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UNIVERSITÀ DEGLI STUDI DI  
MODENA E REGGIO EMILIA

AI Image <sup>Lab</sup>

# XDOCS: an Application to Index Historical Documents



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# Outline of the Presentation

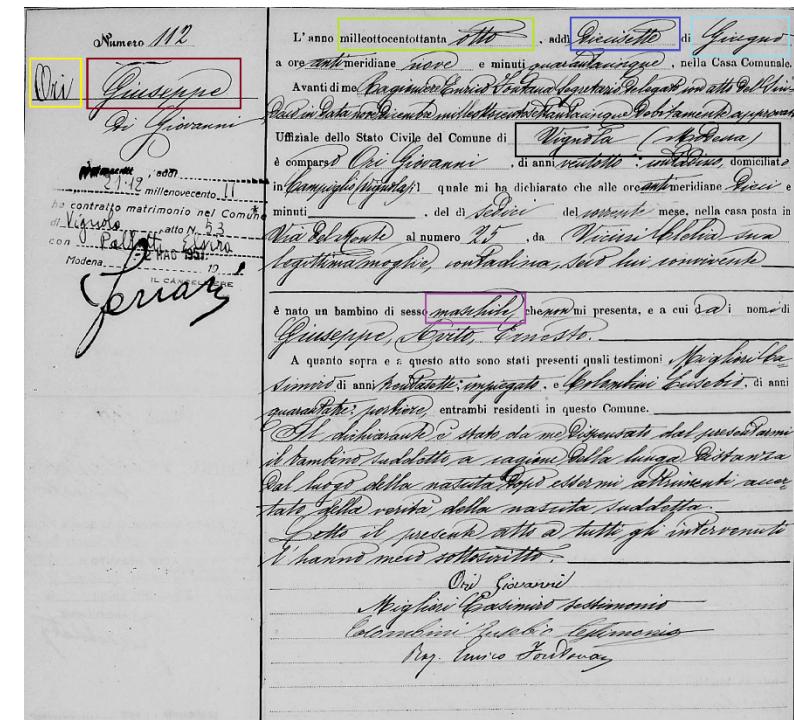
- Introduction
- The XDOCS application:
  - Words extraction pipeline
  - Annotation tools
- A new challenging dataset
- Conclusions

# Introduction

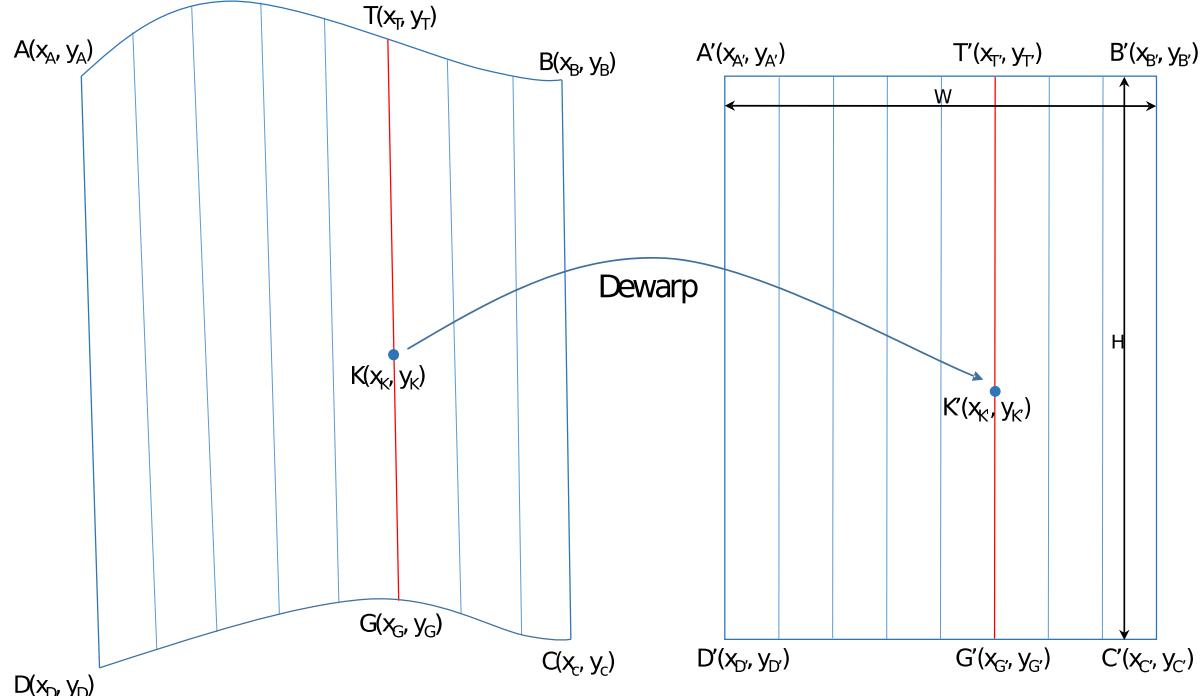
- The availability of large collection of handwritten historical manuscripts is often required but their diffusion is limited by:
  - Physical condition
  - Handwriting style
  - Graphic artifacts
- Dematerialization and digitalization represent a possible solution but:
  - Costly and time-consuming
  - *Optical Character Recognizers* (OCRs) often fail

# The XDOCS Application

- Goal: develop an innovative data capturing technique able to extract document indexes semi-automatically.
- The application can be splitted into three main blocks:
  - Page Dewarping
  - Word Spotting
  - Annotation tools



# Page Dewarping - Method

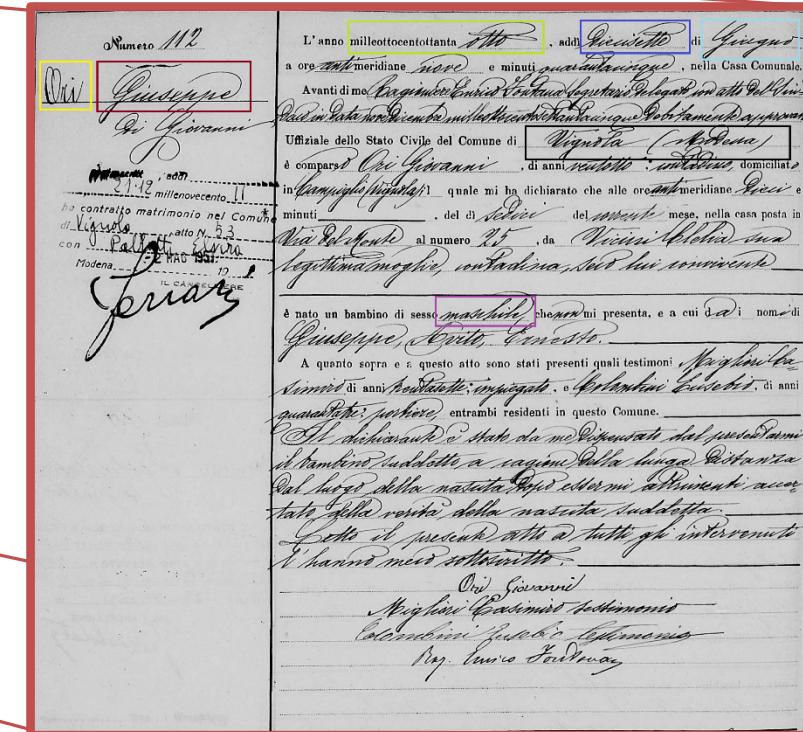
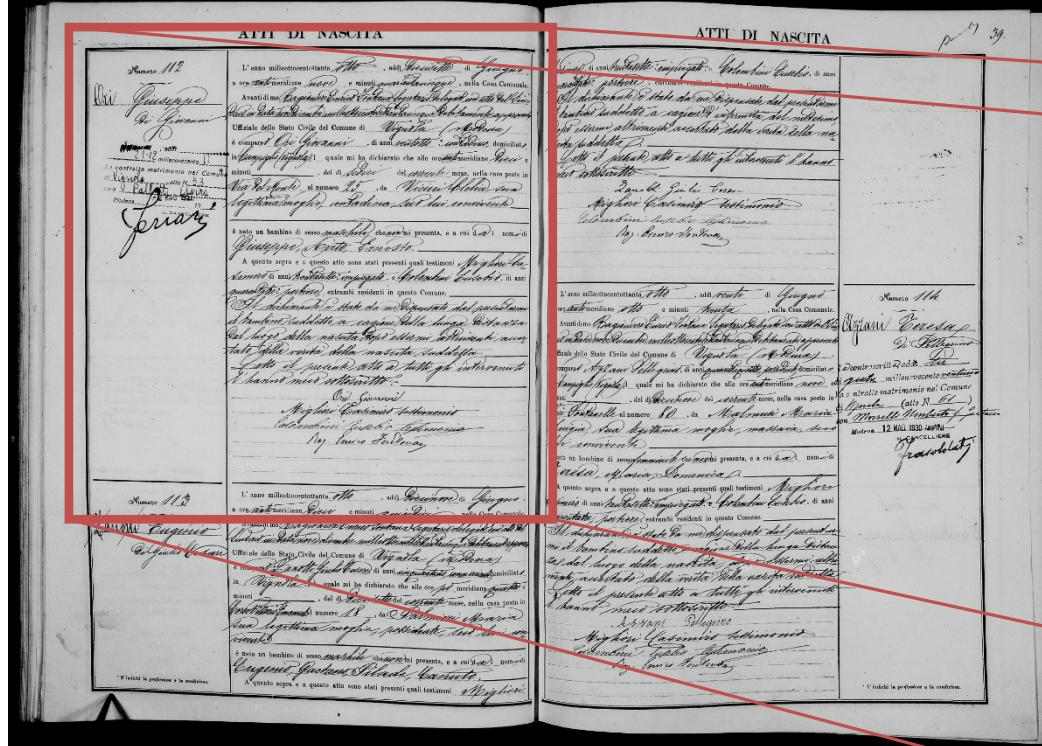


Aims at mapping the projection of the curved surface, represented by four polynomial lines, to a 2D rectangular area with fixed size.

$$\begin{cases} x'_k = x'_A + W * \frac{|AT|}{|AB|} \\ y'_k = y'_A + H * \frac{|TK|}{|TG|} \end{cases}$$

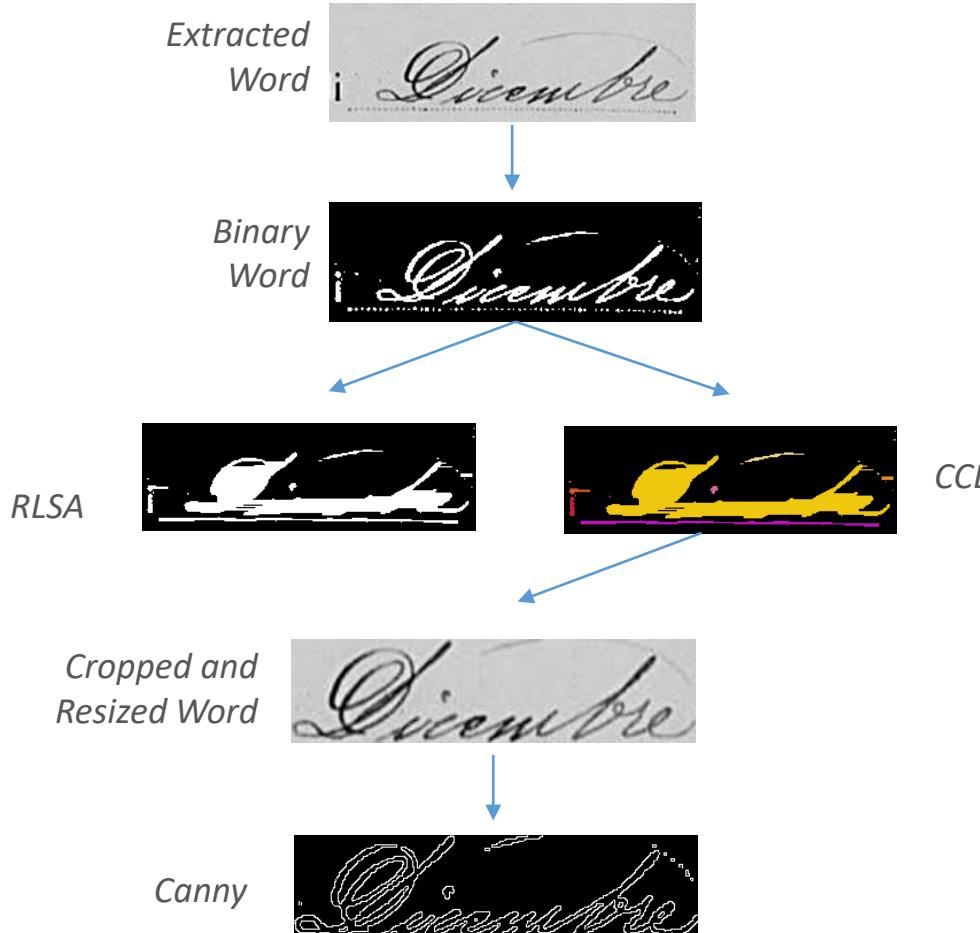
[1] N. Stamatopoulos, B. Nikolaos: "A two-step dewarping of camera document images." Document Analysis Systems, 2008

# Page Dewarping - Results

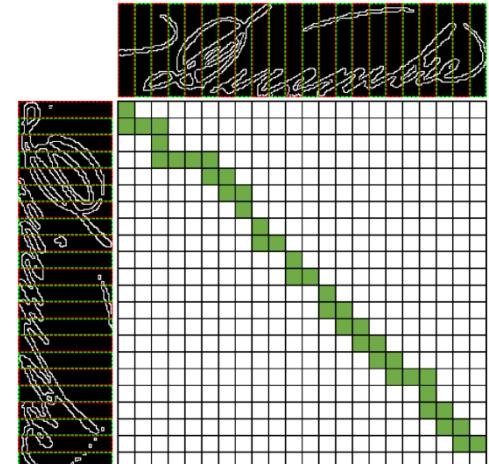


# Word Spotting - Method

## ① Word Extraction and Preprocessing



## ② Word Matching Based on HOG Descriptor and Dynamic Time Warping



$$DTW(i, j) = \min \begin{cases} DTW(i-1, j) \\ DTW(i, j-1) \\ DTW(i-1, j-1) \end{cases} + \sum_{k=1}^N |x_{ik} - y_{jk}|$$

# Word Spotting - Results

**Intra and Inter dataset evaluation of word spotting algorithm with:**

- Mean Averages Precision (MAP) with *cut-off* at  $C = \{5, 10, 15\}$ :

$$MAP@n = \frac{\sum_{i=1}^Q ap@n_i}{N} \quad ap@n = \frac{\sum_{k=1}^n P(k)}{\min(m, n)}$$

- Correct Match First (CMF): percentage of queries with  $P(1) = 1$ .

|                |        | <i>Vignola</i> | <i>Carpi</i> | <i>Formig.</i> |
|----------------|--------|----------------|--------------|----------------|
| <i>Vignola</i> | MAP@05 | 0.528          | 0.1          | 0.181          |
|                | MAP@10 | 0.38           | 0.086        | 0.144          |
|                | MAP@15 | 0.306          | 0.093        | 0.132          |
|                | CMF    | 75.25%         | 17.82%       | 26.73%         |
| <i>Carpi</i>   | MAP@05 | 0.135          | 0.466        | 0.095          |
|                | MAP@10 | 0.101          | 0.434        | 0.078          |
|                | MAP@15 | 0.079          | 0.414        | 0.072          |
|                | CMF    | 14.53%         | 63.25%       | 15.38%         |
| <i>Formig.</i> | MAP@05 | 0.192          | 0.127        | 0.644          |
|                | MAP@10 | 0.156          | 0.114        | 0.541          |
|                | MAP@15 | 0.135          | 0.121        | 0.476          |
|                | CMF    | 24.69%         | 19.25%       | 77.82%         |

Results with 16 pixels stride

|                |        | <i>Vignola</i> | <i>Carpi</i> | <i>Formig.</i> |
|----------------|--------|----------------|--------------|----------------|
| <i>Vignola</i> | MAP@05 | 0.665          | 0.102        | 0.222          |
|                | MAP@10 | 0.493          | 0.093        | 0.189          |
|                | MAP@15 | 0.4            | 0.098        | 0.17           |
|                | CMF    | 87.13%         | 14.85%       | 27.22%         |
| <i>Carpi</i>   | MAP@05 | 0.159          | 0.578        | 0.125          |
|                | MAP@10 | 0.117          | 0.536        | 0.101          |
|                | MAP@15 | 0.091          | 0.527        | 0.096          |
|                | CMF    | 19.66%         | 73.50%       | 17.95%         |
| <i>Formig.</i> | MAP@05 | 0.309          | 0.177        | 0.823          |
|                | MAP@10 | 0.235          | 0.152        | 0.708          |
|                | MAP@15 | 0.194          | 0.153        | 0.621          |
|                | CMF    | 40.59%         | 26.77%       | 94.14%         |

Results with 2 pixels stride

|                |        | <i>Vignola</i> | <i>Carpi</i> | <i>Formig.</i> |
|----------------|--------|----------------|--------------|----------------|
| <i>Vignola</i> | MAP@05 | 0.468          | 0.042        | 0.077          |
|                | MAP@10 | 0.347          | 0.034        | 0.057          |
|                | MAP@15 | 0.276          | 0.028        | 0.05           |
|                | CMF    | 68.32%         | 9.90%        | 13.37%         |
| <i>Carpi</i>   | MAP@05 | 0.086          | 0.445        | 0.087          |
|                | MAP@10 | 0.06           | 0.411        | 0.067          |
|                | MAP@15 | 0.05           | 0.382        | 0.058          |
|                | CMF    | 13.78%         | 51.70%       | 15.34%         |
| <i>Formig.</i> | MAP@05 | 0.097          | 0.053        | 0.557          |
|                | MAP@10 | 0.071          | 0.045        | 0.413          |
|                | MAP@15 | 0.06           | 0.042        | 0.342          |
|                | CMF    | 19.25%         | 9.21%        | 80.33%         |

[3] T. M. Rath and R. Manmatha: *Word Image Matching Using Dynamic Time Warping*. In: Proc. of the Conf. on Computer Vision and Pattern Recognition (CVPR), 2007

# Annotation Tool

XDOCS v.0.0.0

Template Batch Manager Annotazioni Impostazioni

Ricerca

Volume

Comune

Informazioni Aggiuntive

Reset Cerca

Documento:

Indice: Mese Nascita

Solo annotazioni senza valore impostato

Tipologia atto: \* Atto di nascita

Anno: \* 1899

Volume: \* 1

Regione: \* Emilia-Romagna

Provincia: \* Modena

Comune: \* Sestola

Annotations

| Id.                          | Immagine | Comparazioni                                | %  | Salva | Elimina |
|------------------------------|----------|---|----|-------|---------|
| 4950<br>Doc. 44<br>Nº atto 1 |          | Distanza: 2,646<br>                         | 80 |       |         |
|                              |          | Distanza: 2,879<br>                         |    |       |         |
|                              |          | Distanza: 2,985<br>                         |    |       |         |
|                              |          | Distanza: 3,013<br>                         |    |       |         |
|                              |          | Distanza: 3,096<br><input type="checkbox"/> |    |       |         |
| 4955<br>Doc. 44<br>Nº atto 2 |          | Distanza: 2,572<br>                         | 60 |       |         |
|                              |          | Distanza: 2,572<br>                         |    |       |         |
|                              |          | Distanza: 2,828<br><input type="checkbox"/> |    |       |         |
|                              |          | Distanza: 2,862<br><input type="checkbox"/> |    |       |         |
|                              |          | Distanza: 2,874<br>                         |    |       |         |
| 4960<br>Doc. 44<br>Nº atto 3 |          | Distanza: 2,432<br><input type="checkbox"/> |    |       |         |
|                              |          | Distanza: 2,572<br>                         |    |       |         |
|                              |          | Distanza: 2,572<br>                         |    |       |         |
|                              |          | Distanza: 2,668<br><input type="checkbox"/> |    |       |         |
|                              |          | Distanza: 2,698<br><input type="checkbox"/> |    |       |         |

Atti per pagina: 10

Alta affidabilità

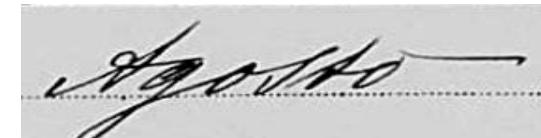
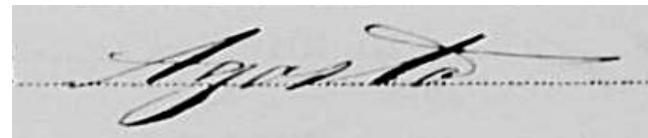
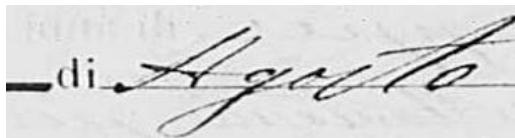
Media affidabilità

Non presente

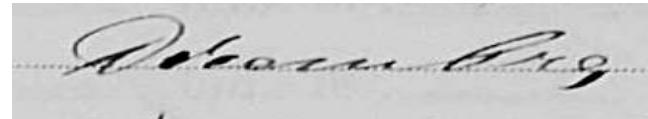
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# A New Challenging Dataset

- To test and evaluate the XDOCS indexing pipeline, a huge amount of single word images has been collected and annotated.
- The dataset consists of more than 3000 annotated word images of handwritten names, surnames, birthdays, municipalities, and months and ..
- .. it is publicly available at: [aimagelab.ing.unimore.it/XDOCS](http://aimagelab.ing.unimore.it/XDOCS)



*Inter dataset variations*



*Intra dataset variations*

# Conclusions

- XDOCS as a tool to encourage the diffusion of handwritten historical documents
- Technical details on which the system is based:
  - Page Dewarping and Word Spotting
- Description of the *Annotation* tools
- Publication of a new dataset

## Acknowledgement

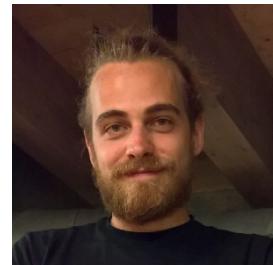
- The project is co-funded by the Emilia-Romagna regional administration, SATA s.r.l. and the University of Modena and Reggio Emilia



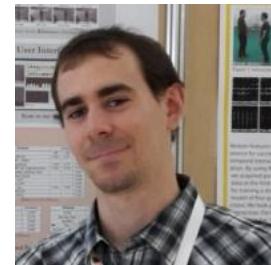
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Thank you!

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