Textual and Visual Information Retrieval using Query Refinement and Pattern Analysis

Textual and Visual Information Retrieval using Query Refinement and Pattern Analysis



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This book is dedicated to my guide, who is the co-author of the book, my parents and my family. Their encouragement and understanding helped me to complete this work. I thank my husband and children, Vinu and Shamitha, for their love and support to bring this book as a reality.

Foreword

I am extremely delighted to write the foreword for *Textual and Visual Information Retrieval using Query Refinement and Pattern Analysis*. The authors, Dr. S. G. Shaila and Dr. A. Vadivel, have disseminated their knowledge on information retrieval through this book. The content of the book is a very good educational and valuable resource for researchers in the domain of information retrieval.

The book includes various chapters on deep Web crawler, event pattern retrieval, Thesaurus generation and query expansion, CBIR applications and indexing and encoding to cover the whole concept of information retrieval. Each chapter contains the theoretical information with experimental results and is intended for information retrieval researchers. The layout of each chapter includes a table of contents, introduction, material content and experimental results with analysis and interpretation.

This edition of the book reflects new guidelines that have evolved in information retrieval in terms of text- and content-based information retrieval schemes. The indexing and encoding mechanism of the low-level feature vector is also presented with results and analysis.

It is my hope and expectation that this book will provide an effective learning experience and referenced resources for all information retrieval researchers, leading to advanced research.

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Preface

Multimedia information retrieval from the distributed environment is an important research problem. It requires an architecture specification for handling various issues such as techniques to crawl information from WWW, user query prediction and refinement mechanisms, text and image feature extraction, indexing and encoding, similarity measure. In this book, research issues related to all the above-mentioned problems are discussed and suitable techniques are presented in various chapters.

Both the text and images are presented in web documents. In a comprehensive retrieval mechanism, text-based information retrieval (TBIR) plays an important role. In Chap. 1, the text-based retrieval is used for retrieving relevant documents from the Internet by using a suitable crawler with the capability to crawl deep and surface web. The functional dependency of core and allied fields in HTML FORM is identified for generating rules using SVM classifier. The presented crawler fetches a large number of documents while using the values in most preferable class. This architecture has a higher coverage rate and reduces fetching time.

In recent times, information classification is very important for text-based information retrieval. In Chap. 2, the classification based on events is presented and also the event Corpus is discussed, which is important for many real-time applications. Event patterns are identified and extracted at the sentence level using term features. The terms that trigger events along with the sentences are extracted from web documents. The sentence structures are analysed using POS tags. A hierarchal sentence classification model is presented by considering specific term features of the sentence, and the rules are derived along with fuzzy rules to get the importance of all term features of the sentences. The performance of the method is evaluated for 'Crime' d 'Die' and found that the performance of this approach is encouraging.

In general, the retrieval system depends on the user query to retrieve the web documents. The user-defined queries should have sufficient relevant terms, since the retrieval set depends on the queries. The query refinement through query expansion mechanism plays an important role. In Chap. 3, the N-gram Thesaurus construction mechanism for query expansion is presented. The HTML TAGs in web documents are considered and their syntactical context is understood. Based on the significance

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of the TAGs in designing the web pages, suitable weight is assigned for TAGs. The term weight is calculated using corresponding TAG weight and frequency of the term. The terms along with the TAG information are updated into an inverted index. The N-grams are generated using the term and term weights in the document and updated as N-grams in the Thesaurus. During the query session, the term is expanded based on the content in the Thesaurus and suggested to the user. It is found that while the selected query is submitted to the retrieval system, the retrieval set consists of a large number of relevant documents.

In Chap. 4, the issues related to content-based image retrieval (CBIR) are presented. The chapter presents a histogram based on human colour visual perception by extracting the low-level features. For each pixel, the true colour and grey colour proportion are calculated using a suitable weight function. During histogram construction, the hue and intensity values are iteratively distributed to the neighbouring bins. The NBS distance is calculated between the reference bin and their adjacent bins. The NBS distance provides the overlapping proportion of the colour from the reference bin to its adjacent bins, and accordingly, the weight is updated. The distribution makes it possible to extract the background colour information effectively along with the foreground information. The low-level features of all the images in the database are extracted and stored in a feature database, and the relevant images are retrieved based on the rank. The Manhattan distance is used as a similarity measure, and the performance of the histogram is evaluated on Coral benchmark dataset.

In Chap. 5, the issues of indexing and encoding of low-level features and a similarity measure are presented. In CBIR system, the low-level features are stored along with the images and require a large number of storage space along with increased search and retrieval time. The search time increases linearly with the database size, which reduces the retrieval performance. The colour histograms of images are considered as low-level features. The bin values are analysed to understand their contribution representing image colour. The trivial bins are truncated and removed, and only important bins are considered to have histograms with lesser number of bins. The coding scheme used GR coding algorithm, and the quotient and remainder code parts are evaluated. Since there is variation between the number of bins in the query and database histogram, *BOSM* is used as a similarity measure. The performance of all the schemes is evaluated in an image retrieval system. The retrieval time, number of bits needed for histogram construction and precision of retrieval are evaluated using benchmark datasets, and the performance of the presented approach is encouraging.

Finally, as a whole, the book presents various important issues in information retrieval research filed and will be very much useful for the postgraduates and researchers working in information retrieval problems.

Bangalore, India Amaravati, India S. G. Shaila A. Vadivel

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Dr. S. G. Shaila Dr. A. Vadivel

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Abbreviations

ACE Automatic Content Extraction

ALNES Active Long Negative Emotional Sentence

ALNIES Active Long Negative Intensified Emotional Sentence

ALPES Active Long Positive Emotional Sentence

ALPIES Active Long Positive Intensified Emotional Sentence

ANFIS Artificial neuro-fuzzy inference system

ANN Artificial neural network

ASNES Active Short Negative Emotional Sentence

ASNIES Active Short Negative Intensified Emotional Sentence

ASPES Active Short Positive Emotional Sentence

ASPIES Active Short Positive Intensified Emotional Sentence

Bo1 Bose–Einstein statistics model

BoCo Bose–Einstein statistics co-occurrence model

BOSM Bin overlapped similarity measure CART Classification and regression tool CBIR Content-based image retrieval

CF Core field
Co Co-occurrence

CRF Conditional random fields
DCT Discrete cosine transform
DOM Document object model
EMD Earth mover's distance
ET Emotional triggered
FGC Form Graph Clustering
FPN Fuzzy Petri-Nets

FPN Fuzzy Petri-Nets
GR Golomb–Rice

HCPH Human colour perception histogram

HiWE Hidden Web Exposer

HQAOS High-Qualified Active Objective Sentence HQASS High-Qualified Active Subjective Sentence xx Abbreviations

HQPOS High-Qualified Passive Objective Sentence HQPSS High-Qualified Passive Subjective Sentence

HSV Hue Saturation Value

HTML Hyper-Text Markup Language

IBC Iraq Body Count
InPS Internal Property Set
IPS Input Property Set
IR Information retrieval

IRM Integrated Region Matching IWED Integrated Web Event Detector

KDB K-Dimensional B-tree KLD Kullback-Liebler divergence

KLDCo Kullback-Liebler divergence co-occurrence model

LDA Latent Dirichlet allocation

LP Least Preferable LVS Label value set

MAP Mean average precision

MCCM Colour-based co-occurrence matrix scheme

ME Mutually Exclusive

MEP Minimum Executable Pattern

MHCPH Modified human colour perception histogram

MP Most Preferable
MRR Mean reciprocal recall

MUC Message Understanding Conference NBS National Bureau of Standards

NIST National Institute of Standards and Technology

NLP Natural language processing

NQAOSNon-Qualified Active Objective SentenceNQASSNon-Qualified Active Subjective SentenceNQPOSNon-Qualified Passive Objective SentenceNQPSSNon-Qualified Passive Subjective Sentence

OPS Output Property Set

PHOTO Pyramid histogram of topics PIW Publicly Indexable Web

PLNES Passive Long Negative Emotional Sentence

PLNIES Passive Long Negative Intensified Emotional Sentence

PLPES Passive Long Positive Emotional Sentence

PLPIES Passive Long Positive Intensified Emotional Sentence

POS Part of speech
PO Product quantization

PSNES Passive Short Negative Emotional Sentence

PSNIES Passive Short Negative Intensified Emotional Sentence

PSPES Passive Short Positive Emotional Sentence

PSPIES Passive Short Positive Intensified Emotional Sentence

QA Question Answering

Abbreviations xxi

QAOS Qualified Active Objective Sentence
QASS Qualified Active Subjective Sentence
QPOS Qualified Passive Objective Sentence
QPSS Qualified Passive Subjective Sentence
RED Retrospective new Event Detection

RS Rule set

SCM Sentence classification model SOAP Simple object access protocol

SQAOS Semi-Qualified Active Objective Sentence SQASS Semi-Qualified Active Subjective Sentence SQPOS Semi-Qualified Passive Objective Sentence SQPSS Semi-Qualified Passive Subjective Sentence

SVM Support vector machine SWC Surface web crawlers SWR Semantic Web Retrieval

TBIR Text-based information retrieval
TDT Topic Detection and Tracking

TS Text Summarization
TSN Term semantic network
TTW TAG term weight

UMLS Unified Medical Language System

URL Uniform Resource Locator
ViDE Vision-based data extraction

WaC Web as Corpus

WSDL Web Services Description Language

WWW World Wide Web

XML Extensible Markup Language

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