



Review Paper

Under the section of Computer and Information Technology Sciences, *Image Retrieval- an Overview*

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Abstract

In the present scenario, there is a big amount of data occupy a large space on the Web with the acquaintance of the Internet and digital accessories. The number of image libraries are growing rapidly by inducing the need for the effective and efficient tools to query these large databases. Therefore, it become necessary for retrieval search engines to retrieve relevant documents and images from large database. This paper attempts to provide an extensive review over the image retrieval. Recent studies are included in this review article covering different aspects and researches in this area. Various techniques of image retrieval are discussed based on existing technologies and the demand from real-world applications. This article demonstrate a sight of most popular image retrieval techniques with their advantages and disadvantages.

Keywords: Retrieval, image, image database, query, annotation.

Introduction

An image represents the real object or scene. An immense amount of digital images, multimedia data files, and visual objects are being created and used every day due to availability of digital cameras and internet in different areas including remote sensing, fashion, engineering, science, history, advertising, crime prevention, medicine, architecture etc.¹⁻³. According to the recent study, there are more than 180 million images on the webdatabase⁴. A large amount of image data of about 3Tb [terabytes], and a staggering one million or more image data are produced every day⁵. In the present world scenario, the technology is growing so fast because of internet, so we need to manage large network database for the retrieval. Image retrieval systems incorporates browsing, searching and retrieving the images from a large collection of image databases⁶. Search engines are the most powerful resources for finding visual contents from the World Wide Web⁷. These search engines use the surrounding text near the image for describing the content of an image and rely on text retrieval techniques for searching particular image⁷. In an image retrieval process, user generates a query as images, text as a keyword (s), and image links, then the retrieval system search and retrieve the images "similar" to query⁸. The image retrieval is also largely restrained by some other factors like dissimilarity of user base and retrieval time. Beside this, search data can be divided up as follows: archives, domain specific collection, enterprise collection, personnel collection etc.⁸. Image retrieval has been an exceedingly active research area over the last 30 years⁹. The review articles from various years discussed about the state-of-the-art of the image retrieval of that corresponding years and descriptions of the technologies implemented. Enser et al.,¹⁰ reported abroad description of image database, various indexing

methods and common browsing and searching tasks, using primarily text-based searches on annotated images. This review paper present a systematic overview of image retrieval techniques used up to now for the effective retrieval from large image databases.

Basic Idea of Image Retrieval

The General target of image retrieval systems are: i. System must be able to process language query, ii. Search must be performed among all image database and considers human visual perception, iii. System must take account of all the features of image.

The image can be automatically indexed by summarizing their visual features in image retrieval systems. A feature is one of the important characteristic which capture a certain visual property of an image either globally for the entire image or locally for region or objects. Color, texture, and shape are commonly used features in the retrieval system. Mapping the image pixels in to the feature space is known as feature extraction. Extracted features are used to represent images for searching, indexing, and browsing images in an image database¹¹.

Approaches for Image Retrieval

Most traditional and common methods of image retrieval utilize some method of adding metadata such as captioning, keywords, or descriptions to the images so that the retrieval can be performed over the annotation words. Manual image annotation is time-consuming, laborious, and expensive. To address this, there has been a large amount of research done on automatic

image annotation. For many years researchers has been working on image retrieval processes. The three methods or systems which are used for image retrieval are: i. Text-based image retrieval, ii. Content-based image retrieval, iii. Hybrid approaches¹².

Text –Based Image Retrieval [TBIR]: TBIR is currently used in all general-purpose web image retrieval system today. As shown in the figure 1 this approach utilizes the text associated with an image to determine what the image contain. This text can be text surrounding the image, the image’s filename, a hyperlink leading to the image, an annotation to the image, or any other piece of text that can be associated with the image¹³.

The search engines like Google, yahoo, Bing are the examples of the retrieval systems using TBIR. Over one billion images have been indexed by these search engines¹⁴. Key-based indexing has many advantages which includes the ability to represent both general and specific instantiations of an object at varying level of complexity¹⁵. In the past era, access to image collections was provided by librarians and archivists through the text descriptions or classification codes that could be digitized. Several attempts are made to provide general system for image indexing that include the Getty’s Art and Architecture (AAT), which comprises more than 120,000 terms for description of art, architecture, and other ethnic objects, and the Library of Congress Thesaurus of Graphic Material (LCTGM). The AAT currently providing access to a number of hierarchical categories of image description using seven broad facts (Associated Concepts, Physical Attributes, Styles and Periods, Agents, Materials, and Objects).

Textual representation of image is problematic because image transmit the relevant information relating to what is actually pictured in the image as well as what image is all about. Shatford¹⁶ postulated this discussion with a framework based on Panofsky’s approach to analyzing iconographical level of meaning in image database. Shatford-Layne¹⁷ extended this discussion by providing a theoretical model for analyzing the subject of an image and suggested that it might be necessary to determine the relevance of attributes that would result in useful grouping of images and should be left to the users to identify. Turner et al.¹⁸ extended this model by analyzing the terms assign to both still and moving images by groups with the goal of fetching appropriate ways to index images. Manual assignment of textual attributes is a big issue related to TBIR that is both time-consuming and costly. Manual indexing face the problem between indexes and user queries^{10,19} and also from the low term agreement across indexes²⁰. The textual attributes have been automatically assigned using verbal description for the blind, which attached to many videos¹⁸. The representation of these attributes may be very relevant if represented by image exemplars and retrieved by systems performing pattern matches based on color, texture, shape, and other visual features. The main advantages and disadvantages of TBIR are as follows²¹.

Advantages: i. Easier implementation, ii. Fast retrieval (user friendly), iii. Ease to web image search (surrounding text).

Disadvantages: i. Manual description is impossible for a huge amount of database, ii. Manual description of image is not accurate, iii. Surrounding key may not be relevant to the image to be retrieved, iv. Polysemy problem.

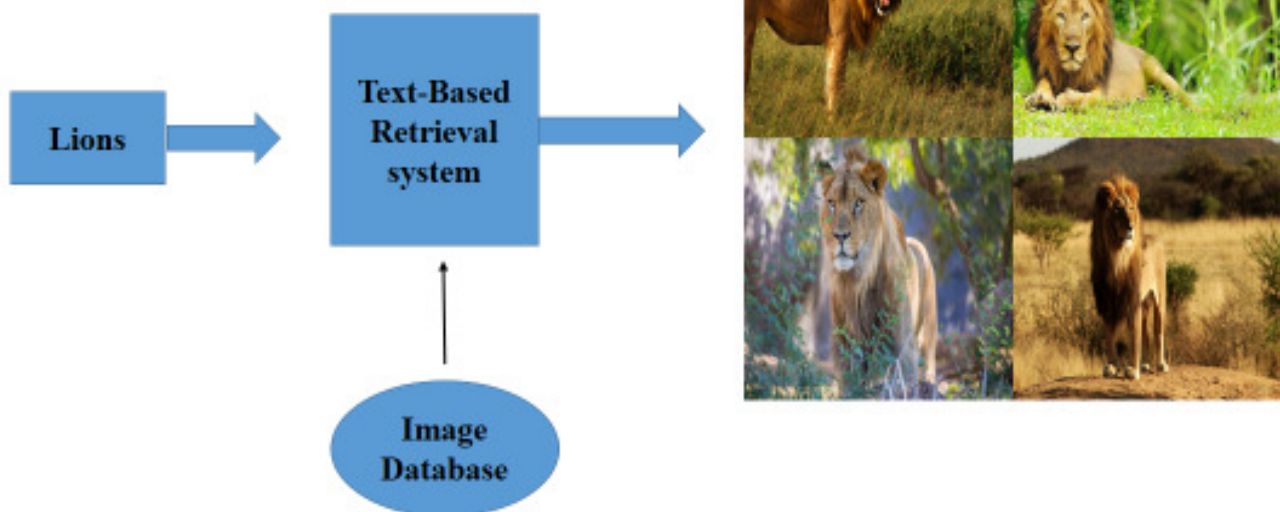


Figure-1
Text-Based Image Retrieval

Content-Based Image Retrieval: CBIR is a technique for retrieving images on the basis of extracting and indexing of automatically derived low-level features of images such as: color, texture, and shape²². CBIR is also known as query by image content (QBIC) and content-based visual information retrieval (CBVIR)²³. CBIR uses the visual content to search images from large scale image database according to the user's interest, has been an active and fast advancing research area since 1990's. In a typical CBIR systems, the visual content of images in the database are extracted and described by multi-dimensional feature vectors²⁴. The color content of an image is the most widely used feature for CBIR, while texture and shape feature are also used to a lesser degree. A single feature is not enough to discriminate among a homogenous group of images. In such cases, either pairs of these features or all of them are used for the purpose of indexing and retrieval. Similarity matching, through matrices called similarity measures determine the degree of relevance of an image in a collection to

a query. This is the key component of CBIR system because finding a set of images similar to the image, the user had in mind is its primary goal²⁵. A general and simplified model of a query-by-example (QBE) CBIR system is shown in figure-2.

IBM's Query by Image Content (QBIC) described first by Flinkner et al.,²⁶, Virage's VIR Image engine²⁷, and Excalibur's Image Retrieval Ware are several CBIR systems that are in use commercially. To retrieve images on the web the several CBIR systems like WebSEEK²⁸, Informedia, and Photobook are preferred among others¹⁵. Idris and Panchanathan²⁹ discussed several methods for image indexing and Content-Based image retrieval.

Advantages with CBIR are as follows: i. The feature employed by the systems include color, texture, shape, and spatial are automatically indexed, ii. Similarities of images are based on the features of these images, iii. Semantic retrieval

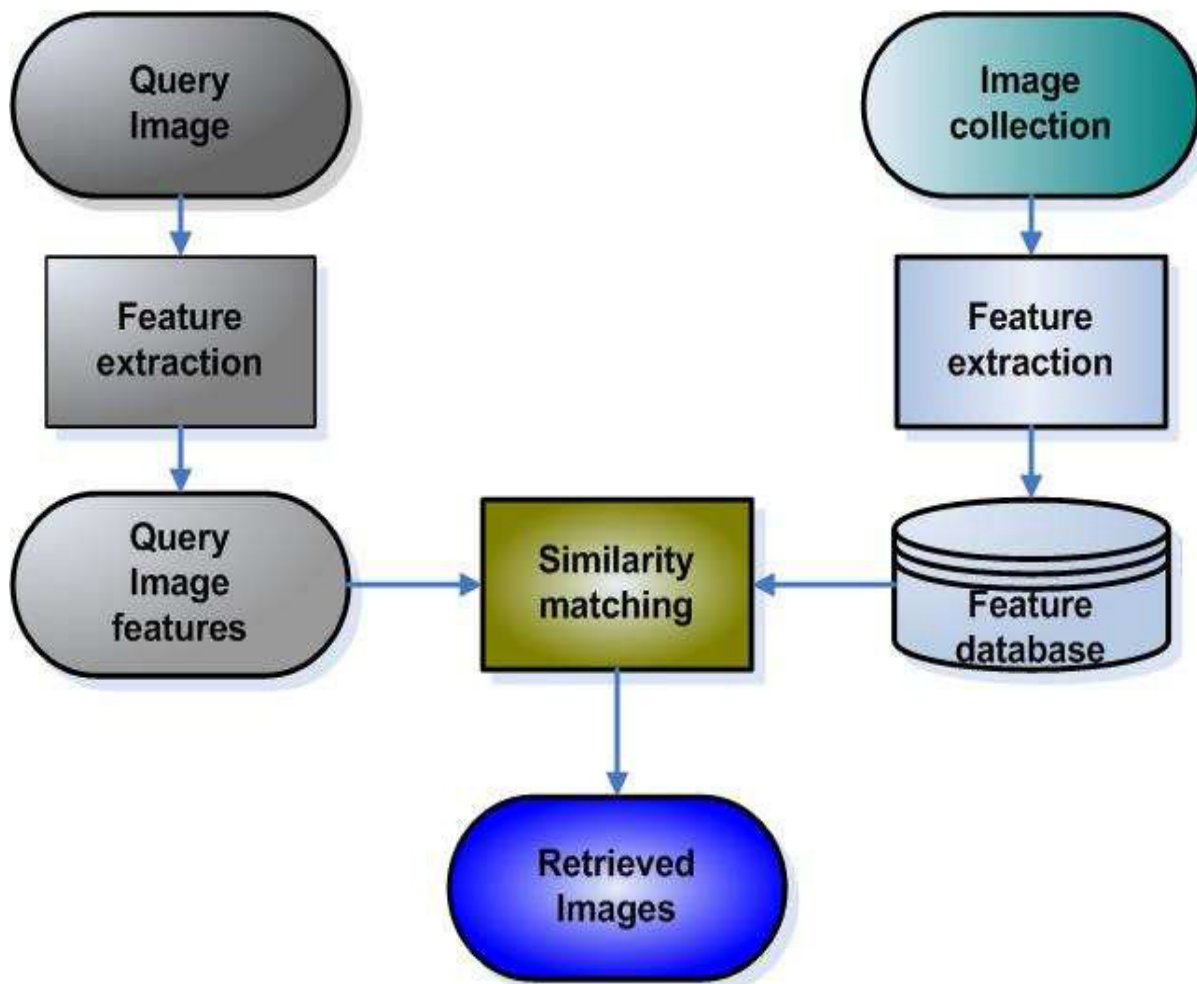


Figure-2
A general model of CBIR system²⁵

The following is a brief description of dominant method of CBIR:

Color: Image retrieval based on the color similarity is achieved by computing a color histogram from each image that identifies the proportion of pixels with in an image holding specific value. Many attempts are taken to segment color proportion by region and by spatial relationship among several color region³⁰⁻³¹.

Texture: Texture contains important information about the structural arrangement of surfaces and their relationship to the surrounding environment. Texture provide useful information of the surfaces, about their structures and the relationship with the surrounding. Texture is a difficult concept to represent. The identification of specific texture in an image is achieved primarily by modelling texture as a two-dimensional gray level variation. The relative brightness of pairs of pixels is computed such that degree of contrast, regularity, and directionality may be estimated. Ma and Manjanath^{3,32} have extended work in this area through the development of a texture thesaurus that matches texture regions in image to words representing texture attributes.

Shape: Shape does not refer to the shape of an image but to the shape of a particular region that is being sought out. Queries for shapes are generally achieved by selecting an example image provided by the system or by having the user sketch a shape. The primary mechanism used for shape retrieval include identification of features such as lines, boundaries, aspect ratio, and circularity, and by identifying areas of change or stability via region growing and edge detection. Research in object recognition conducted by Forsythe et al.,³³ has sought to develop techniques for modelling a class of objects and identifying, defining attributes and features for that class. Chang et al.,³⁴ also utilize user's relevance judgments to refine searches and to assign semantic keywords to an image that can be used by subsequent users to query the system. The technology for CBIR is still in its infancy.

Hybrid Approach: A recent trend for image search is to fuse two basic modalities of the web image, i.e., textual context (usually represented by keywords) and the visual features for retrieval³⁵. It is suggested, a joint use existing a textual context and visual features can provide a better retrieval results³⁶. The simplest approach for this method is based on counting the frequency-of-occurrence of words for automatic indexing. This simple approach can be extended by giving more weights to the words which occur in the alt or src tag of the image or which can occur inside the head tag or any other important tags of HTML document. The second approach takes a different stand and treats images and texts as equivalent data. It attempts to discover the correlation between visual features and textual words on an unsupervised basis, by estimating the joint distribution of features and words and posing annotation as statistical interference in a graphical model. As a result, the pure

combination of TBIR and CBIR approaches is not efficient for dealing with the problem of image retrieval on the Web.

Conclusion

As conclusion, this review article present a brief of image retrieval techniques. Many number of researchers have been focused on the techniques of image retrieval and each research work has its own way to retrieve the relevant image, contributions in the global retrieval systems, and limitations. This article attempts to deal with a brief of the most common and modern/ commercial image retrieval systems and techniques from early text based systems to content based retrieval. From the study of the past and present scenario of image retrieval systems it can be concluded that many researchers has been done satisfactory work but still a long way to go to overcome the flaws of the image retrieval systems.

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