

# Multilingual Artificial Text Extraction and Script Identification from Video Images



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# Multilingual Artificial Text Extraction and Script Identification from Video Images



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# **CERTIFICATE OF ORIGINALITY**

I certify that the intellectual contents of the thesis

*“Multilingual Artificial Text Extraction and Script Identification from Video Images”*

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Signature: \_\_\_\_\_ . Dated: January 31<sup>st</sup> , 2014 .

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## **ABSTRACT**

With the tremendous growth in the amount of multimedia data, especially videos, has increased the need for efficient indexing and retrieval techniques. In addition to the audio-visual content itself, a power tool that can be employed for indexing of videos is the caption text appearing in them. An important component of textual content based video indexing and retrieval systems is the detection and extraction of text from video frames. Most of the existing text extraction system target textual occurrences in a particular script or language. We have proposed a generic multilingual text extraction system that relies on a combination of unsupervised and supervised techniques. The unsupervised approach is based on application of image analysis techniques which exploit the contrast, alignment and geometrical properties of text and identify candidate text regions in an image. Potential text regions are then validated by an Artificial Neural Network (ANN) using a set of features computed from Gray Level Co-occurrence Matrices (GLCM). Detected text regions are then binarized to segment text from the background. The script of the extracted text is finally identified using texture based features based on Local Binary Patterns (LBP). The proposed system was evaluated on video images containing textual occurrences in five different languages including English, Urdu, Hindi, Chinese and Arabic. The promising results of the experimental evaluations validate the effectiveness of the proposed system for text extraction and script identification.

## TABLE OF CONTENTS

<b>1</b>	<b>INTRODUCTION .....</b>	<b>1</b>
1.1	OVERVIEW .....	1
1.2	BACKGROUND .....	1
1.3	PROBLEM STATEMENT .....	2
1.4	PROPOSED METHODOLOGY .....	3
1.5	RESEARCH CONTRIBUTIONS .....	3
1.6	THESIS OUTLINE .....	3
<b>2</b>	<b>LITERATURE REVIEW .....</b>	<b>5</b>
2.1	OVERVIEW .....	5
2.2	TYPES OF TEXT IN IMAGES .....	5
2.2.1	<i>Scene Text</i> .....	5
2.2.2	<i>Caption Text</i> .....	6
2.3	PROPERTIES OF TEXT IN IMAGES .....	6
2.3.1	<i>Geometry</i> .....	7
2.3.1.1	Text size .....	7
2.3.1.2	Alignment.....	7
2.3.2	<i>Color and intensity</i> .....	7
2.3.3	<i>Motion</i> .....	7
2.4	STEPS FOR TEXT DETECTION.....	7
2.4.1	<i>Detection</i> .....	7
2.4.2	<i>Localization</i> .....	8
2.4.3	<i>Tracking</i> .....	8
2.4.4	<i>Extraction</i> .....	9
2.5	APPROACHES FOR TEXT DETECTION .....	9
2.5.1	<i>Un-Supervised Approaches</i> .....	9
2.5.1.1	Edge based methods .....	10
2.5.1.2	Connected component based methods .....	11
2.5.1.3	Texture based methods.....	12
2.5.1.4	Color based methods .....	13
2.6	SUPERVISED APPROACHES .....	15
2.7	SCRIPT IDENTIFICATION METHODS .....	17
2.8	SUMMARY .....	19
<b>3</b>	<b>ARTIFICIAL TEXT DETECTION .....</b>	<b>21</b>
3.1	OVERVIEW .....	21
3.2	CHARACTERISTICS OF TEXT IN VIDEO/IMAGES .....	21
3.2.1	<i>Geometrical Features</i> .....	21
3.2.2	<i>Edges</i> .....	21

3.2.3	<i>Distribution of Intensity Values</i> .....	22
3.3	PROPOSED METHODOLOGY .....	23
3.3.1	<i>Text Detection</i> .....	27
3.3.1.1	Image Resizing and Conversion to Grayscale.....	27
3.3.1.2	Gradient Computation .....	27
3.3.1.3	Average gradient .....	29
3.3.1.4	Binarization .....	31
3.3.1.5	Morphological Processing.....	31
3.3.1.6	Foreground Density Filter .....	32
3.3.1.7	Geometrical Constraints.....	34
3.3.2	<i>Validation of Text Regions</i> .....	37
3.3.2.1	Training .....	37
3.3.2.1.1	Contrast:.....	39
3.3.2.1.2	Correlation .....	39
3.3.2.1.3	Homogeneity .....	40
3.3.2.1.4	Entropy .....	40
3.3.2.1.5	Energy.....	40
3.3.2.2	Validation of Text regions.....	42
3.3.2.3	Text Extraction.....	42
3.4	SCRIPT IDENTIFICATION .....	45
3.4.1	<i>Local Binary Patterns</i> .....	46
3.4.2	<i>Training and Classification</i> .....	48
3.5	SUMMARY .....	48
<b>4</b>	<b>RESULTS AND EXPERIMENTS .....</b>	<b>50</b>
4.1	OVERVIEW .....	50
4.2	DATA SET.....	50
4.3	EVALUATION METRICS .....	51
4.4	GROUND TRUTH LABELING.....	52
4.5	TEXT DETECTION RESULTS .....	54
4.6	SCRIPTS RECOGNITION RESULTS .....	56
4.7	SENSITIVITY TO SYSTEM PARAMETERS .....	56
4.8	SUMMARY .....	58
<b>5.</b>	<b>CONCLUSION AND PERSPECTIVES .....</b>	<b>59</b>
5.1.	CONCLUSION .....	59
5.2.	PERSPECTIVES .....	59
<b>BIBLIOGRAPHY</b>	.....	<b>61</b>

## List of Figures

Figure 2.1: Examples of scene text appearing in videos .....	6
Figure 2.2: Examples of artificial text in videos .....	6
Figure 2.3: Examples of text detection .....	8
Figure 2.4: Examples of text localization (a) Input image frame (b) Text localization .....	8
Figure 2.5: (a) Text Localization (b) Extracted text .....	9
Figure 3.1. Image blocks and their intensity histograms, (a): Text on homogenous background (b): Text on complex background (c): Non-text region .....	23
Figure 3.2: Overview of video indexing and retrieval system .....	24
Figure 3.3: Overview of proposed methodology .....	25
Figure 3.4: Overview of steps involved in text detection and validation .....	26
Figure 3.5: Samples of textual content in five different languages (a) Urdu (b) Arabic (c) Chinese (d) Hindi (e) English.....	28
Figure 3.6: Sobel operator for detection of vertical edges .....	28
Figure 3.7: (a, c) Gray scale images with Chinese and Urdu text respectively, (b, d) Gradient image showing vertical edges .....	29
Figure 3.8: Average gradients of the images in Figure 3.7 .....	30
Figure 3.9: Application of horizontal dilation to merge components .....	32
Figure 3.10: Images after morphological processing (left column) and after application of density filter (right column) .....	33
Figure 3.11: Localized text regions in two images .....	36
Figure 3.12: Images after application of geometrical constraints .....	36
Figure 3.13: Sample training examples (a): Non-text blocks (b) Text blocks .....	38
Figure 3.14: (a) An image with 4 gray levels (b) GLCM using (1, 0) displacement vector .....	39
Figure 3.15: A simple feed forward neural network .....	41
Figure 3.16: Examples of text segmented from the background .....	45
Figure 3.17: LBP Computation (a): Image values (b): Binary codes assignment (c): Weights of neighboring pixels (d): Conversion to decimal.....	46
Figure 3.18: Examples of the ELBP operator [55]. The circular (8, 1), (16, 2), and (24, 3) neighborhoods. ....	47
Figure 3.19: Input Text blocks.....	48
Figure 4.1: Sample images and corresponding ground truth images .....	54

Figure 4.2: (a): Detected text region (b): Ground truth text region .....	55
Figure 4.3: Detection performance as a function of foreground density filter threshold.....	57
Figure 4.4: Script recognition rates as a function of different neighborhoods of LBP .....	58

## List of Tables

Table 3.1: Values of threshold on geometrical constraints .....	36
Table 4.1: Distribution of dataset.....	50
Table 4.2: Precision and recall of text detection (unsupervised) .....	54
Table 4.3. Precision and recall after text validation.....	56
Table 4.4: Script Recognition – Confusion matrix .....	56