

MULTIMODAL RECOGNITION: HANDWRITING & SPEECH

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INTRODUCTION

To access the information contained in digital historical text documents its transcription is necessary. Transcriptions can be achieved by using Handwritten Text Recognition (HTR) on digitalized pages or using Automatic Speech Recognition (ASR) on the dictation of the contents.

In this work, we will check the effectiveness of a third option, that is using both systems in a multimodal combination.

AIM AND SPECIFIC OBJECTIVES

Aim

To reduce the error in the recognition of handwritten text at both word (WER) and character (CER) level.

Objectives

- 1. To study the techniques of morphological and acoustic modeling.
- 2. To study the use of Recurrent Neural Networks (RNN) on the morphological and acoustic modeling with Long Short-Term Memory (LSTM) features.
- 3. To study the techniques of writer and speaker adaptation.
- 4. To study the iterative and non-iterative multimodal interaction. 5. To study the combination of word graphs.



EXPECTED RESULTS

Preliminary results show that our multimodal system improves the HTR baseline despite the huge error in the ASR baseline. However, as we can see to get a significant improvement it is necessary to perform an iterative multimodal recognition.

HANDWRITTEN TEXT & AUTOMATIC SPEECH RECOGNITION

Acoustic Word graphs and morphological combination modeling Main stages Iterative Neural of research processing Networks development Writer and Multimodal speaker integration adaptation

The HTR and ASR problems are formulated in a very similar way that allows integration into a multimodal system. The unimodal formulation is: given a handwritten text image or a speech signal encoded into the feature vector sequence $\vec{x} =$ (x_1, x_2, \ldots, x_T) , finding the most likely word sequence $\vec{w} = (w_1 w_2 \dots w_l)$, that is:

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\vec{\hat{w}} = \arg\max_{\vec{w}} \Pr(\vec{w}|\vec{x})
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 $\vec{\hat{w}} = \arg\max_{\vec{w}} \Pr(\vec{x}|\vec{w}) \Pr(\vec{w})$

Where, $Pr(\vec{x}|\vec{w})$ is the morphologic or



We expect to obtain highly significant results in the non-iterative multimodal system using robust modeling techniques along with new techniques of multimodal interaction and combination.



acoustic model and $Pr(\vec{w})$ is the language model.

POSSIBLE USES

The results of this research could be used to create assistance systems that combine handwriting with speech. Some utilities might be:

1. As assistance in transcription of historical text documents.



Richard III book

http://www.dailymail.co.uk

2. As a complement during the drafting of documents with graphics tablets or touch screens.



MAIN REFERENCES

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