# Text Line Extraction Based on Distance Map Features and Dynamic Programming 

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## Motivation

- Text line Segmentation (TLS) is a basic layout document task that is a pre-requisite for most KWS and HTR systems.
- TLS is usually tackled in two steps: detection and extraction
- The document layout community has currently shifted the focus to baseline detection only.
- This focus change creates the need for extraction methods that are able to capitalize on the results yielded by these new baseline detection systems.
- We present a robust binarization-free approach inspired in path planning algorithms that uses the baseline information and a distance map in order to calculate equidistant separation frontiers


## The Distance Model

- Approach inspired in DTOCS and WDTOCS ideas
- Distance map calculated on grey-scale image of page



## Baseline Usage and Frontier Calculation

 Two levels of modelling:- Use baselines to delimit search areas:

- Forward-Backward dynamic programming algorithm calculates best 8-connected path:



## Issue Resolution

- No hard frontiers implies an optimal path will always be computed
- Collisions with black pixels can be detected and corrected



## ICDAR'13 Competition Dataset Results

- ICDAR 2013 Competition corpus with standard measures used
- Two baseline scenarios: ground-truth vs automatically detected
- Automatically detected baselines were yielded by a system based on extremely randomized trees and the dbscan algorithm
- Two extraction polygon scenarios reviewed: simple projection vs dynamic programming

| Method | $D_{R}(\%)$ | $R_{A}(\%)$ | $F_{M}(\%)$ |
| :--- | ---: | ---: | ---: |
| REGIM | 40.38 | 35.70 | 37.90 |
| AegeanUniv | 77.59 | 77.21 | 77.40 |
| PRHLT-17 + Simple Projection | 89.84 | 83.56 | 86.59 |
| ETS | 86.66 | 86.68 | 86.67 |
| Jadavpur Univ | 87.78 | 86.90 | 87.34 |
| GT. Base lines + Simple Projection | 89.27 | 89.24 | 89.25 |
| LRDE | 96.70 | 88.20 | 92.25 |
| PPSL | 94.00 | 92.85 | 93.42 |
| PRHLT-17 + Proposed Method | 95.8 | 93.10 | 94.43 |
| PortoUniv | 94.47 | 94.61 | 94.54 |
| CASIA-MSTSeg | 95.86 | 95.51 | 95.68 |
| URO-17 | 96.75 | 96.21 | 96.48 |
| CVC-14 | 98.40 | 95.00 | 96.67 |
| CMM | 98.54 | 98.29 | 98.42 |
| PAIS | 98.49 | 98.56 | 98.52 |
| INMC | 98.68 | 98.64 | 98.66 |
| ILSP-LWSeg-09 | 99.16 | 98.94 | 99.05 |
| GT. Baselines + Proposed Method | 99.62 | 99.58 | 99.60 |

## Segmentation Results VS. HTR Results

- Experiments were carried out using the C5 Hattem Manuscript
- From the total of 572 leaves, a subset of 40 pages was used
- WER and CER results were calculated in a 8-block cross-validation experiment for each scenario
- Graphical error competition measure was calculated to review correlation

| Extr. Method | GT | Simple Proj. |  | DP |  |
| :--- | ---: | ---: | ---: | ---: | ---: |
| Baseline Type | NA | Straight | Line Seg. | Straight | Line Seg. |
| $o 2 o$ | 1592 | 1217 | 1306 | 1376 | 1405 |
| $F_{M}(\%)$ | 100 | 76.4 | 82.0 | 88.4 | 93.1 |
| WER | 34.8 | 36.3 | 35.4 | 37.83 | 35.18 |
| CER | 15.8 | 18.1 | 17.3 | 17.9 | 16.2 |

## CONCLUSIONS

- We present a text line extraction approach that is applicable to printed as well as historical handwritten text
- The algorithm generates separation frontiers that are equidistant to the two adjacent text lines
- The method is able to capitalize on the detected baselines provided by other methods
- Our solution yields better results proportionally to the quality of the provided baselines
- We have experimentally proved that baseline detection performs the brunt of the work required for text line segmentation
- Our experimentation provides insight into the lack of correlation between the graphical error measure and the word error measure


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