब्य ब्य ब्य ब्य
Starting With भ	2	भ्य भ्व
Starting With म	19	म्य म्य म्य म्य म्य म्य म्य म्य म्य म्य म्य म्य म्य म्य म्य म्य म्य म्य म्य म्य
Starting With य	1	य्य
Conjunct Char with 'ra'	27	क ग घ ङ ज्ञ थ द ध ढ ण त थ द ध न प फ ब भ म य र ल स ण्क ण्द्र ण्प्र ण्स् ण्स् ण्स् ण्स् ण्स् ण्स् ण्स्
Starting With ल	22	ल्य ल्य ल्य ल्य ल्य ल्य ल्य ल्य ल्य ल्य ल्य ल्य ल्य ल्य ल्य ल्य ल्य ल्य ल्य ल्य
Starting With ट	4	ट्य ट्य ट्य ट्य
Starting With १	2	श्व श्व
Starting With ण	11	ण्य ण्य ण्य ण्य ण्य ण्य ण्य ण्य ण्य
Starting With र	22	स्त स्त स्त स्त स्त स्त स्त स्त स्त स्त स्त स्त स्त स्त स्त स्त स्त स्त स्त स्त
Starting With क्ष	2	क्ष्य क्ष्य
Starting With त्र	1	त्र्य
Starting With ह	6	ह्य ह्य ह्य ह्य ह्य ह्य
Other char	8	रु रु : ष ष ष ष ष ष
Half char	41	क ख ए च ज ङ त १ २ ३ ४ ५ ६ ७ ८ ९ १० ११ १२ १३ १४ १५ १६ १७ १८ १९ २० २१ २२ २३ २४ २५ २६ २७ २८ २९

5. FREQUENCY AND COVERAGE ANALYSIS OF BASIC SYMBOLS

Frequency analysis is done manually on the identified symbols to find out the most frequently used symbols in two articles on different contexts with different sizes from a weekly Hindi magazine [21][22]. The results are summarized in Tables 4 and 5.

Table 4. Results Of Frequency Analysis OF First Article

Sno	Char	Frequency	%age	Sno	Char	Frequency	%age
1	ट	1560	29.48	43	ध्र	3	0.06
2	क	388	7.33	44	प्र	18	0.34
3	र	287	5.42	45	त्र	21	0.37
4	स	236	4.46	46	द्व	12	0.23
5	ह	222	4.19	47	क्र	5	0.09
6	म	219	4.14	48	द्र	8	0.15
7	न	210	3.97	49	द्व	3	0.06
8	त	193	3.65	50	रु	2	0.04
9	ल	165	3.12	51	त्त	4	0.08
10	ग	136	2.57	52	फ्र	1	0.02
11	प	135	2.55	53	थ्व	8	0.15
12	व	135	2.55	54	स्स	2	0.04
13	अ	116	2.19	55	स्थ	6	0.12
14	य	106	2.00	56	स्त	16	0.30
15	ज	98	1.85	57	स्य	1	0.02
16	ब	98	1.85	58	स्य	3	0.06
17	द	100	1.89	59	क्स	1	0.02
18	इ	93	1.76	60	क्ल	2	0.04
19	ट	76	1.44	61	क्क	2	0.04
20	श्	72	1.36	62	ष्ट	3	0.06
21	भ	61	1.15	63	ष्य	3	0.06
22	ड	61	1.15	64	न्न	2	0.04
23	ए	49	0.93	65	न्त	7	0.13
24	ख	40	0.76	66	न्य	1	0.02
25	ध	30	0.57	67	ल्ल	2	0.04
26	ढ	30	0.57	68	ल्ल	1	0.02
27	ण	28	0.53	69	ल्ल	2	0.04
28	क्ष	20	0.38	70	ल्य	1	0.02
29	उ	20	0.38	71	ल्ल	1	0.02
30	ष	20	0.38	72	ल्ल	1	0.02
31	च	31	0.56	73	ल्ल	1	0.02
32	घ	11	0.21	74	ल्ल	1	0.02
33	थ	12	0.23	75	ल्ल	1	0.02
34	ठ	10	0.22	76	ल्ल	3	0.06
35	ज्ञ	7	0.13	77	ल्ल	1	0.02
36	श्र	3	0.06	78	ल्ल	4	0.08
37	फ	22	0.42	79	ल्ल	1	0.02
38	त्र	20	0.38	80	ल्ल	1	0.02
39	छ	11	0.21	81	ल्ल	1	0.02
40	झ	4	0.08	82	ल्ल	1	0.02
41	ऊ	1	0.02	83	ल्ल	1	0.02
42	घ	1	0.02	Total		5291	

Table 5. Results Of Frequency Analysis Of Second Article

Sno	Char	Frequency	%age	Sno	Char	Frequency	%age
1	ट	454	29.02	28	क्ष	3	0.19
2	क	122	7.80	29	ऊ	2	0.13
3	र	122	7.80	30	च	17	1.09
4	न	80	5.12	31	थ	7	0.45
5	स	65	4.16	32	श्र	7	0.45
6	ह	68	4.35	33	फ	5	0.32
7	म	78	4.99	34	प्र	1	0.06
8	त	47	3.01	35	क्र	7	0.45
9	ल	44	2.81	36	त्म	1	0.06
10	ग	18	1.15	37	स्थ	1	0.06
11	प	35	2.24	38	क्ल	3	0.19
12	व	27	1.72	39	स्व	3	0.19
13	अ	33	2.11	40	स्	2	0.13
14	य	36	2.30	41	र्	1	0.06
15	ज	31	1.98	42	द्र	3	0.19
16	ब	30	1.92	43	ब्	2	0.13
17	द	23	1.47	44	स्ट	6	0.38
18	इ	18	1.15	45	फ्र	5	0.32
19	ट	25	1.60	46	रू	4	0.26
20	भ	27	1.73	47	न्य	2	0.13
21	ए	23	1.47	48	ल्ल	2	0.13
22	ड	16	1.02	49	क्म	1	0.06
23	ख	16	1.02	50	स	6	0.38
24	श्	12	0.77	51	घ्य	1	0.06
25	ध	9	0.58	52	म्म	1	0.06
26	ढ	1	0.06	53	श्च	1	0.06
27	ण	3	0.19	54	ह्र	1	0.06
				Total		1564	

The results show that around 97% text is covered by the single characters and the presence of the conjunct characters in these articles is around 3% only. A summary is shown in Table 6.

Table 6. Summary of the Symbols and Percentage of the Text Covered

Text Covered (approx.)	No. of Symbols	Symbols
97%	42	T क र न स ह म त ल ग ण व अ य ज ब द ड ट भ ड श ख ए ध ढ ण क्ष उ ष च घ थ ठ ज्ञ श्र फ त्र छ झ ऊ रु
3%	47	ध प्र ऋ ॠ क्र द्द्रु त्त फ श्व स्स स्थ स्त स्प स्य क्स कल कक ए ष्य न्न न्त न्य लृ ल्ल ल्स ल्प ल्क्त्वे त्प त्म ज्य प्त त्य स्तः क म्म म्प्य स स्व ब्द स घ्य श्व द्व

An analysis of the total coverage of the text using these identified 345 symbols is done on 5 sample-documents downloaded from the CIIL website [23]. The results of the analysis are summarised in Table 7. The overall coverage by these identified 345 symbols is found to be 99.97% on 13113 words in 5 sample-documents. Details are shown in Table 7.

Table 7. Analysis of Coverage of Text using Identified 345 Symbols

SNO	Source Document	Pages	Words	Not Covered	No. of words in which Symbol not covered	Coverage by identified 345 symbols
1	Hindi1.pdf	5	713	रुय	2	99.72 %
2	Hindi2.pdf	10	2026	-	-	100%
3	Hindi3.pdf	15	4665	-	-	100%
4	Hindi4.pdf	15	2668	-	-	100%
5	Hindi5.pdf	17	3041	बड	2	99.93%
	Total	62	13113			99.97%

6. CLASSIFICATION SCHEME

On the basis of analysis in the previous sections 345 basic symbols are identified and these provide very high coverage of 99.97%. A detailed classification scheme is developed in this section using the structural properties. This classification scheme is required to be robust across fonts and sizes. Once such a classification scheme is created for each of the individual classes, this scheme is expected to be more tolerant to noise and robust across multiple fonts and sizes.

Various categories for BAR Type are identified as follows:

1. Some characters have a vertical bar at the end of them.
2. Some characters have a vertical bar in the middle of them.
3. Some characters do not have any bar.
4. Some conjuncts have two vertical bars with them.
- 5.

Figure 3. Classification based on presence and location of vertical bar

The way the characters touch the header line is different; a character may touch only once with the header line or more than once. This categorization of the count of touching is as follows:

1. Characters not touching the header line.
2. Characters touching the header line once.
3. Characters touching the header line at two places.
4. Characters touching the header line at three places.
5. Characters touching the header line at four places.
6. Characters touching the header line at five places.

Based on these properties, there are 16 different character classes to which a character may belong.

Figure 4. Classification based on touching count

The characters in each of the 16 classes are shown in Table 8.

Table 8. Classification of Total 345 Character based On Bar Type and Touching Count

SNO	Property	No. of char	Characters
1	End Bar One Touching	49	ज ञ त न ल ज्ञा तज्जञ्जत्त न्नन्त न्नन्न ब्त ब्लल्लल्लल्ल ग च व व त्र त्र त्रि ब्र व्र च्यच्यव्य ञ्य त्वन्यन्त्र व्यत्यव्य व्यव ज्यत्वन्त्व त्यत्त त्तल न्य
2	End Bar Two Touching	70	अ झ म स स ख म्म स्त स्त स्त स्त प्न प्लय यद्य ह्य म्म ख ख म्म स्व स्व स्त स्त स्व स्व स्त्रस्त्र घ प ष घ प्र ध्व ध्व ज्झज्झम्म त्स न्म न्सम्मस्स त्स त्स च्य ज्यत्प त्यन्य व्यत्य त्य व्य ज्यन्य न्यत्य स ङ्ग्य म्य म्म त्स्न त्प्र म्म व्यत्य ग
3	End Bar Three Touching	54	ल्मस् तक्ष न्भब्भ र्हम र्हस्मस्मस्म स्मस्मश्च भ क्ष ध्न एसम्म त्स्यत्स्य तथ न्थ न्धब्ध द्धत्थ ल्भ ख्य म्य म्म र्यस्खस्म स्य स्य स्वेद्य प्प प्यप्प प्य थ थ थ्व ध्वश्च ध्रभ भव न्ध श्व श्व स्प म्प्र म्प्र प्प
4	End Bar Four Touching	13	र्हम्भ क्क म्मथ स्थ न्ध्यथ्य ध्यभ्यक्ष्य ध्म म्म्य थ्स
5	End Bar Five Touching	1	स्थ
6	Mid Bar One Touching	11	क क्रक कृक् के क्तक्तक्तक्तक्त
7	Mid Bar Two Touching	17	फ फ्र फ भू क्ट त्फ ल्फ म्फ स्फ ण्फ न्फ न्फ क्क कड म्म स्क्र ण्क
8	Mid Bar Three Touching	8	फट कश् म्फ स्फ ण्फ कस्ट कस्ट म्फ
9	No Bar No Touching	17	चउउ तन्नल्लत्त उ न्न न्ने न्नन्न रः
10	No Bar One Touching	53	इ उ ऊ ट ठ ड ढ दरह ख र रुद्ध द्वट इद्रह ह्रह्रह्र रु रु छं न्न न्न न्देन्ह दददल लल्लल्ल वह ल च्छच्छ सु ए ए ल्म त्त्त र्त्त र्त्त न्न्देन्द्र दे
11	No Bar Two Touching	22	ढ्ढ्ढ्ढ् स्त ण २ ९ क्ष ए १ ण्ड ण्ड तश् लश् न्स्त न्श न्द स्ड स्स न्द
12	No Bar Three Touching	4	खश् ण्ण र्त्त
13	Two Bar Two Touching	7	क्कक्क क्तक्क क्क कत्र कज
14	Two Bar Three Touching	11	फ्त फल फ्फ क्ख क्प क्म क्य क्स क्फ फज ल्क्य
15	Two Bar Four Touching	6	फ्म फ्य फ्स कथ फ्फ न्फ्य
16	Two Bar Five Touching	2	फथ क्स्थ

Table 9. List of Font Name For The Test Data

Sno	Font Name	Font Size	Sno	Font Name	Font Size
1	Mangal	24px, 16px, 12px	14	Kruti Dev 714	24px
2	GIST-DVOTAkshar	24px, 16px, 12px	15	Richa	24px
3	GIST-DVOTMaya	24px, 16px, 12px	16	Aparajita	24px
4	GIST-DVOTKishore	24px	17	Kokila	24px
5	GIST-DVOTSubodh	24px	18	Kundali	24px
6	GIST-DVOTVineet	24px	19	Arjun	24px
7	AkrutiDevYogini,	24px	20	Kanika	24px
8	Arial Unicode MS	24px	21	Devlys 010	24px
9	Utsaah	24px	22	Devlys 140	24px
10	Gargi	24px	23	AkrutiDevPriya	24px
11	Gurumaa	24px	24	AkrutiDevGangal	24px
12	Kruti Dev 010	24px	25	AkrutidevPriyanka	24px
13	Kruti Dev 040	24px			

[illegible]

The screen shot of the main menu is shown in Figure 6.

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First, the program identifies the rows and then creates the binarized files of the each word enclosed in the rows. It performs four steps given in Table 10.

Table 10. Steps Performed to Create the Binarized Files of each Word

Step 1	Read the image file and convert into the binarized matrix
Step 2	Find out the start and end of rows by counting the highest number of 0 in row
Step 3	Find out the word in each start and end of each word in the row by counting the highest number of 0 in column
Step 4	Create the binarized file of each word

Then the program reads the binarized files of the each word and separates out the symbols in the middle zone. It performs eight steps as in Table 11.

Table 11. Steps Performed to find Symbols in Middle Zone from binarized File of each Word

Step 1	Read the binarized file of the word
Step 2	Remove white header horizontal line for correct image height of actual dark portion
Step 3	Remove white footer horizontal line for correct Image height of actual dark portion
Step 4	Remove white vertical line for correct image width of actual dark portion
Step 5	Get Shirorekha start row and shirorekha end row. (True if dark pixel width $\geq$ 60% of image height)
Step 6	Remove pixel above shirorekha i.e. the rows above the shirorekha start row.
Step 7	Finding out the start and end of the symbols by counting the highest number of 0 in the column below shirorekha.
Step 8	Create the binarized file of each symbol

The system classifies the characters by computing various properties of each symbol (Table 12).

Table 12. Steps Performed to find Structural Properties in a given Character

Step 1	Read the binarized file of image
Step 2	Remove white header horizontal line for correct image height of actual dark portion
Step 3	Remove white footer horizontal line for correct Image height of actual dark portion
Step 4	Remove white vertical line for correct image width of actual dark portion
Step 5	Get Shirorekha (True if dark pixel width $\geq$ 60% of image height)
Step 6	Get All Bar (True if dark pixel width $\geq$ minimum bar width and dark pixel height $\geq$ 90% of image height)
Step 7	Merge bar if gap between bar is less than minimum bar width
Step 8	Ignore smaller bar if height is less than other bar
Step 9	Get All Bar Type (End/Mid/No Bar/Two Bar)
Step 10	Get All Shirorekha Touching

Some fonts are thin while others are thick. Accordingly minimum bar width parameter is set as given in Table 13.

Table 13. Minimum Bar Width Parameter for different Fonts and Sizes

Font Name	Minimum Bar Width
Mangal (24px), GIST-DVOTAkshar (24px), GIST-DVOTSubodh, GIST-DVOTVineet, AkrutiDevYogini, Gargi, Kanika,	5
Arial Unicode MS, Kruti Dev 010, 040, 714, Mangal (16px, 12px) GIST-DVOTKishore, GIST-DVOTMaya(24px), Gurumaa, Utsaah, Richa, Aparajita, Kokila, devlys010, devlys140, AkrutiDevPriya, Arjun, AkrutiDevGangal, AkrutiDevPriyanka, Kundali,	3
GIST-DVOTAkshar(16,12px), GIST-DVOT Maya (16px)	2
GIST-DVOTMaya (12px)	1

It is also observed in the test data for these 25 fonts that there are various characters which fall in more than one character class due to difference in shape in different fonts. The exceptions found during the analysis over 25 fonts are shown in Table 14.

Table 14. Exceptions found during Analysis over 25 Fonts

Property	S N O	C H A R A C T E R	M A N G A L	A K S H A R	M A Y A	K I S H O R E	S U B O D H	V I N I T	A K R U T I	A R I A L	U T S A H	G A R G I	G U R U M A	K R U T I D E V 0 1 0	K R U T I D E V 0 4 0	K R U T I D E V 7 1 4	R I C H A	A P A R A J I T A	K O K I L A	K U N D A L I	A R J U N	K A N I K A	D E V L Y S 0 1 0	D E V L Y S 1 4 0	A K R U T I D E V P R I Y A	A K R U T I D E V G A N G A L	A K R U T I D E V P R I Y A N K A
			1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25
End Bar One Touching	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-
End Bar Two Touching	1	अ	-	-	Y	Y	Y	Y	-	-	-	-	-	-	Y	Y	-	-	-	Y	Y	Y	Y	-	-	-	Y
	2	आ	-	-	Y	Y	Y		Y	-	-	-	-	-	Y	Y	Y	-	-	Y	Y	Y	-	Y	-	-	Y
	3	इ	-	Y	Y	Y	-	Y	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-
	4	उ	-	-	-	-	-	-	-	Y	-	-	-	-	-	-	-	Y	Y	-	-	-	-	-	-	-	-
	5	ए	-	-	-	-	-	-	-	Y	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-
	6	भ	-	Y				Y			-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-
	7	ब	-	Y	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-
	8	भ	-	Y	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-
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	12	प	-			Y				Y							Y		Y	Y							Y
End Bar Three Touching	1	ख	-	Y	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-
	2	भ	-	Y	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-
	3	म	-	Y	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-
	4	अ	-		Y	Y	Y		Y		Y	Y	Y	Y	Y			Y		Y		Y			Y		Y
	5	श	-		-	-	-	-	-	-								Y									
	6	ल	-		-	-	-	-	-	-								Y									
	7	व	-		Y						-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-
End Bar Four Touching	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-
End Bar Five Touching	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-
Mid Bar One Touching	1	क	-	Y		Y					Y	Y						Y	Y								
	2	क	-							Y	Y	Y															
	3	क	-							Y	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-

[illegible]

An analysis of the occurrence of these exceptions is done on 5 samples downloaded from CIIL website [23]. The results of the analysis of the occurrence of these exceptions on 13113 words of 5 sample documents are shown in Table 15. The result shows that occurrence of these exceptions is very marginal.

Table 15. Analysis of occurrence of Exceptions

SNO	Symbol	No. of words in which symbol occurs	%age of occurrence	SNO	Symbol	No. of words in which symbol occurs	%age of occurrence
1	हव	-	0	21	म्पु	-	0
2	हल	-	0	22	ज्य	-	0
3	हम	-	0	23	क्र	1	0.01
4	अ	-	0	24	कु	1	0.01
5	अ	-	0	25	ह	1	0.01
6	नम	-	0	26	लश	3	0.02
7	बम	-	0	27	क	3	0.02
8	मव	-	0	28	म	4	0.03
9	लम	-	0	29	मम	5	0.04
10	रम	-	0	30	ल	6	0.05
11	म्य	-	0	31	छ	10	0.07
12	प	-	0	32	ज्ञ	3	0.02
13	क	-	0	33	झ	14	0.11
14	फ	-	0	34	क्ष	25	0.19
15	ह	-	0	35	छ	42	0.32
16	ऊँ	-	0	36	प	88	0.67
17	पु	-	0	37	श	191	1.46
18	ल	-	0	38	म	215	1.63
19	न	-	0	39	र	274	2.09
20	ज	-	0	40	अ	330	2.52

7. CONCLUSIONS

On observing 469580 words from a variety of sources it is found that there are 345 symbols used more frequently in the middle zone. The frequency analysis done for two documents with different contents and sizes shows that 97% text is covered by the single characters and the presence of the conjunct characters in these documents is around 3% only which is very less in comparison to the occurrences of single characters. This is despite the fact that the numbers of possible conjunct symbols are much higher than the possible number of single characters. The overall coverage by these identified 345 symbols is found to be 99.97% on 13113 words in 5 sample-documents from CIIL Text Corpora.

There are 16 different character classes to which a character may belong to based on the structural properties that are invariant across fonts and sizes. A detailed classification scheme is developed to identify the symbols in each of these classes. Some exceptions are found during the analysis over 25 fonts where a symbol falls in another class due to differences in shapes of different fonts. The occurrences of these exceptions from 13113 words in 5 sample-documents from CIIL Text Corpora are found to be very marginal.

The two main sources of errors are incorrect segmentation and classification. To enhance the accuracy rate of character recognition, first level of classification can be done using these 16

structural features which are invariant across fonts and sizes. The second level of classification using any other feature extraction technique can be done on a class which is not further segregated.

The utility of the proposed classification approach is to enhance the recognition accuracies by reducing the errors introduced due to font and size variations.

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