



# A Review on Comparison of Techniques of Content Based Image Retrieval

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**Abstract—** Content based image retrieval is the process which follows the searching of similar images from the database, based on visual content. The RGB color model algorithm used in the present work is not sufficient for better color description. Therefore in this paper comparison to various techniques is described in order to efficiently description of the colors in an image. The comparison between various techniques is done in order to define the unique tasks by various techniques in CBIR. The diff component is defined as the difference between the values of the parameters of the images.

**Keywords:** Content based, Image retrieval, Visual content.

## 1.INTRODUCTION

Content-based image retrieval (CBIR) has become an outstanding analysis topic as a result of the proliferation of video and image know ledge in digital type. The enlarged information measure convenience to access the net within the close to future can enable the user to go looking for and browse through video and image database placed at remote sites. Therefore, fast and improved retrieval of pictures from agiant database is a vital downside that must be self-addressed. High retrieval potency and fewer machine quality area unit requires characteristics of CBIR system. In typical image database,pictures area unit text-annotated and image retrieval relies on keyword looking out. The transmission primarily based application became standard due to the rapid advancement of internet technology and therefore the digital devices. As a result, the capacity of digital image libraries obtained through different categories of sources like: social networking sites, multimedia, multimedia camera, multimedia mobiles, internet etc. So there requirement for

proper searching techniques to retrieve meaningful image data from that large volume of digital image libraries. Image retrieval techniques are used to maintain and retrieve the image in the database. Mainly the shape features are classified in to two types: boundary and region descriptors. Further they are classified as (a) Structural and (b) global. The global boundary descriptors also include the various Fourier descriptors, signatures and wavelet descriptors. CBIR performs retrieval process based on the visual content of the image data. The straight forward image to image searching mechanism is not considered in CBIR. Such approach is not the practically feasible to implement it in any real time applications because image data are comparatively huge in size. So in CBIR, we require suitable feature extraction techniques form the image data so that meaningful and relevant images can be retrieved based on those extracted image features. A number of CBIR techniques were developed based on considering the significant feature like colour, texture and shape. Colour feature is widely used in CBIR techniques since it is one of the most prominent low level features and it is also invariant to rotation, scaling, and other spatial transformations on the images. In general the histogram matching based CBIR techniques is relatively simple and faster. To retrieve image, it is essential to separate objects and background, since the objects are the key contents and the background usually weakens the retrieval accuracy. The difference between content and the text-based retrieval systems is that the human interaction is an indispensable part of the latter system. While the features are extracted using the computer vision of techniques which are mostly low-level features (colour, texture, shape, spatial layout, etc.)

There are three fundamental components in these systems:

- (1) Low-level image feature extraction.
- (2) Similarity measure.
- (3) ‘Semantic gap’ reduction.

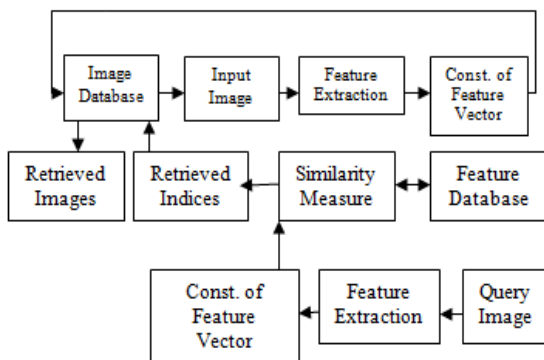


Fig.1.Content-based image retrieval system

In Fig.1, the process of work of content based image retrieval system is shown. Image is retrieved in CBIR system by following the particular steps shown in above figure. Various techniques can be practiced in CBIR using the steps of the above figure.

## 2.LITRATURE SURVEY

**Varish and pal, [1]** proposed a method, Content based image retrieval (CBIR), in which the process of retrieval of similar images from the database is proceeded on the basis of visual content of the given query image. In this paper, the authors have obtainable a CBIR technique using color based feature. Since color can be considered as one of the important features of the image data, so importance is given to all three colors, i.e. red, green and blue, is given during the image retrieving process. In this CBIR technique, firstly we have constructed three probability histograms i.e histogram is constructed for each color component and later the histograms are divided into various numbers of major bins and similarly from each bin, several statistical values like standard deviation, skewness and kurtosis are computed. The calculated statistical values are used as extract the features of the image data. The processing cost of the existing CBIR technique is considerably low. The experiment on technique has

been performed on the standard image databases and reasonable results have been achieved.

**Singha and Hemachandran, [2]** discussed on the topic, Content Based Image Retrieval using Color and Texture, This paper presents the content based image retrieval, in which the features like color and texture are defined, called Wavelet Based Color Histogram Image Retrieval (WBCHIR).The color and texture features are extracted through the wavelet transformations and the color histogram. The combination of the above various features is robust to translation and scaling of the objects in an image. The discussed system is a capable and faster retrieval method to test on a WANG image database, which contains 1000 general-purpose color images. The performance of this method has been evaluated by comparing the results with the existing systems.

**Singha et.al. [3]** proposed study on image retrieval technique which is based on the combinations of the Haar wavelet transformation which uses the lifting scheme and the Colour Histogram known as lifting wavelet-based colour histogram. The colour histogram i.e translation and rotation invariant describe its features. The texture features and the local characteristics of an image are extracted by the Haar wavelet transformation, this is done to increase the accuracy of the given retrieval system. The lifting scheme thus reduces the processing time to the retrieve images. The results of the prescribed experiment shows that the given technique outperforms the other schemes, in terms of the average recall, the average precision and the total average precision/recall.

**Singh and Rajput[4]** proposed a new CBIR system that will calculate more accurate results as compare to various other developed systems. This system uses the soft system. Image recovery system evaluates the similarity of each image in its data build up to a query image in terms of the various visual features and provide the image with preferred range of similarity. To extract features according to the data set which Auto calculates the feature weight by the neural network and develop and put into practice an efficient feature extraction of NN and SVM. The precision and recall graph in gui is prescribed accordingly as per according to the retrieved contents of the images from the datasets of the database. It is also used to apply the

back propagation or feed forward algorithm for the neural network classification and also to calculate cross relationship and apply weakening model for the feature matching.

**Kushwah and Agrawal [5]** discussed that the content-based image retrieval (CBIR) is a new but widely adopted method for finding images from the image database. Since, the network and development of multimedia technologies are becoming more popular, users are not much satisfied with the traditional information retrieval methods. So, the content based image retrieval (CBIR) is becoming a source of exaction and fast retrieval of the images from the database. Since nowadays, various techniques have been developed in order to improve the performance of CBIR. In this CBIR technique, image retrieval system inputs the query image and retrieves the relevent similar images accordingly by using the spatial coordinates which further uses the k means clustering algorithm for its segmentation and hence the image is retrieved.

**Patel and Yerpude [6]** proposed the algorithm, which basically uses two parameters i.e precision and recall for its evaluation. This algorithm works on the images of Wang database. With the advancement of Internet and Multimedia social networking technologies, the usage of such multimedia contents like images , video, audio etc are increased rapidly. So, there was the need to manage the retrieval of such vast data accordingly in an effective manner. Hence to carry out management & retrieval, an effective technique was required. This technique presented by this paper is a novel technique, used for the efficient retrieval of the required images from the large database of the image known as Content Based Image Retrieval (CBIR) system. Since from past many years, many techniques have been proposed for the same, But if the performance of those techniques is measured with respect to time, many of the techniques suffers from efficient retrieval accuracy. Hence, this paper introduces a method which uses the histogram and the color edge of an image with haar wavelet transform for the resourceful retrieval of similar images from the image database along with query image.

**Mohamadzadeh and Farsi [7]** suggested that Since, accuracy and the speed of image retrieval

are still the parameters of the preference of CBIR, but, the main task of various CBIR techniques of image retrieval systems is to perform the functions to assess, retrieve and characterize the image retrieval, according to the users demand. However, this study proposed a method based on iterative discrete wavelet transform and sparse representation. For the evaluate and comparison of the applicability of the feature-based sparse representation for an image retrieval technique, the precision at average normalized and percent recall modified retrieval rank are used as quantitative metrics. The experimental results proves that the proposed method provides better output as comparison to other methods.

**Murala *et.al.* [8]** discussed a new algorithm for content-based image retrieval application which uses the directional local extreme patterns. The link between the referred pixel and its surrounding neighbors is determined by the standard (LBP) local binary pattern, this is done by comparing the various gray-level values of the image. The proposed method is differ from the basic existing LBP in the sense that it only extracts the directional edge information based on local extrema in 0°, 45°, 90°, and 135° directions in an image. Performance is compared with various paterns like LBP, block-based LBP (BLK\_LBP), center-symmetric local binary pattern(CS-LBP), local edge patterns for segmentation (LEPSEG),local edge patterns for image retrieval (LEPINV), and other existing transform domain methods by conducting four experiments on benchmark databases viz. Corel (DB1) and Bro-datz (DB2) databases. The results evaluated after being tested shows relevance in terms of their evaluation measures in comparison to other existing methods on individual databases.

**Yue *et.al.* [9]** Presents a method used to extract the color as well as the texture features of an image at a fast speed for content-based image retrieval (CBIR). Here, HSV color space is rationally quantified .Extraction of Color histogram and texture features based on a co-occurrence matrix, which is calculated in order to form the feature vectors of the image. Then the comparison of characteristics features of various types of histograms i.e the global color histogram, local color histogram and texture features are compared accordingly and are analyzed for CBIR. Using

color and texture fused features a CBIR system is designed based on the prescribed work by constructing various weights of the feature vectors of query image. The related retrieval experiments hence, illustrate that the fused features retrieval bring improved visual sense than the single feature retrieval, which indicates the better retrieval results.

### 3. Various techniques in image retrieval

Content-based image retrieval (CBIR) has become an excellent analysis topic as a result of the propagation of video and the knowledge of image in digital type. The enlarged information measure becomes a convenient source to access the net within the close to future which can enable the users to go and look for and browse the videos and the image databases, which are placed at remote sites.

#### 3.1 Color Based Feature

Since a color image, consists of three basic color components, i.e. red, green and blue, so in this work, we have given the same importance on all three color components during image retrieving process. In the presented CBIR technique, initially we have constructed three probability histograms for each color component and subsequently the histograms are divided into several numbers of significant bins and from each bin, we have computed several statistical values like standard deviation, skewness and kurtosis. The computed statistical values are used as extracted features of the image data. The processing cost of the presented CBIR technique is significantly low. The technique has been tested on standard image databases and satisfactory results have been achieved.

$$p(r_i) = \frac{\text{no. of pixels in } r_i}{\text{weight} \times \text{height}} \quad (1)$$

Where  $p(r_i)$  represents the relative frequency or probability of  $r_i$ -th intensity value and the range of intensity value is  $[0, l - 1]$

$$\text{Bin}_i = \sum_{j=LB}^{UB} P(r_j) \leq \frac{1}{n} \quad (2)$$

Compute for each color component, the standard deviation, skewness and kurtosis from  $\text{Bin}_i$  ViE  $[0, n - 1]$  where 'C' represents R, G and B color components respectively.

#### 3.2 Haar Discrete Wavelet Transforms

The transformation of an image from one domain to another i.e from spatial domain into frequency domain is known as discrete wavelet transformation (DWT). The function of superposition of a family of the basis function is basically known wavelets and is thus represented by wavelet transformation. Wavelets generally provides various solutions which are capable of good energy compaction. Wavelets can easily capture both the texture and shape based information efficiently and hence are robust with respect to color intensity shifts. With the time, the wavelet transformation is computed linearly and thus allow the algorithm to process at a very high speed. Discrete wavelet transformation divides the signal between the wavelet function and the basic function. Multi-restoration is the another approach in which the wavelet transform computation of a two-dimensional image is used, which applies sub-sampling and recursive filtering. The image is divided into sub-bands of different four frequencies at every level or scale i.e HL, LL, LH, and HH .where L denotes the low frequency and H denotes the high frequency.

Histogram intersection distance:

$$d_{ID} = \frac{\sum_{i=1}^n \min[Q[i], D[i]]}{[ID[i]]} \quad (3)$$

Smith and Chang extended the idea, by modifying the denominator of the original definition, to include the case when the cardinalities of the two histograms are different and expressed as:

$$d_{ID} = \frac{\sum_{i=1}^n \min[Q[i], D[i]]}{\min[|Q[i]|, |D[i]|]} \quad (4)$$

and  $|Q|$  and  $|D|$  represents the magnitude of the histogram for query image and a representative image in the Database.

#### 3.3 Lifting Wavelet-Based Colour Histogram

The color histogram describe the colour feature by invariants i.e the translation and rotation invariants. To increase the accuracy of the retrieval system ,the haar wavelet transformation is used to extract the texture features and the local characteristics of an image. The processing time of the retrieved images can be minimized by the lifting scheme. The feature extraction process of NN and SVM is

discovered and is put into work in accordance to the set of the data which auto calculates the feature weight with neural network. According to the retrieved contents of the images from the datasets there is the graph of precision and recall in gui. To apply back propagation or feed forward algorithm for neural network classification. To calculate the cross relationship and to apply the weakening model for feature matching.

Feature similarity matching formulae:

$$d_{id1} = \sum_1^n \min[Q[i], D[i]] \frac{1}{D[i]} \quad (5)$$

$$d_{id2} = \frac{\sum_{i=1}^n \min[Q[i], D[i]]}{\min[\sum_{i=0}^n Q[i], \sum_{i=0}^n D[i]]} \quad (6)$$

where  $Q \frac{1}{4} \{Q1, Q2, \dots, Qn\}$  and  $D \frac{1}{4} \{D1, D2, \dots, Dn\}$  are the query and target feature vectors, respectively.

**4.Comparative analytical table**  
**TABLE 1 Compare by Performance**

Ref.no.	Technique	Purpose	Conclusions
[1]	Color Based Feature	Image retrieval on visual contents.	100% precision value.
[2]	Haar Discrete Wavelet Transform	Max. Coverage, Less time and distance.	Maximum coverage with less energy consumption
[3]	Lifting Wavelet-Based	Application of weakening	Increase the accuracy and reduces

	Colour Histogram	model for feature matching	the processing time.
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**5.CONCLUSION**

A large number of content based image retrieval have been proposed in recent past. Still there is lot of work which is to be done and research is yet to be continued. We have stressed on many approaches, like Color Based Feature, Haar Discrete Wavelet Transforms Lifting Wavelet-Based Colour Histogram. Final observations can be drawn on the basis of different techniques of image enhancement. An increasing interest towards image retrieval system made it easy to retrieve images of similar type on basis of parameters required.

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