Identification of Speed and Unique Letter of Handwriting Using Wavelet and Neural Networks

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Abstract—Graphology is scientific method to evaluation personality and emotion condition through handwriting and signature. There are many features to identify personality so that previous researches made handwriting analysis automatically. There are page margins, spacing, baseline, vertical zone, font size, slant, pen pressure, and the type t letter. While other studies used features of signature. As image, the analysis of graphology is divided into two approaches that graphics features and segmentation digit each character. This research integrated both of approach to identify personality of handwriting. It used speed and the type of a, d, i, m, t letters as features using structure analysis and artificial neural networks. Type of letter recognition was done after character segmentation. Wavelet transform was used to improve recognition. The proposed methods could be used to identify personality of handwriting. Identification of speed feature using structure analysis toward page margin, spacing between lines, and spacing between words that gave 81% accuracy. While identification of unique letters using neural network with multilayer perceptron architecture, which gave 74% accuracy. Variations training data greatly affect recognition.

Keywords—speed and unique letter features, handwriting identification; personality; wavelet extraction; multilayer perceptron.

I. Introduction

Handwriting are image that have certain pattern reflecting anything such personality prediction. Handwriting analysis or Graphology is a scientific method of identifying, evaluating and understanding personality through the strokes and patterns revealed by handwriting. All systems of handwriting analysis are based on the assumption that as a brain controlled, expressive body movement, and handwriting reflects in some way, the dynamics of the human mind or called the personality. Graphology can identify the qualities, traits, attitudes, sentiments or postures that seem indicated in the handwriting; they further seek insight into how these aspects of selfhood may integrate together to constitute the dynamic organization that we recognize as the personality of that writer [1]. Some of guidelines for handwriting analysis are seven basic elements: speed, pressure, shape, dimensions, continuity, direction, and order. Personality overview was obtained from the research on handwriting psychiatric patients [1]. Handwriting can be classified toward various aspects of personality. There are two approaches in graphology i.e. graphical analysis of the structure type of writing and analysis of the type of symbol or letter.

If the graphology test is still done manually it takes a long time considering the aspects reviewed in graphology very much. Besides, accuracy of handwriting analysis depends on how skilled the analyst is. Development in image processing and pattern recognition lead to analyzing of handwriting can be done automatically.

Several research handwriting analysis automatically with the aid of a computer without the human intervention to predict personality traits have been conducted. Some of them, using baseline, the pen pressure and the height of the T-bar on the stem of the letter ‘t’ are considered for predicting the personality of the writer[2]. Other research about personality analysis considered six main different types of features i.e. size of letters, slant of letters and words, baseline, pen pressure, spacing between letters and spacing between words in a document to identify the personality of the writer. It used SVM that generated various parameters are then calculated by simple use of trigonometry and threshold technique [3]. While other research using the polygon method for pattern recognition based handwriting baseline, letter slant and pen pressure, and the identification of letters i and f using template matching as the input of neural networks [4], and toward the size of ‘a’ letters using backpropagation algorithm [5]. There is also research that used Farsi handwriting with the shape of the page margins, line spacing, line skew, word slant, corner sharpness, size of letters, text density, writing speed and regularity of writing. It used support vector machine and identified certain pixel [6]. This research is a continuation of previous research with different features, complementary features for handwriting analysis. Last research used baseline, page margin, spacing, dominance of vertical zone and signature [7], [8]. Others, used form application to identification type of A-Z letters using learning vector quantization [9].

Handwriting is image so that could use some methods toward other image like finger print as biometric analysis [10], [11]. The research study using a neural network with multilayer perceptron.
The method is widely used considering correction weights done for all training data in training [11].

This research using speed feature and type of letter a, d, i, m, and t, it integrated two approach i.e. structure and type of character. Analysis was done of handwriting image of A4 paper.

II. HANDWRITING FEATURES DESCRIPTION

In this research handwriting structure analysis carried out on speed, as in Table I [1].

<table>
<thead>
<tr>
<th>No</th>
<th>Type</th>
<th>Personality</th>
<th>Examples</th>
</tr>
</thead>
<tbody>
<tr>
<td>1</td>
<td>Fast</td>
<td>Respond and think fast, impatient</td>
<td><img src="image" alt="Example Image" /></td>
</tr>
<tr>
<td>2</td>
<td>Normal</td>
<td>Able to arrange something well</td>
<td><img src="image" alt="Example Image" /></td>
</tr>
<tr>
<td>3</td>
<td>Slow</td>
<td>Calm, happy, but slow in execution</td>
<td><img src="image" alt="Example Image" /></td>
</tr>
</tbody>
</table>

Meanwhile type of letter identification using five letters that are a, d, i, m, t. It is illustrated as Table II.

<table>
<thead>
<tr>
<th>No</th>
<th>Letter</th>
<th>Type</th>
<th>Examples of Features each class</th>
</tr>
</thead>
<tbody>
<tr>
<td>1</td>
<td>a</td>
<td>5</td>
<td><img src="image" alt="Example Image" /></td>
</tr>
<tr>
<td>2</td>
<td>d</td>
<td>1</td>
<td><img src="image" alt="Example Image" /></td>
</tr>
<tr>
<td>3</td>
<td>i</td>
<td>2</td>
<td><img src="image" alt="Example Image" /></td>
</tr>
<tr>
<td>4</td>
<td>m</td>
<td>1</td>
<td><img src="image" alt="Example Image" /></td>
</tr>
<tr>
<td>5</td>
<td>t</td>
<td>5</td>
<td><img src="image" alt="Example Image" /></td>
</tr>
</tbody>
</table>

In this study, type of font that identified tend to not good personalities. So that, it may not appear in certain handwriting.

III. PROPOSED METHODS

Pattern recognition performed on a sheet of A4 handwritten scanned using a scanner in jpg or bmp format as Fig 1. Speed feature used last analysis of margin, spacing between baseline and word with decision function. Meanwhile, type of letter analysis after character segmentation. Each features recognized in parallel that indicates the distinct personality, in order to obtain a review until six personalities. The unique letters identified tend to reflect not good personality, so that in certain handwriting may will not be appear. Of the five letters that were identified have various types, all of which have 14 types, Identification system has 15 classes, with the addition of one class to type or other letters.

A. Data Acquisition

Handwriting of different individuals are used in this research which is digitally collected by scanning the handwriting of 25 different writers (training data) and 100 different writers (testing data). Each of them was asked to write a text document of simple in running hand. Most of the handwritings are printed but few of them are cursive handwriting. The samples were written on A4 size paper without any lines. In pre-processing stage, image processing was done with gray scale and threshold so the handwriting image in a bit then segmented.

B. Segmentation

The process of feature extraction is done before type of font identification. Segmentation performed on three stages, i.e. vertical segmentation, horizontal segmentation, lines segmentation as Fig 3 and character segmentation as Fig. 4.

![Identification handwriting system using speed and a, d, i, m, t](image)
Vertical segmentation divide the image into three sections that right and left side of the image used to analyze page margin. Whereas spacing between lines analysis using left side. Horizontal segmentation to divide into three parts which middle segment are processed into line segments. The process begins by taking the coordinates of x in the upper left corner and y coordinates of the lower left corner. Having found the black pixel value of x will be stored as the value CropX1. Then look for the value of the value of x CropX2 started last form to the right y-axis until no black pixels are found. Then look CropY1 and CropY2 the same process starting from the bottom point. It used to classify dominance zone, baseline patterns and spaces between words features.

Segmentation of the character will be processed from the word segmentation. Rules for segmentation letters will start from the top left of the word. Checking used pixel analysis from the top left vertically. Segmentation of the character for some distance between letters.

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Each character classified in 14 type of letter that five type of “a” letter, one type of “d”, two type of “i”, a type of “m”, and five type of “t” letter. Total of all is 14 type of letter. In addition a class, the system become 15 classes. Last class is for other type or letter. It consists of input layer (500 neurons), hidden layer (10 neurons) and output layer (15 neurons). The error between the output of the feed-forward network and the target became the basis of the correct weight, which is done by back propagation algorithm. It is illustrated in Fig 4. Unique identification letters conducted all character that has segmented, thus allowing more than one type of letters from around the handwriting paper. Five dominant types of letters written as output personality identification system.

**IV. Result and Discussion**

Testing of identification system performed comparing visual observation. Tests carried out on speed feature and unique letter. So testing is done separately. Training of ANN identification is also conducted each unique letter that take half hour to finish training.

Speed identification result 81% accuracy. It may less decision function and variation of data training. Meanwhile, identification testing of unique letter gave 62-87% accuracy and 74% average. It is showed as Table IV, using 20 testing data.

**TABLE VII. IDENTIFICATION OF UNIQUE LETTER**

<table>
<thead>
<tr>
<th>Letter</th>
<th>Class</th>
<th>Number of Training Data</th>
<th>Accuracy (%)</th>
</tr>
</thead>
<tbody>
<tr>
<td>a</td>
<td>5</td>
<td>150</td>
<td>73</td>
</tr>
<tr>
<td>d</td>
<td>2</td>
<td>60</td>
<td>62</td>
</tr>
<tr>
<td>i</td>
<td>3</td>
<td>90</td>
<td>87</td>
</tr>
<tr>
<td>m</td>
<td>2</td>
<td>60</td>
<td>82</td>
</tr>
<tr>
<td>t</td>
<td>6</td>
<td>180</td>
<td>67</td>
</tr>
<tr>
<td>Average</td>
<td></td>
<td></td>
<td>74.2</td>
</tr>
</tbody>
</table>

The system has been implemented to software so that easy to use it. Pattern recognition handwriting and signature will result until personalities. But, it will be without unique letter identification. It gives more of an overview of the author's personality.

Weakness of the identification in word segmentation and character segmentation. It was when the handwritten form of writing connecting

**V. CONCLUSION**

This research proposed methods to develop system that can identify the type of handwriting from a variety of features personalities using multi structure and ANN algorithm. It is useful to obtain an overall picture of the personality. The system using combination of structure approach and symbol approach. It provides convenience to our analysis on a piece of paper like a hand writing curriculum vitae, without the need for specially created application form.

Using multilayer perceptron gave identification accuracy 74% average. Type of “d” letter less than other letter. While identification of unique letter gave 81% accuracy.

This system has been implemented in software to provide convenience to the public in identifying personality easily and quickly. It can be used in the selection of the employee or job application letter. Besides the system can apply in determination of an appropriate field of study.

For the future, handwriting pattern recognition system can increase the number of features in order to provide a more complete picture of personality. It should also consider variation of training data and more optimal parameters of training in order to provide better accuracy. In addition, it is necessary to find the relation between personality pictures of the handwritten signatures for more accurate prediction of personality

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