#### **Scanned Documents**

LBSC 796/INFM 718R Douglas W. Oard Week 8, March 30, 2011

国宝鎌倉大佛因由

精多野局が発起し、僧浄光が勧進(資金集め)して造った。零知な 民間の全銭を集積して成ったもので、国家や王侯が資金を出して 造って安置した。原型作者は不明であるが、街工として大野五郎右王門や 集め、建長四年(ニュニ)に至って現在の青銅の像を鋳造し、大仏殿を 六年間で完成したが、宝治元年(三四七)大風で倒れたので、再び資金を 作ったものではない。 丹治久友の名が伝へられる、大仏殿は建武元年(こ三三四)と應安二年(こ三六九) 補強し、 流失以来は復興せず、露像として知られたいろた。大正十二年(これここ)の大震災 とに大風に倒れ、その都度復興したが、明應七年(二四九八)の海潮に 強し仏像を台座に固定せしめる耐震構造の修復がなされた。昭和三三三六年二年六年二九六〇六 には台座が崩れ 仏像は前に傾いたが倒れなかった。大正十四年(うう王)台座を補 と佛体が離れる免疫構造が施された。この強化プラスチックの利用 の修理では、前傾してる頭部を支える頸部の力を、強化プラスチックで この大佛像は阿弥陀仏である。源頼朝の侍女であったといわれる 大正修理でなされた耐震構造を改め、大地震の際は、台座 初めは木造で暦仁元年(ニミハ)に着工し

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と台座の免震構造は、日本の文化財としては最初のものである。

、(三万二千六百七十貫)



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#### Elephant joke

From Wikipedia, the free encyclopedia

An elephant joke is a joke or riddle that involves an elephant. It usually relies on the great size and/or weight of the animal for its humor. Although elephant jokes are typically children's humor, a more sophisticated form appeals more to adults,

Elephant jokes are frequently nonsensical, and may in some cases be anti-jokes:

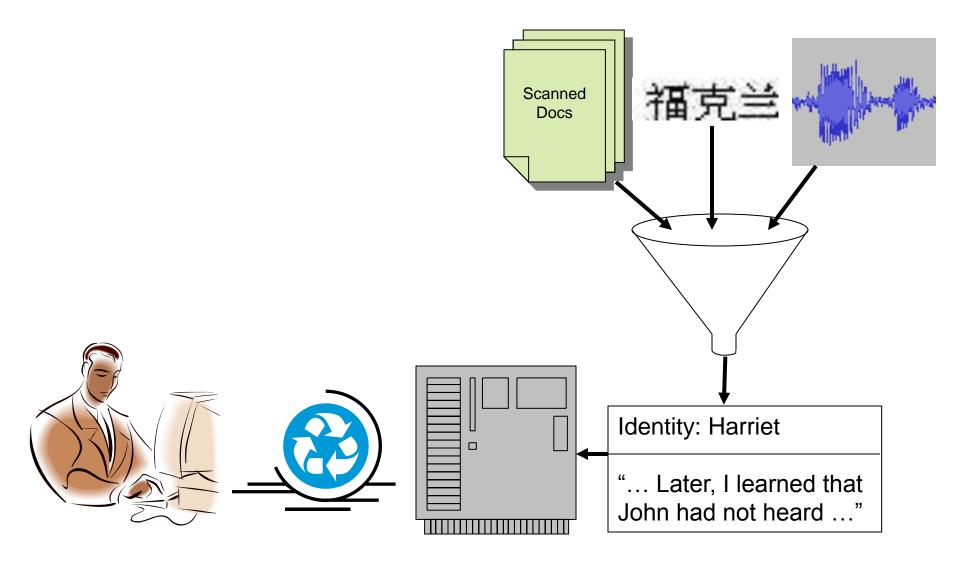
- Q: How do you shoot a blue elephant?
- A: With a blue elephant gun, of course.
- Q: How do you shoot a yellow elephant?
- A: Have you ever seen a yellow elephant?
- Q: How do you shoot a red elephant?

**A**: Hold his trunk shut until he turns blue, and then shoot him with the blue elephant gun.

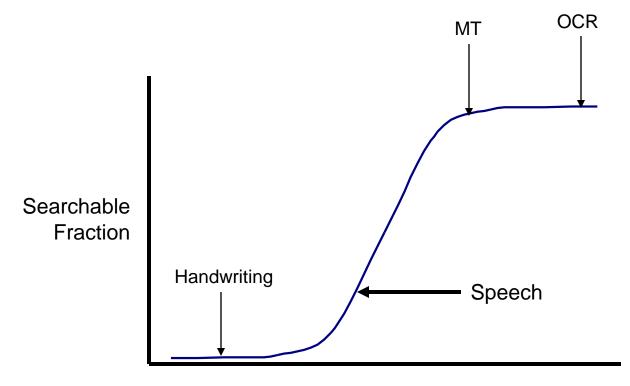
#### Other standard variants



#### **Expanding the Search Space**



#### High Payoff Investments



Transducer Capabilities accurately recognized words words produced

#### **Some Applications**

Case management for litigation

 Duplicate detection for declassification productivity and anti-tiling

 Knowledge management from everything I have ever xeroxed or faxed

#### Indexing and Retrieving Images of Documents

#### LBSC 796/INFM 718R

David Doermann, UMIACS



# Agenda

- Questions
- Definitions Document, Image, Retrieval
- Document Image Analysis
  - Page decomposition
  - Optical character recognition
- Traditional Indexing with Conversion
  - Confusion matrix
  - Shape codes
- Doing things Without Conversion
  - Duplicate Detection, Classification, Summarization, Abstracting
  - Keyword spotting, etc



#### Goals of this Class

- Expand your definition of what is a "DOCUMENT"
- To get an appreciation of the issues in document image analysis and their effects on indexing
- To look at different ways of solving the same problems with different media
- Your job: compare/contrast with other media



#### Quiz

• What is a document?



# Document

- **Basic Medium for Recording Information** ullet
- Transient
  - Space
  - Time
- Multiple Forms
  - Hardcopy (paper, stone, ...) / Electronic (CDROM, Internet, ...)
  - Written/Auditory/Visual (symbolic, scenic)
- Access Requirements
  - Search
  - Browse



"Read"









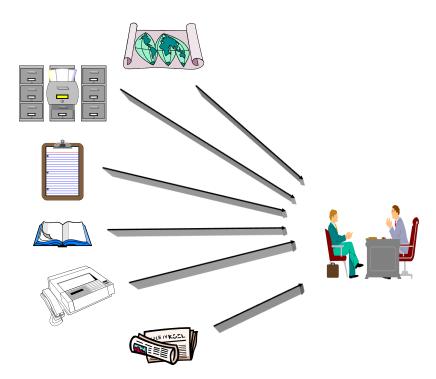








# Sources of Document Images



- The Web
  - Some PDF files come from scanned documents
  - Arabic news stories are often GIF images
- Digital copiers
  - Produce "corporate memory" as a byproduct
- Digitization projects
  - Provide improved access to hardcopy documents



#### Some Definitions

- Modality
  - A means of expression
- Linguistic modalities
  - Electronic text, printed, handwritten, spoken, signed
- Nonlinguistic modalities
  - Music, drawings, paintings, photographs, video
- Media
  - The means by which the expression reaches you
    - Internet, videotape, paper, canvas, ...



#### Quiz

- · What is a document?
- What is an image?





#### Images

- Pixel representation of intensity map
- No explicit "content", only relations
- Image analysis
  - Attempts to mimic human visual behavior
  - Draw conclusions, hypothesize and verify

#### Image databases

Use primitive image analysis to represent content Transform semantic queries into "image features" color, shape, texture ... spatial relations



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### **Document Images**

- A collection of dots called "pixels"
  - Arranged in a grid and called a "bitmap"
- Pixels often binary-valued (black, white)
  - But greyscale or color is sometimes needed
- 300 dots per inch (dpi) gives the best results
  - But images are quite large (1 MB per page)
  - Faxes are normally 72 dpi
- Usually stored in TIFF or PDF format

Yet we want to be able to process them like text files!



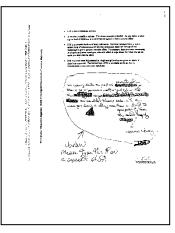


#### Document Image "Database"

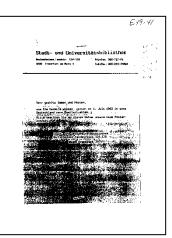
- Collection of scanned images
- Need to be available for indexing and retrieval, abstracting, routing, editing, dissemination, interpretation







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#### Other "Documents"











**Parliamentary Assembly** Assemblée parlementaire



COUNCIL OF EUROPE CONSEIL DE L'EUROPE

Honey, I think we are beyond the point of me being just your "boyfriend." It's about time you started calling me what I really am.

And that is ...? Your manfriend.



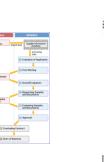






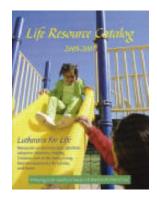


Splanetearth **Earth Sciences for Society** 



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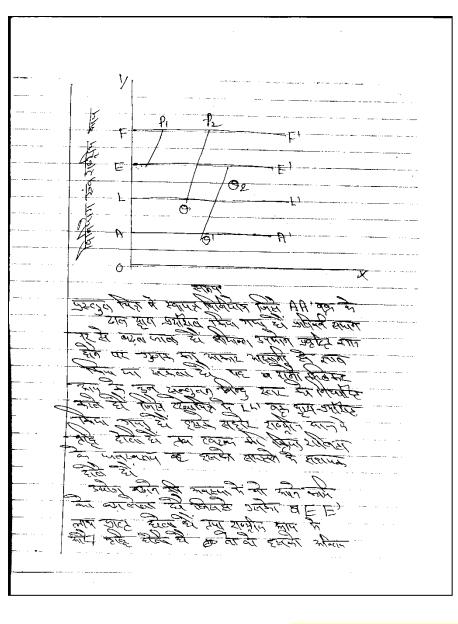


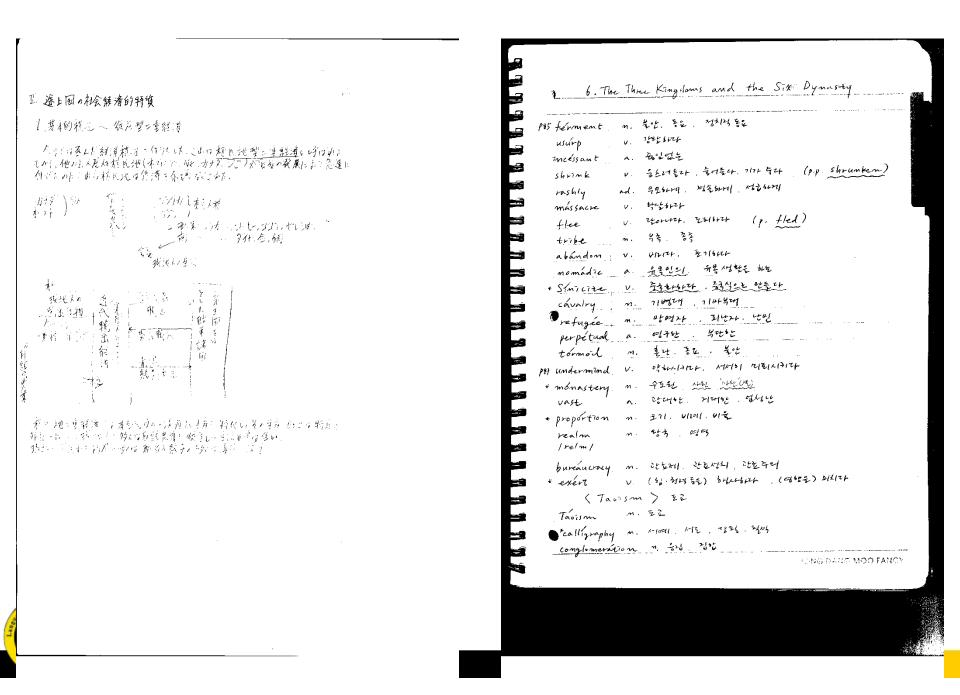






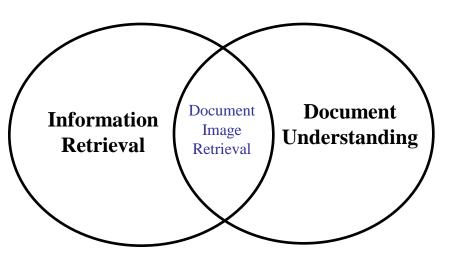
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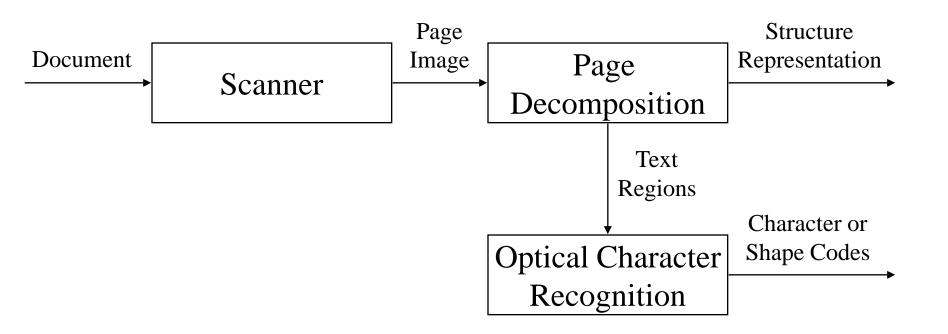
### Quiz

- What is a document?
- What is an image?
- How can we *index and retrieve* document images?





#### Indexing Page Images

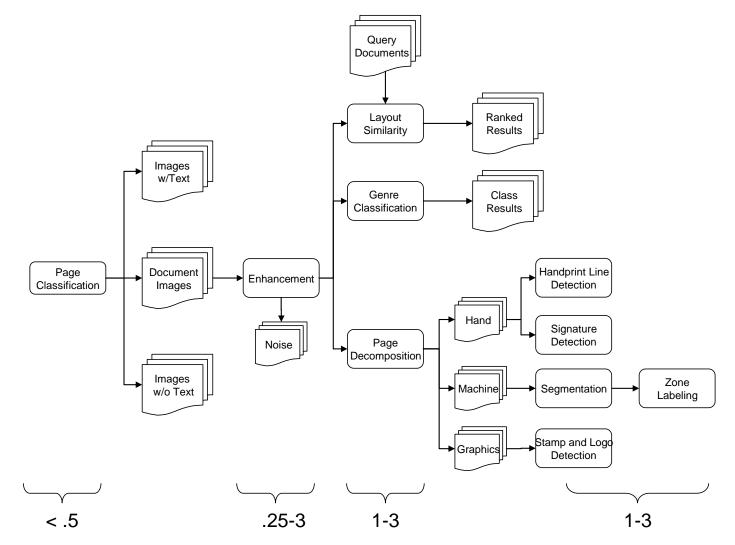




#### **Document Image Analysis**

- General Flow:
  - Obtain Image Digitize
  - Preprocessing
  - Feature Extraction
  - Classification
- General Tasks
  - Logical and Physical Page Structure Analysis
  - Zone Classification
  - Language ID
  - Zone Specific Processing
    - Recognition
    - Vectorization





Target Processing Speed in Seconds



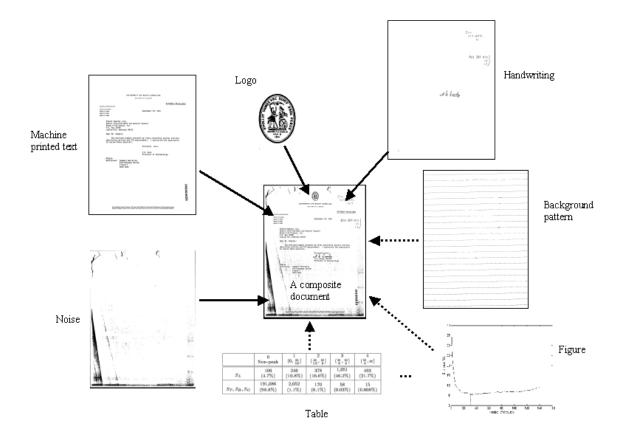
# Quiz

- What is a document?
- What is an image?
- How can we index and retrieve document images?
- Why is document analysis difficult?



#### Page Layer Segmentation

- Document image generation model
  - A document consists many layers, such as handwriting, machine printed text, background patterns, tables, figures, noise, etc.





### Page Analysis

- Skew correction
  - Based on finding the primary orientation of lines
- Image and text region detection
  - Based on texture and dominant orientation
- Structural classification
  - Infer logical structure from physical layout
- Text region classification
  - Title, author, letterhead, signature block, etc.



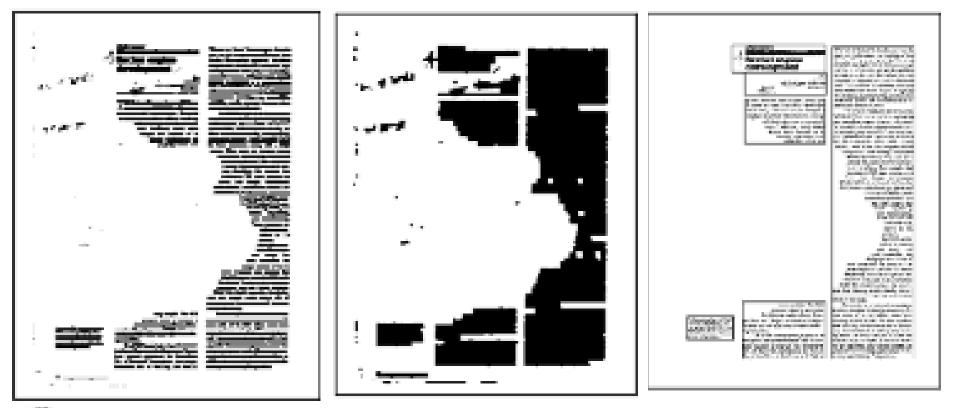
#### **Image Detection**



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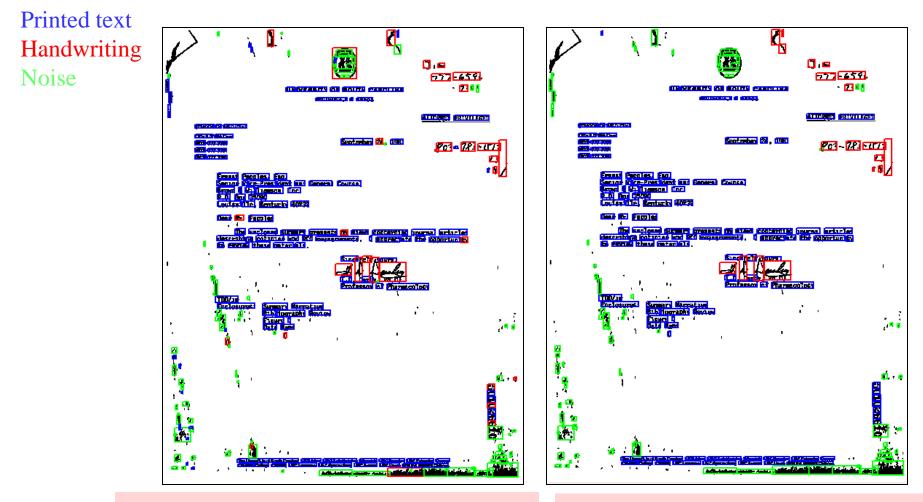
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#### **Text Region Detection**





#### More Complex Example

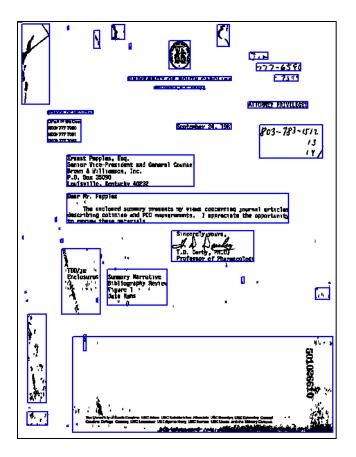


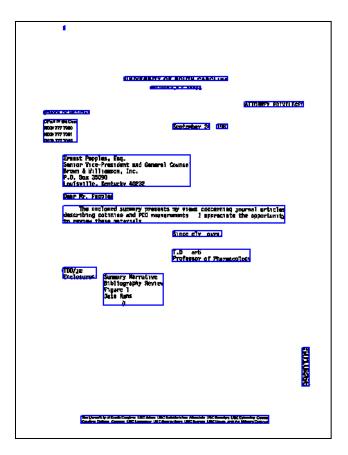


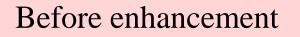
Before MRF-based postprocessing

After MRF-based postprocessing

#### **Application to Page Segmentation**







#### After enhancement



### Language Identification

- Language-independent skew detection
  - Accommodate horizontal and vertical writing
- Script class recognition
  - Asian scripts have blocky characters
  - Connected scripts can't be segmented easily
- Language identification
  - Shape statistics work well for western languages
  - Competing classifiers work for Asian languages

What about handwriting?



### **Optical Character Recognition**

- Pattern-matching approach
  - Standard approach in commercial systems
  - Segment individual characters
  - Recognize using a neural network classifier
- Hidden Markov model approach
  - Experimental approach developed at BBN
  - Segment into sub-character slices
  - Limited lookahead to find best character choice
  - Useful for connected scripts (e.g., Arabic)



# Quiz

- What is a document?
- · What is an image?
- How can we index and retrieve document images?
- Why is document analysis difficult?
- Is the (Doc Image IR) problem solved? Why or Why not?



#### **OCR** Accuracy Problems

- Character segmentation errors
  - In English, segmentation often changes "m" to "rn"
- Character confusion
  - Characters with similar shapes often confounded
- OCR on copies is much worse than on originals
  - Pixel bloom, character splitting, binding bend
- Uncommon fonts can cause problems
  - If not used to train a neural network



# Improving OCR Accuracy

- Image preprocessing
  - Mathematical morphology for bloom and splitting
  - Particularly important for degraded images
- "Voting" between several OCR engines helps
   Individual systems depend on specific training data
- Linguistic analysis can correct some errors
  - Use confusion statistics, word lists, syntax, ...
  - But more harmful errors might be introduced



## **OCR** Speed

- Neural networks take about 10 seconds a page
   Hidden Markov models are slower
- Voting can improve accuracy
  - But at a substantial speed penalty
- Easy to speed things up with several machines
  - For example, by batch processing using desktop computers at night



# Problem: Logical Page Analysis (Reading Order)

- Can be hard to guess in some cases
  - Newspaper columns, figure captions, appendices, ...
- Sometimes there are explicit guides
  - "Continued on page 4" (but page 4 may be big!)
- Structural cues can help
  - Column 1 might continue to column 2
- Content analysis is also useful
  - Word co-occurrence statistics, syntax analysis



### **Processing Converted Text**

**Typical Document Image Indexing** 

- Convert hardcopy to an "electronic" document
  - OCR
  - Page Layout Analysis
  - Graphics Recognition
- Use structure to add metadata
- Manually supplement with keywords

Use traditional text indexing and retrieval techniques?



## Information Retrieval on OCR

- Requires robust ways of indexing
- Statistical methods with large documents work best
- Key Evaluations
  - Success for high quality OCR (Croft et al 1994, Taghva 1994)
  - Limited success for poor quality OCR (1996 TREC, UNLV)



### N-Grams

- Powerful, Inexpensive statistical method for characterizing populations
- Approach
  - Split up document into n-character pairs fails
  - Use traditional indexing representations to perform analysis
  - "DOCUMENT" -> DOC, OCU, CUM, UME, MEN, ENT
- Advantages
  - Statistically robust to small numbers of errors
  - Rapid indexing and retrieval
  - Works from 70%-85% character accuracy where traditional IR fails



## Matching with OCR Errors

- Above 80% character accuracy, use words
  - With linguistic correction
- Between 75% and 80%, use n-grams
  - With n somewhat shorter than usual
  - And perhaps with character confusion statistics
- Below 75%, use word-length shape codes



## Handwriting Recognition

- With stroke information, can be automated
  - Basis for input pads
- Simple things can be read without strokes
  - Postal addresses, filled-in forms
- Free text requires human interpretation
  - But repeated recognition is then possible



## Outline

- Processing Converted Text
- Manipulating Images of Text
  - Title Extraction
  - Named Entity Extraction
  - Keyword Spotting
  - Abstracting and Summarization
- Indexing based on Structure
- Graphics and Drawings
- Related Work and Applications



## **Processing Images of Text**

- Characteristics
  - Does not require expensive OCR/Conversion
  - Applicable to filtering applications
  - May be more robust to noise
- Possible Disadvantages
  - Application domain may be very limited
  - Processing time may be an issue if indexing is otherwise required



#### Proper Noun Detection (DeSilva and Hull, 1994)

- Problem: Filter proper nouns in images of text
  - People, Places, Things
- Advantages of the Image Domain:
  - Saves converting all of the text
  - Allows application of word recognition approaches
  - Limits post-processing to a subset of words
  - Able to use features which are not available in the text
- Approach:
  - Identify Word Features
    - Capitalization, location, length, and syntactic categories
  - Classify using rule-set
  - Achieve 75-85% accuracy without conversion



# **Keyword Spotting**

Techniques:

- Work Shape/HMM (Chen et al, 1995)
- Word Image Matching (Trenkle and Vogt, 1993; Hull et al)
- Character Stroke Features (Decurtins and Chen, 1995)
- Shape Coding (Tanaka and Torii; Spitz 1995; Kia, 1996)

Applications:

- Filing System (Spitz SPAM, 1996)
- Numerous IR
- Processing handwritten documents

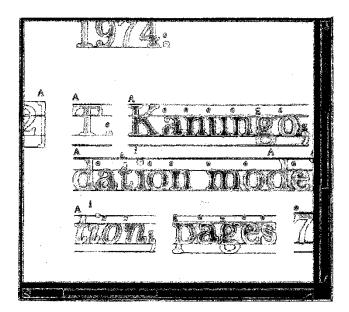
Formal Evaluation :





# Shape Coding

- Approach
  - Use of Generic Character Descriptors
  - Make Use of Power of Language to resolve ambiguity
  - Map Character based on Shape features including ascenders, descenders, punctuation and character with holes





### Shape Codes

- Group all characters that have similar shapes
  - {A, B, C, D, E, F, G, H, I, J, K, L, M, N, O, P, Q, R, S, T, U, V, W, X, Y, Z, 2, 3, 4, 5, 6, 7, 8, 9, 0}
  - {a, c, e, n, o, r, s, u, v, x, z}
  - $\{b, d, h, k, \}$
  - $\{f, t\}$
  - $\{g, p, q, y\}$
  - {i, j, l, 1}
  - {m, w}



### Why Use Shape Codes?

- Can recognize shapes faster than characters
  - Seconds per page, and very accurate
- Preserves recall, but with lower precision
  - Useful as a first pass in any system
- Easily extracted from JPEG-2 images
  - Because JPEG-2 uses object-based compression



### **Evaluation**

- The usual approach: Model-based evaluation
   Apply confusion statistics to an existing collection
- A bit better: Print-scan evaluation
  - Scanning is slow, but availability is no problem
- Best: Scan-only evaluation
  - Few existing IR collections have printed materials



## Summary

- Many applications benefit from image based indexing
  - Less discriminatory features
  - Features may therefore be easier to compute
  - More robust to noise
  - Often computationally more efficient
- Many classical IR techniques have application for DIR
- Structure as well as content are important for indexing
- Preservation of structure is essential for in-depth understanding



### Closing thoughts....

- What else is useful?
  - Document Metadata? Logos? Signatures?
- Where is research heading?
  - Cameras to capture Documents?
- What massive collections are out there?
  - Tobacco Litigation Documents
    - 49 million page images
  - Google Books
  - Other Digital Libraries



### **Additional Reading**

- A. Balasubramanian, et al. Retrieval from Document Image Collections, *Document Analysis Systems VII*, pages 1-12, 2006.
- D. Doermann. The Indexing and Retrieval of Document Images: A Survey. *Computer Vision and Image Understanding*, 70(3), pages 287-298, 1998.



### **Some Applications**

Legacy Tobacco Documents Library

- http://legacy.library.ucsf.edu/

Google Books

<u>http://books.google.com/</u>

George Washington's Papers

- http://ciir.cs.umass.edu/irdemo/hw-demo/