

# **Models for Retrieval and Browsing**

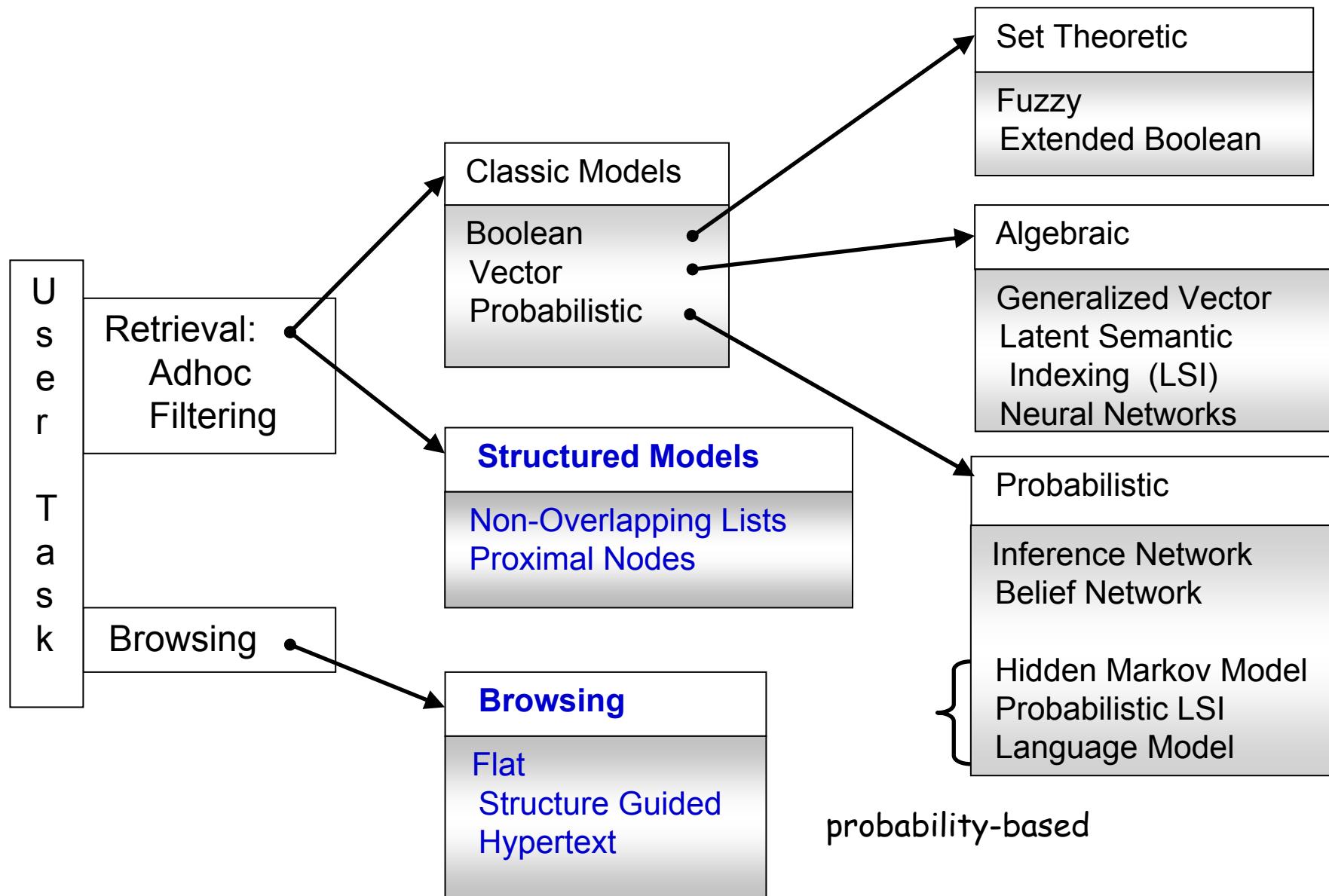
## **- Structural Models and Browsing**

Berlin Chen 2004

Reference:

1. *Modern Information Retrieval*, chapter 2

# Taxonomy of Classic IR Models



# Structured Text Retrieval Models

- Structured Text Retrieval Models
  - Retrieval models which combine information on **text content** with information on the **document structure**
  - That is, the document structure is one additional piece of information which can be taken advantage

- E.g.: Consider the following information need

- Retrieve all docs which contain a page in which the string '*atomic holocaust*' appears in italic in the text surrounding a Figure whose label contains the word '*earth*'

Too many doc retrieved !

- ['atomic holocaust' and 'earth'] classical IR model
- Or a structural (more complex) query instead

data retrieval? same-page( near( 'atomic holocaust', Figure( label( 'earth' ))))

# Structured Text Retrieval Models (cont.)

- Drawbacks
  - Difficult to specify the structural query
    - An advanced user interface is needed
  - Structured text retrieval models include **no ranking** (open research problem!)
- Tradeoffs
  - The more expressive the model, the less efficient is its query evaluation strategy
- Two structured text retrieval models are introduced here
  - Non-Overlapping Lists
  - Proximal Nodes

# Basic Definitions

- Match point: the position in the text of a sequence of words that match the query
  - Query: “atomic holocaust in Hiroshima”
  - Doc  $d_j$ : contains 3 lines with this string
  - Then, doc  $d_j$  contains 3 match points
- Region: a contiguous portion of the text
- Node: a structural component of the text such as a chapter, a section, a subsection, etc.
  - That is, a region with predefined topological properties

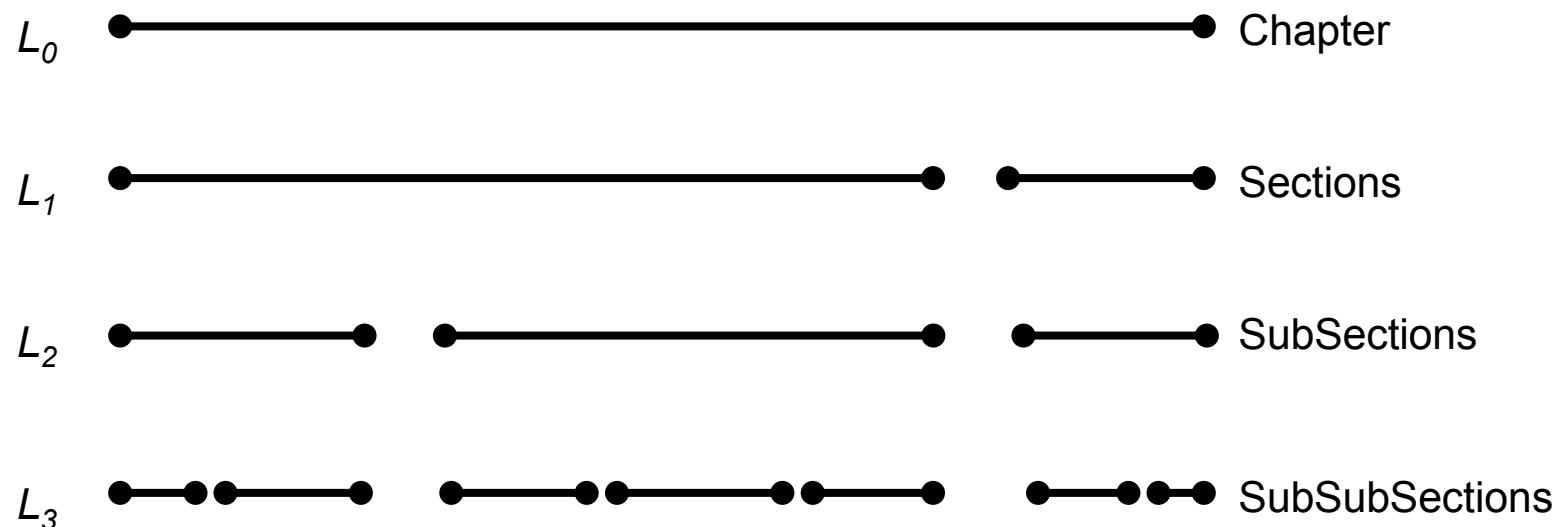
# Non-Overlapping Lists

Burkowski, 1992

- **Idea:** divide the whole text of a document in non-overlapping text regions which are collected in a list

- Multiple list generated
  - A list for chapters
  - A list for sections
  - A list for subsections

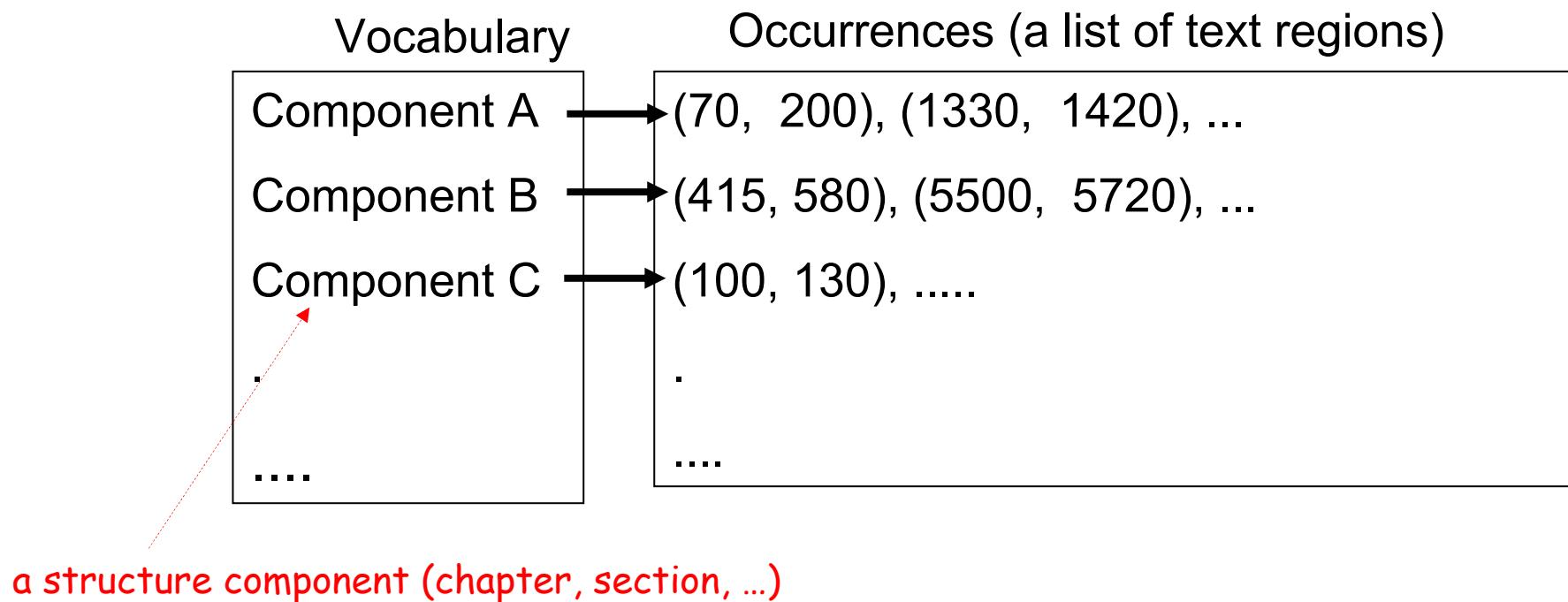
1. Kept as separate and distinct data structures
2. Text regions from distinct list might overlap!



# Non-Overlapping Lists (cont.)

- Implementation:
  - A single **inverted file** build, in which each structural component stands as an entry in the index (see next slide)
  - Each entry has a list of text regions as a list occurrences
  - Such a list could be easily merged with the traditional inverted file
- Example types of queries
  - Select a region which contains a given word (and doesn't contain any regions)      **innermost structural component**
  - Select a region A which does not contain any other region B of distinct lists
  - Select a region not contained within any other region  
                                        **outermost structural component**

# Non-Overlapping Lists (cont.)



A inverted-file structure for non-overlapping lists

# Inverted Files

- **Definition**
  - An inverted file is a word-oriented mechanism for indexing a text collection in order to speed up the searching task
- Structure of inverted file
  - Vocabulary: is the set of all distinct words in the text
  - Occurrences: lists containing all information necessary for each word of the vocabulary (text position, frequency, documents where the word appears, etc.)

# Inverted Files (cont.)

- Text:

1    6       12    16 18       25    29       36    40       45       54    58       66    70

That house has a garden. The garden has many flowers. The flowers are beautiful

- Inverted file

Vocabulary	Occurrences
beautiful	70
flowers	45, 58
garden	18, 29
House	6
....	....

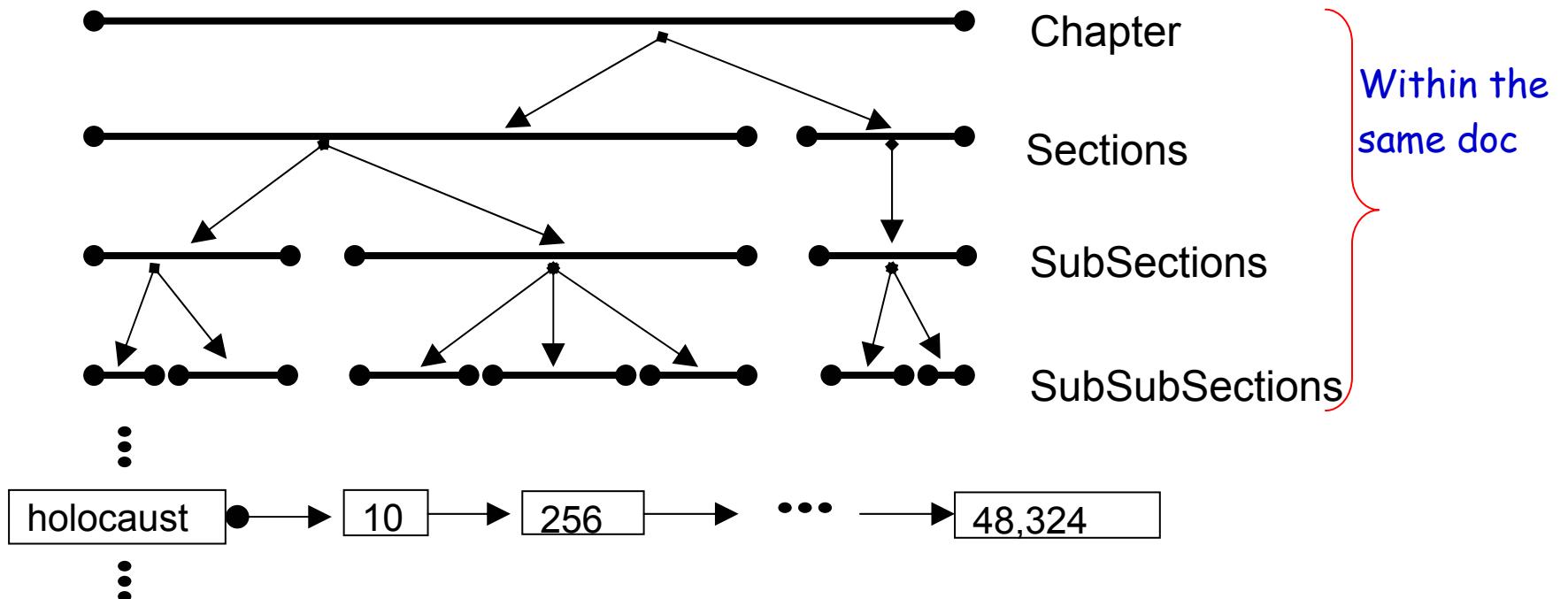
Different granularities for Occurrences  
- Text position  
- Doc position

# Proximal Nodes

Navarro and Baeza-Yates, 1997

- **Idea**
  - Define a **strict hierarchical** index over the text. This enriches the previous model that used flat lists (*see next slide*)
  - Multiple index hierarchies might be defined
  - Two distinct index hierarchies might refer to text regions that overlap
- Each indexing structure is a strict hierarchy composed of
  - *Chapters, sections, subsections, paragraphs or lines*
  - Each of these components is called a **node**
    - Each node is associated with a text region

# Proximal Nodes (cont.)



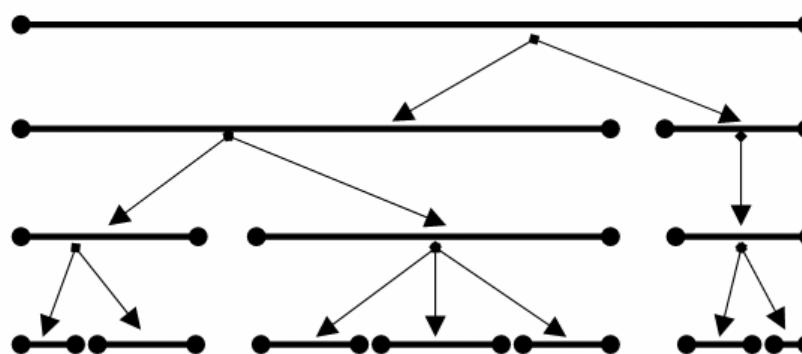
- **Features**
  - One node might be contained within another node
  - But, **two nodes of a same hierarchy cannot overlap**
  - **The inverted list for words complements the hierarchical index**

# Proximal Nodes (cont.)

- Query Language in regular expressions
  - Search for strings
  - References to structural components by name
  - Combination of these
- An example query: `[(*section) with ("holocaust")]`
  - Search for the sections, the subsections, and the subsubsections that contain the word “holocaust”

# Proximal Nodes (cont.)

- Simple query processing for previous example
  - Traverse the inverted list for “holocaust” and **determine all match points** (all occurrence entries)
  - Use the match points to search in the hierarchical index for the structural components
    - Look for sections, subsections, and subsections containing that occurrence of the term



# Proximal Nodes (cont.)

- Sophisticated query processing
  - Get the **first entry in the inverted list** for “holocaust”
  - Use this match point to search in the hierarchical index for the structural components until **innermost matching structural component** ( the last and smallest one) found
    - At the bottom of the hierarchy
  - Check if innermost matching component includes the second entry in the inverted list for “holocaust”
  - If it does, check the two, the third entries, and so on. If not, traverse up to higher nodes then traverse down ....
  - This allows matching efficiently the nearby (or proximal) nodes

# Proximal Nodes (cont.)

- **Conclusions**

- The model allows formulating queries that are more sophisticated than those allowed by non-overlapping lists
- To speed up query processing, nearby nodes are inspected
- Types of queries that can be asked are somewhat limited (all nodes in the answer must **come from a same index hierarchy!**)
- The model is a compromise between efficiency and expressiveness

[(\*section) with (“holocaust”)]

# Models for Browsing

- **Premise:** the user is usually interested in browsing the documents instead of searching (specifying the queries)
  - User have goals to pursue in both cases
  - However, the goal of a searching task is clearer in the mind of the user than the goal of a browsing task
- Three types of browsing discussed here
  - Flat Browsing
  - Structure Guided Browsing
  - The Hypertext Model

# Flat Browsing

- Documents represented as dots in
  - A two-dimensional plane
  - A one-dimensional plane (list)
- **Features**
  - Glance here and there looking for information within documents visited
    - Correlations among neighbor documents
  - Add keywords of interest into original query
    - Relevance feedback or query expansion
  - Also, explore a single document in a flat manner (like a web page)
- **Drawbacks**
  - No indication about the context where the user is

# Structure Guided Browsing

- Documents organized in a structure as a directory
  - Directories are hierarchies of classes which group documents covering related topics
  - E.g.: “Yahoo!” provides hierarchical directory
- Same idea applied to a single document
  - Chapter level, section level, etc.
  - The last level is the text itself (flat!)
  - A good UI needed for keeping track of the context
  - E.g.: the adobe acrobat pdf files

# Structure Guided Browsing (cont.)

The screenshot shows the Adobe Acrobat Standard interface with a PDF document titled "Pattern Recognition in Speech and Language Processing.pdf". The left panel displays a hierarchical table of contents and file list. The main panel shows the "Contents" section of the PDF, which includes two main chapters: "Minimum Classification Error (MCE) Approach in Pattern Recognition" and "Minimum Bayes-Risk Methods in Automatic Speech Recognition".

**Contents**

1 Minimum Classification Error (MCE) Approach in Pattern Recognition  
Wu Chou Avaya Labs Research, Avaya Inc., USA

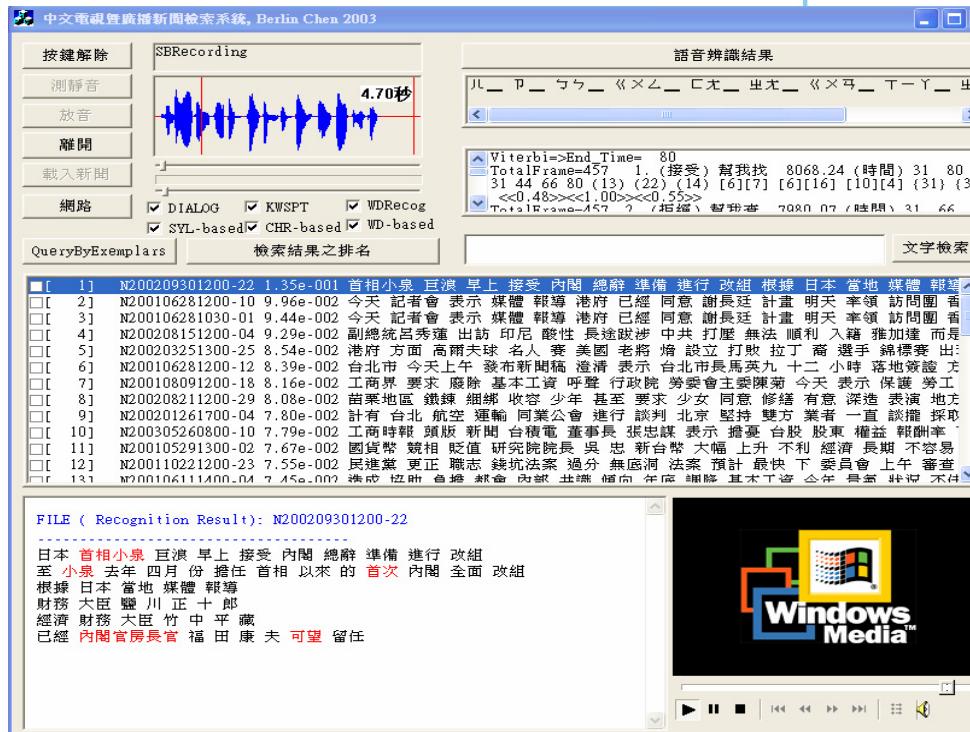
- 1.1 Introduction
- 1.2 Optimal Classifier from Bayes Decision Theory
- 1.3 Discriminant Function Approach to Classifier Design
- 1.4 Speech Recognition and Hidden Markov Modeling
  - 1.4.1 Hidden Markov Modeling of Speech
- 1.5 MCE Classifier Design Using Discriminant Functions
  - 1.5.1 MCE Classifier Design Strategy
  - 1.5.2 Optimization Methods
  - 1.5.3 Other Optimization Methods
  - 1.5.4 HMM as a Discriminant Function
  - 1.5.5 Relation between MCE and MMI
  - 1.5.6 Discussions and Comments
- 1.6 Embedded String Model Based MCE Training
  - 1.6.1 String Model Based MCE Approach
  - 1.6.2 Combined String Model Based MCE Approach
  - 1.6.3 Discriminative Feature Extraction
- 1.7 Verification and Identification
  - 1.7.1 Speaker Verification and Identification
  - 1.7.2 Utterance Verification
- 1.8 Summary

2 Minimum Bayes-Risk Methods in Automatic Speech Recognition  
Vaibhava Goel\* and William Byrne† \*IBM; †Johns Hopkins University

- 2.1 Minimum Bayes-Risk Classification Framework
  - 2.1.1 Likelihood Ratio Based Hypothesis Testing
  - 2.1.2 Maximum A-Posteriori Probability Classification
  - 2.1.3 Previous Studies of Application Sensitive ASR
- 2.2 Practical MBR Procedures for ASR
  - 2.2.1 Summation over Hidden State Sequences
  - 2.2.2 MBR Recognition with N-best Lists
  - 2.2.3 MBR Recognition with Lattices
- 2.3 Segmental MBR Procedures
  - 2.3.1 Segmental Voting
  - 2.3.2 ROVER

# Structure Guided Browsing (cont.)

1



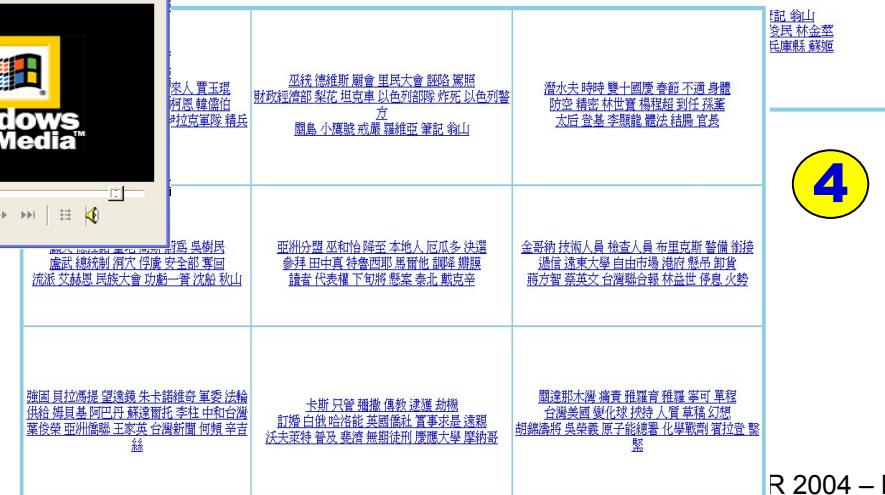
2



3



4



Co-research with Prof. Lin-shan Lee  
Implemented by Tehsuan Li, MingHan Li

# Structure Guided Browsing (cont.)

- Additional facilities provided when searching
  - A history map identifies classes recently visited
  - Display occurrences (of terms) by showing the structures in a global context, in addition to the text positions

# The Hypertext Model

- **Premise:** communication between writer and user
  - A sequenced organizational structure lies underneath most written text
  - The reader should not expect to fully understand the message conveyed by the writer by randomly reading pieces of text here and there

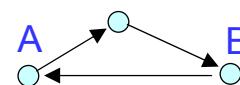
# The Hypertext Model (cont.)

- Sometimes, we even can't capture the information through sequential reading of the whole text
  - E.g.: a book about “the history of the wars” is organized chronologically, but we only interested in “the regional wars in Europe”
    - Wars fought by each European country
    - War fought in Europe in chronological order

Rewrite the book?  
Or defining a new structure?

# The Hypertext Model (cont.)

- **Hypertext**
  - A high level **interactive navigational structure** allowing users to browse text non-sequentially
  - Consist of **nodes** (text regions) correlated by directed links in a graph structure
    - A **node** could be a chapter in a book, a section in an article, or a web page
    - Links are attached to specific strings inside the nodes
- Hypertexts provide the basis for HTML and HTTP
  - HTML: hypertext markup language
  - HTTP: hypertext transfer protocol



# The Hypertext Model (cont.)

- **Features**
  - The process of navigating the hypertext is like a traversal of a directed graph
- **Drawbacks**
  - **Lost in hyperspace**: the user will lose track of the organizational structure of the hypertext when it is large
    - A hypertext map shows where the user is at all times (graphical user interface design)
  - But, the user is restricted to the intended flow of information previously convinced by the hypertext designer
    - Should take into account the needs of potential users

Analyzing before implementation

Guiding tools needed (hypertext map)

# Trends and Research Issues

- Three main types of IR related products and systems
  - Library systems
  - Specialized retrieval systems
  - The Web
- **Library systems**
  - Much interest in cognitive and behavioral issues
    - Oriented particularly at a better understanding of which criteria the users adopt to judge relevance (most systems here adopt Boolean model)
      - Ranking strategies
      - User interface design
  - How to implement

# Trends and Research Issues (cont.)

- **Specialized retrieval systems**
  - E.g. LEXIS-NEXIS: a system to access a very large collection of legal and business documents
  - How to retrieve almost all relevant documents without retrieving a large number of unrelated documents
    - Sophisticated ranking algorithms are desirable

# Trends and Research Issues (cont.)

- **The Web**

A pool of partially interconnected webs

- User does not know what he wants or has great difficulty in properly formulating his request
- Study how the paradigm adopted for the user interface affects the ranking
  - Data model
  - Navigational plan
  - UI
  - Rules
- The indexes maintained by various Web search engine are almost disjoint
  - The intersection corresponds to less than 2% of the total number of page indexed
- **Meta-search**
  - Search engines which work by fusing the ranking generated by other search engines