Horst Bunke
A. Lawrence Spitz (Eds.)

# **Document Analysis Systems VII**

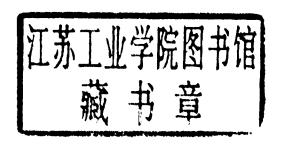
7th International Workshop, DAS 2006 Nelson, New Zealand, February 2006 Proceedings





# Document Analysis Systems VII

7th International Workshop, DAS 2006 Nelson, New Zealand, February 13-15, 2006 Proceedings





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#### Preface

DAS 2006 is the Seventh International Association for Pattern Recognition Workshop on Document Analysis Systems and was held in Nelson, New Zealand. DAS 2006 built on the tradition of past workshops held in Kaiserslautern, Germany (1994), Malvern, PA (1996), Nagano, Japan (1998), Rio de Janeiro, Brazil (2000), Princeton, NJ (2002), and Florence, Italy (2004). The goal of this meeting is to bring together those who have designed systems, or systems components, to solve real-world problems in document analysis.

Document analysis systems is inherently an interdisciplinary field encompassing such diverse disciplines as image processing, pattern recognition, document structure and natural language processing. DAS 2006 attempted to bring these disciplines together and to provide interactions between systems developers, suppliers and end users.

We received 78 papers from 19 countries. Each submission was reviewed by three reviewers. In addition to the Program Committee members, 42 other reviewers helped in this process. From those submissions and their reviews, we went through the difficult and sometimes painful process of ranking papers for acceptance or rejection. In the end we accepted 33 papers for oral presentation and 22 for presentation at poster sessions.

We, the Co-chairmen of DAS 2006, wish to express our gratitude to all of our colleagues who have reviewed the papers submitted for this conference.

We are proud to have brought two distinguished speakers to Nelson for keynote addresses: Ian Witten of the University of Waikato, the father of the New Zealand Digital Library, and James Fruchterman, a pioneer in modern commercial optical character recognition and currently CEO of Benetech.

We owe a special debt of gratitude to Marcus Liwicki of the University of Bern for his tireless work at maintaining the website, managing the flow of papers and reviews into the ConfMan system and assembling the proceedings for publication by Springer. He was ably assisted by Andreas Schlapbach.

We are fortunate that Siemens, Hitachi and Humanware provided DAS with financial support, and we thank them for doing so. Additionally, following the DAS tradition, the organizers of DAS 2004 have passed on the surplus from running that workshop for our use.

But ultimately it is the collection of authors who submitted papers to DAS to whom we owe the greatest gratitude. It is on them and their high-quality submissions that the success of DAS 2006 relies.

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DAS 2006 was organized by DocRec Ltd.

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# **Table of Contents**

Session 1: Digital Libraries	
Retrieval from Document Image Collections  A. Balasubramanian, Million Meshesha, C.V. Jawahar	1
A Semi-automatic Adaptive OCR for Digital Libraries Sachin Rawat, K.S. Sesh Kumar, Million Meshesha, Indraneel Deb Sikdar, A. Balasubramanian, C.V. Jawahar	13
Session 2: Image Processing	
Contribution to the Discrimination of the Medieval Manuscript Texts: Application in the Palaeography  Ikram Moalla, Frank LeBourgeois, Hubert Emptoz, Adel M. Alimi	25
Restoring Ink Bleed-Through Degraded Document Images Using a Recursive Unsupervised Classification Technique  Drira Fadoua, Frank Le Bourgeois, Hubert Emptoz	38
Networked Document Imaging with Normalization and Optimization  Hirobumi Nishida	50
Gray-Scale Thinning Algorithm Using Local Min/Max Operations  Kyoung Min Kim, Buhm Lee, Nam Sup Choi, Gwan Hee Kang,  Joong Jo Park, Ching Y. Suen	62
Session 3: Handwriting 1	
Automated Scoring of Handwritten Essays Based on Latent Semantic Analysis	
Sargur Srihari, Jim Collins, Rohini Srihari, Pavithra Babu, Harish Srinivasan	71
Aligning Transcripts to Automatically Segmented Handwritten  Manuscripts  Jamie Rothfeder, R. Manmatha, Toni M. Rath	84
Virtual Example Synthesis Based on PCA for Off-Line Handwritten Character Recognition	
Hidetoshi Miyao, Minoru Maruyama	96

Extraction of Handwritten Text from Carbon Copy Medical Form Images Robert Milewski, Venu Govindaraju	106
Session 4: Document Structure and Format	
Document Logical Structure Analysis Based on Perceptive Cycles  Yves Rangoni, Abdel Belaïd	117
A System for Converting PDF Documents into Structured XML Format Hervé Déjean, Jean-Luc Meunier	129
XCDF: A Canonical and Structured Document Format  Jean-Luc Bloechle, Maurizio Rigamonti, Karim Hadjar,  Denis Lalanne, Rolf Ingold	141
Structural Analysis of Mathematical Formulae with Verification Based on Formula Description Grammar Seiichi Toyota, Seiichi Uchida, Masakazu Suzuki	153
Session 5: Tables	
Notes on Contemporary Table Recognition  David W. Embley, Daniel Lopresti, George Nagy	164
Handwritten Artefact Identification Method for Table Interpretation with Little Use of Previous Knowledge  Luiz Antônio Pereira Neves, João Marques de Carvalho,  Jacques Facon, Flávio Bortolozzi, Sérgio Aparecido Ignácio	176
Session 6: Handwriting 2	
Writer Identification for Smart Meeting Room Systems  Marcus Liwicki, Andreas Schlapbach, Horst Bunke, Samy Bengio,  Johnny Mariéthoz, Jonas Richiardi	186
Extraction and Analysis of Document Examiner Features from Vector Skeletons of Grapheme 'th'  Vladimir Pervouchine, Graham Leedham	196
Segmentation of On-Line Handwritten Japanese Text Using SVM for Improving Text Recognition  Bilan Zhu, Junko Tokuno, Masaki Nakagawa	208

Application of Bi-gram Driven Chinese Handwritten Character Segmentation for an Address Reading System Yan Jiang, Xiaoqing Ding, Qiang Fu, Zheng Ren	220
Session 7: Language and Script Identification	
Language Identification in Degraded and Distorted Document Images Shijian Lu, Chew Lim Tan, Weihua Huang	232
Bangla/English Script Identification Based on Analysis of Connected Component Profiles  Lijun Zhou, Yue Lu, Chew Lim Tan	243
Script Identification from Indian Documents Gopal Datt Joshi, Saurabh Garg, Jayanthi Sivaswamy	255
Finding the Best-Fit Bounding-Boxes  Bo Yuan, Leong Keong Kwoh, Chew Lim Tan	268
Session 9: Systems and Performance Evaluation	
Towards Versatile Document Analysis Systems  Henry S. Baird, Matthew R. Casey	280
Exploratory Analysis System for Semi-structured Engineering Logs Michael Flaster, Bruce Hillyer, Tin Kam Ho	291
Ground Truth for Layout Analysis Performance Evaluation  A. Antonacopoulos, D. Karatzas, D. Bridson	302
On Benchmarking of Invoice Analysis Systems  Bertin Klein, Stefan Agne, Andreas Dengel	312
Semi-automatic Ground Truth Generation for Chart Image Recognition  Li Yang, Weihua Huang, Chew Lim Tan	324
Session 10: Retrieval and Segmentation	
Efficient Word Retrieval by Means of SOM Clustering and PCA Simone Marinai, Stefano Faini, Emanuele Marino, Giovanni Soda	336
The Effects of OCR Error on the Extraction of Private Information  Kazem Taghva, Russell Beckley, Jeffrey Coombs	348

#### XII Table of Contents

Combining Multiple Classifiers for Faster Optical Character Recognition  Kumar Chellapilla, Michael Shilman, Patrice Simard	358
Performance Comparison of Six Algorithms for Page Segmentation  Faisal Shafait, Daniel Keysers, Thomas M. Breuel	368
Posters	
HVS Inspired System for Script Identification in Indian Multi-script Documents Peeta Basa Pati, A.G. Ramakrishnan	380
A Shared Fragments Analysis System for Large Collections of Web Pages  Junchang Ma, Zhimin Gu	390
Offline Handwritten Arabic Character Segmentation with Probabilistic Model	
Pingping Xiu, Liangrui Peng, Xiaoqing Ding, Hua Wang	402
Automatic Keyword Extraction from Historical Document Images  Kengo Terasawa, Takeshi Nagasaki, Toshio Kawashima	413
Digitizing a Million Books: Challenges for Document Analysis  K. Pramod Sankar, Vamshi Ambati, Lakshmi Pratha,  C.V. Jawahar	425
Toward File Consolidation by Document Categorization  Abdel Belaïd, André Alusse	437
Finding Hidden Semantics of Text Tables  Saleh A. Alrashed	449
Reconstruction of Orthogonal Polygonal Lines  Alexander Gribov, Eugene Bodansky	462
A Multiclass Classification Framework for Document Categorization Qi Qiang, Qinming He	474
The Restoration of Camera Documents Through Image Segmentation Shijian Lu, Chew Lim Tan	484
Cut Digits Classification with k-NN Multi-specialist Fernando Boto, Andoni Cortés, Clemente Rodríguez	496

Automatic Text Classification  Mayo Murata, Lazaro S.P. Busagala, Wataru Ohyama,  Tetsushi Wakabayashi, Fumitaka Kimura	506
A Method for Symbol Spotting in Graphical Documents  Daniel Zuwala, Salvatore Tabbone	518
Groove Extraction of Phonographic Records Sylvain Stotzer, Ottar Johnsen, Frédéric Bapst, Rolf Ingold	529
Use of Affine Invariants in Locally Likely Arrangement Hashing for Camera-Based Document Image Retrieval  Tomohiro Nakai, Koichi Kise, Masakazu Iwamura	541
Robust Chinese Character Recognition by Selection of Binary-Based and Grayscale-Based Classifier  Yoshinobu Hotta, Jun Sun, Yutaka Katsuyama, Satoshi Naoi	553
Segmentation-Driven Recognition Applied to Numerical Field Extraction from Handwritten Incoming Mail Documents  Clément Chatelain, Laurent Heutte, Thierry Paquet	564
Performance Evaluation of Text Detection and Tracking in Video  Vasant Manohar, Padmanabhan Soundararajan, Matthew Boonstra,  Harish Raju, Dmitry Goldgof, Rangachar Kasturi, John Garofolo	576
Document Analysis System for Automating Workflows Steven J. Simske, Jordi Arnabat	588
Automatic Assembling of Cadastral Maps Based on Generalized Hough Transformation  Fei Liu, Wataru Ohyama, Tetsushi Wakabayashi,	
Fumitaka Kimura	593
A Few Steps Towards On-the-Fly Symbol Recognition with Relevance Feedback  Jan Rendek, Bart Lamiroy, Karl Tombre	604
The Fuzzy-Spatial Descriptor for the Online Graphic Recognition:  Overlapping Matrix Algorithm  Noorazrin Zakaria, Jean-Marc Ogier, Josep Llados	616
Author Index	629

# Retrieval from Document Image Collections

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Abstract. This paper presents a system for retrieval of relevant documents from large document image collections. We achieve effective search and retrieval from a large collection of printed document images by matching image features at word-level. For representations of the words, profile-based and shape-based features are employed. A novel DTW-based partial matching scheme is employed to take care of morphologically variant words. This is useful for grouping together similar words during the indexing process. The system supports cross-lingual search using OM-Trans transliteration and a dictionary-based approach. System-level issues for retrieval (eg. scalability, effective delivery etc.) are addressed in this paper.

#### 1 Introduction

Large digital libraries, such as Digital Library of India (DLI) [1] are emerging for archiving large collection of printed and handwritten documents. The DLI aims at digitizing all literary, artistic, and scientific works of mankind so as to create better access to traditional materials, easier preservation, and make documents freely accessible to the global society. More than 25 scanning centers all over India are working on digitization of books and manuscripts. The mega scanning center we have, has around fifty scanners, each one of them capable lof scanning approximately 5000 pages in 8 hours. As on September 2005, close to 100 thousand books with 25 million pages were digitized and made available online by DLI (http://dli.iiit.ac.in) as document images.

Building an effective access to these document images requires designing a mechanism for effective search and retrieval of textual data from document image collections. Document image indexing and retrieval were studied with limited scope in literature [2]. Success of these procedures mainly depends on the performance of the OCRs, which convert the document images into text. Much of the data in DLI are in Indian languages. Searching in these document image collections based on content, is not presently possible. This is because OCRs are not yet able to successfully recognize printed texts in Indian languages. We need an alternate approach to access the content of these documents [3]. A promising alternate direction is to search for relevant documents in image space without any explicit recognition. We have been motivated by the successful attempts on

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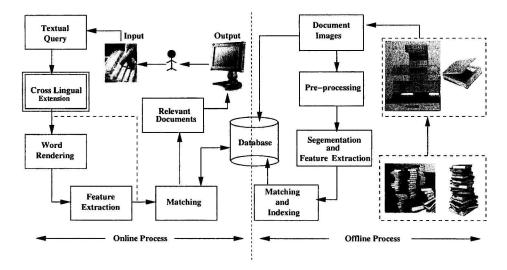


Fig. 1. Conceptual Diagram of the Searching Procedure from Multilingual Document Image Database. A Web Demo for the Above Procedure is Available Online at http://cvit.iiit.ac.in/wordsearch.html.

locating a specific word in handwritten English documents by matching image features for historical documents [4,5].

We have already addressed algorithmic challenges for effective search in document images [6]. This paper describes the issues associated with the implementation of a scalable system for Indian language document images. A conceptual block diagram of our prototype system is shown in Figure 1. Our system accepts textual query from users. The textual query is first converted to an image by rendering, features are extracted from these images and then search is carried out for retrieval of relevant documents. Results of the search are pages from document image collections containing queried word sorted based on their relevance to the query.

# 2 Challenges in Design and Implementation of the System

Search and retrieval from large collection of document images is a challenging task, specially when there is no textual representation available. To design and implement a successful search engine in image domain, we need to address the following issues.

Search in images: Search in image space requires appropriate representational schemes and similarity measures. Success of content-based image retrieval (CBIR) schemes were limited by the diversity of the image collections. Digital libraries primarily archive text images, but of varying quality, script, style, size and font.

We need to come up with appropriate features and matching schemes, which can represent the content (text), while invariant to the popular variations.

Degradations of documents: Documents in digital libraries are extremely poor in quality. Popular artifacts in printed document images include (a) Excessive dusty noise, (b) Large ink-blobs joining disjoint characters or components, (c) Vertical cuts due to folding of the paper, (d) Cuts of arbitrary direction due to paper quality or foreign material, (e) Degradation of printed text due to the poor quality of paper and ink, (f) Floating ink from facing pages etc. We need to design an appropriate representational scheme and matching algorithm to accommodate the effect of degradation.

Need for cross-lingual retrieval: Document images in digital libraries are from diverse languages. Relevant documents that users need may be available in different languages. Most educated Indians can read more than one language. Hence, we need to design a mechanism that allows users to retrieve all documents related to their queries in any of the Indian languages.

Computational speed: Searching from large collection of document images pass through many steps: image processing, feature extraction, matching and retrieval of relevant documents. Each of these steps could be computationally expensive. In a typical book, there could be around 90,000 words and processing all of them online is practically impossible. We do all computationally expensive operations during the offline indexing (Section 4) and do minimal operations during online retrieval (Section 5).

Indian languages: Indian languages pose many additional challenges [7]. Some of these are: (i) lack of standard representation for the fonts and encoding, (ii) lack of support from operating system, browsers and keyboard, and (iii) lack of language processing routines. These issues add to the complexity of the design and implementation of a document image retrieval system.

## 3 Representation and Matching of Word Images

Word images extracted from documents in digital libraries are of varying quality, script, font, size and style. An effective representation of the word images will have to take care of these artifacts for successful searching and retrieval. We combined two categories of features to address these effects: word profiles and structural features. Explicit definitions of these features may be seen in [6].

Word Profiles: Profiles of the word provide a coarse way of representing a word image for matching. Profiles like upper word, lower word, projection and transition profiles are used here for word representation. Upper and lower word profiles capture part of the outlining shape of a word, while projection and transition profiles capture the distribution of ink along one of the two dimensions in a word image.