

A Various Study based on CBIR: A Survey

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Abstract—CBIR is exceptionally helpful in a few applications, for example, restorative imaging, current conclusion, remote detecting and satellite imaging. The distinctive kinds of pictures are subjected to set of tasks utilized as constituent phases of CBIR. Principle target of this paper is to show audit about different picture recovery methods and it applications. With the partner of web, there has been expansive measure of Images dwells on the web. Thusly it is fundamental for speedy recuperation web records that retrieving pictures. The conventional data recovery methods does not take care of the client's demand, so there is have to build up an effective framework for CBIR. The CBIR are turning into a wellspring of correct and quick recovery. In this paper the procedures of substance based picture recovery are examined, broke down and looked at. Here, to compared features as color correlogram, texture, shape, edge density, CBIR systems utilizing diverse element extraction procedures are being investigated in this paper.

Keywords— *Content-based Image Retrieval (CBIR), Color, Texture, shape features, image distance measures, application, component;*

I. INTRODUCTION

The importance of digital image databases depends on how friendly and accurately users can retrieve images of interest. Therefore, advanced search and retrieval tools have been perceived as an urgent need for various image retrieval applications. The most punctual web crawlers have embraced text based picture recovery approaches. These arrangements have demonstrated uncommon confinements in light of the fact that advanced pictures to be mined are either not named or clarified utilizing mistaken watchwords. At the end of the day, content based recovery approaches require manual explanation of the entire picture accumulations. Be that as it may, this dreary manual errand isn't practical for substantial picture databases.

Content-Based Image Retrieval (CBIR) developed as a promising substitute to outperform the difficulties met by textbased picture recovery arrangements. Actually, advanced pictures, which are mined utilizing CBIR framework, are spoken to utilizing an arrangement of visual highlights. As outlined in Figure 1, regular CBIR framework comprises of a disconnected stage which goes for removing and putting away the visual component vectors from the database pictures. Then again, the online stage enables the client to begin the recovery assignment by giving his inquiry picture. At last, run of the mill CBIR framework restores an arrangement of pictures outwardly significant to the client inquiry. Be that as it may, its principle downside comprises in the suspicion that the visual comparability mirrors the semantic similarity. This suspicion does not hold as a result of the semantic hole [1]

between the larger amount meaning and the low-level visual highlights

CBIR is a technique that helps to access and arrange the digital images from a large collection of databases by using the images features. In present day time with the improvement of informal organizations numerous computerized pictures are transferred each day. Keeping in mind the end goal to deal with this gigantic information new strategies are exceptionally basic. CBIR is such a system, to the point that will facilitate the information dealing with and the client can without much of a stretch access the information. The expanding measure of carefully delivered pictures requires new strategies to chronicle and access. The pictures can be recovered utilizing shading, surface and shape. The most vital component in recovering a picture is shading. There are such a significant number of techniques to recover the shading. They incorporate shading histogram, shading minutes, autocorrelogram and so on. Shading histogram is the generally utilized strategy for shading highlight extraction. Shading histogram technique doesn't store the spatial data and furthermore it isn't invariant to scaling. Shading minutes give estimation to color closeness between pictures. Minutes are invariant to scaling and pivot. The initial four minutes are generally figured. Shading correlogram gives the likelihood of discovering shading sets at a specific pixel separate. Shading correlogram gives preferable yield over shading histogram in light of the fact that the shading correlogram gives the spatial data. Surface is recovered utilizing GLCM, entropy and so on shape is the following utilized picture include for retrieval.[2].

Images are classified As Follows:

A. Intensity images

It speaks to a photo as a framework where every constituent has a significance relating to how splendid an one of numerous from which a picture is created at the subsequent situation should be colored. It presents the two conducts to represent the number that represents the darkness of the pixel: The twice of class.

B. Indexed Images

In this image matrix standards do not conclude the pixel colors directly. Rather, MATLAB used for grid esteems as files for looking into hues in the figure's color maps. This is a helpful way show the color pictures.

C. Scaled indexed based image

A scaled filed picture utilizes grid esteems the distinction is that the lattice esteems are straightly scaled to shape query table lists. To display a matrix as a scaled indexed image, use the MATLAB image display function images.

D. Binary image

This picture plan additionally contain a picture as a lattice yet in the main color a one of numerous from which a picture is formed in white or dark. It assigns a 0 for black and a 1 for white. [3]

II. CBIR SYSTEMS

CBIR is a technique for retrieving pictures in light of thusly derived features, for instance, color, texture and shape. Here a query image will be triggered and will be compared to the images stored in the image database. Once the match is found the results are displayed in the form of image output. The CBIR application removes the picture from the picture database with the assistance of info picture or picture information. The coveted picture removed can be utilized for different purposes, for example, correspondence, investigation, rules, and so forth. Content-based recovery the substance of pictures to deliver and get to the photographs from the wide database. Atypical substance based recovery framework is detached into two sorts: separated segment extraction and online picture recovery. In separated stage, the structure therefore removes visual qualities (color, shape and texture) of every photograph in the database in light of its pixel respects and stores them in a substitute database inside the system called a part vector database. The element information (otherwise called picture mark or picture highlights for every one of the visual properties of each picture is especially littler in measure contrasted with the picture information, in this manner the component database contains a minimized type of the pictures in the picture database. Critical pressure can be accomplished utilizing highlight vector portrayal of picture database over the principal pixel regards.

In on-line picture recovery, the customer displays a request picture to the CBIR structure searching for needed pictures.

The framework speaks to this question picture with an element vector.[4]

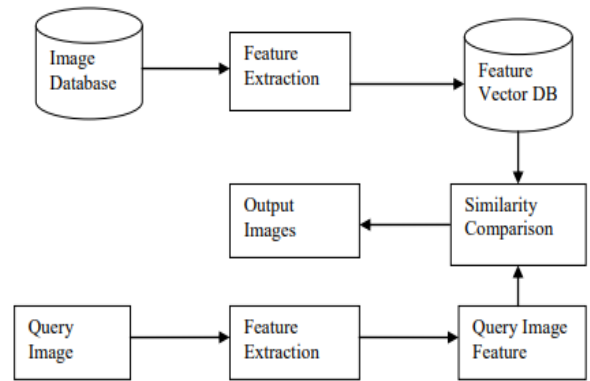


Fig: 1 Block Diagram of CBIR

The above figure demonstrates the accompanying:

- i. The first step shows the creation of the database having images.
- ii. Then we extract the extracted the feature of the images given in the database.
- iii. Query is generated
- iv. Matches the similarity of the images.
- v. Last retrieval image found.

III. COMPONENTS OF CBIR SYSTEM

The CBIR framework comprises of the accompanying segments:

1) Query picture

It is the picture to be found in the picture database, regardless of whether the comparative image is present or not. And how many are similar kinds images are existing or not.

2) Image database

It consists of n number of images depends on the user choice.

3) Feature extraction

It isolates visual data from the picture and spares them as highlights vectors in a highlights database. The component extraction finds the picture detail as highlight esteem (or an arrangement of significant worth called an element vector) for every pixel. These component vectors are utilized to contrast the inquiry picture and alternate pictures and recovery.

4) Image matching

The data about each picture is put away in its component vector for calculation process and these element vectors are contrasted and the element vectors of question picture which helps in estimating the closeness.

5) Resultant retrieved images

It finds the beforehand kept up data to locate the coordinated pictures from database. The output will be the similar images having same or closest features as that of the query image.[5]

IV. COMPARISON USING IMAGE DISTANCE MEASURES

The mainly general technique for compare two images in CBIR (normally in case image and an image from the database) is utilizing an image distance determine. A picture distance measure evaluates the comparison of 2 graphics in a dissimilarity of dimensions corresponding to color, texture, form, and others. For example distances of 0 signify a true equivalent through the question, with high view to the proportions that were examine. As one may immediately accumulate an esteem Greater than 0 demonstrates different degrees of likenesses between the pictures. Search results then can be sort based on their distance to the queried image. A long record of distance procedures can be found in.

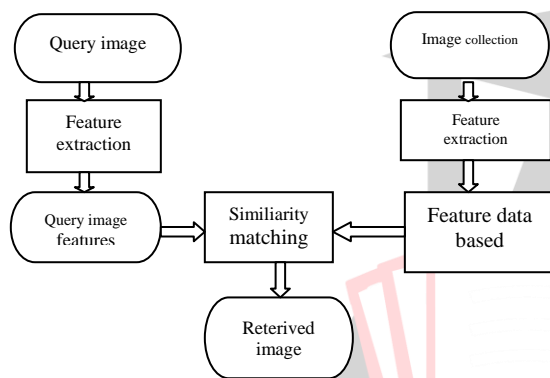


Fig.2. CBIR

A. Color

The measurement of Computing distance are depend on color comparison and are evaluate color histogram for every image that provide uniqueness to the image that also show the quality of image by each of an image collected inside an image holding specific values (that humans express as colors). Present research is try and segment color share via part and by using spatial relationship between a more than a few color regions.

Investigative images base on the colors they enclose is one of the most widely used methods because it does not depend on image size or point of reference. Color detection will typically occupy compare color histograms, though this is not the single method in practice.

B. Texture

The measurement of texture is depending on the vision pattern in any image and how to define it spatially. It is represented by pixels which are utilized as no of sets, depending on number of texture you detecting in an picture. These sets characterize the surface, as well as where in the picture the surface is found. Surface is a troublesome idea to speak to. The recognition of certain textures in a picture is carried out notably by using modeling texture as a 2D gray level variation. The near shine of sets of pixels is figured with the end goal that level of qualification,

normality, coarseness and directionality might be unsurprising (Tamura, Mori & Yamawaki, 1978). Nevertheless, the main issue is in choosing patterns of co-pixel variation and associating them with distinctive lessons of textures such as silky, or difficult.

C. Shape

It does not propose to the shape in a image but if the shape of a challenging area that is being required out. In some case correct form consciousness would require human interventions due to the fact technique like segmentation are very problematic to entirely automate. Shapes will as a rule is decided 1st applying segmentation or aspect innovation to a picture. [6]

V. TECHNIQUES OF CBIR

Ordering and Retrieval are the two critical highlights of CBIR. Color, shape and texture are the most imperative highlights of a picture. From these, highlight vectors are removed and these vectors are utilized for ordering purposes.

a) color and texture features for CBIR

A recovery component utilizing color and texture [7] is being proposed here. Contingent upon the normal for the picture surface, it can be spoken to by multiwavelet change. The fundamental inspiration of this framework is to utilize the Multiwavelet deterioration plan and colorgh the mix of Multi wavelet decay and shading correlogram we can build the quantity of highlights, which thusly enhances the recovery exactness. To help the effective and quick recovery of comparative pictures from picture databases, include extraction assumes an imperative part. The procedure utilized for contrasting pictures plays the essential element of CBIR. To make the component vector, enlisted standard deviation of each sub-band is used. At that point to discover likeness between pictures, Euclidean separation metric is utilized. The normal recovery effectiveness utilizing this technique is 75%. The fundamental preferred standpoint is that it yields countless groups and subsequently enhances the recovery precision. A constraint is in its list of capabilities.

b) CBIR using color and shape features

In this paper, a figuring is proposed which combines the upsides of various counts to improve the recuperation exactness and execution. The precision of color histogram based planning can be upgraded by using Color Coherence Vector (CCV) for dynamic refinement. The speed of shape based recuperation can be enhanced by thinking about inaccurate shape instead of the right shape. Despite this a blend of shading and shape based recovery cover is additionally built-in to enhance the precision. This allows getting surmised data about the state of the districts in the pictures. Shape depiction is a crucial issue in both protest acknowledgment and order. The division is performed through a stochastic calculation utilizing the brilliance of

the locales under examination. Hence, it was discovered that the picture highlights created from the picture areas permitted higher separation among pictures than the current methodologies. The principle favorable position of this strategy is that it makes strong list of capabilities for picture recovery.

c) relevance feedback for cbir using support vector machine and feature selection cbir

Utilizing Relevance Feedback [8] approach in view of help vector machine is used and besides uses highlight assurance methodology to diminish the dimensionality of the photo incorporate space. Each picture is put away as a multidimensional vector comprising color, texture and shape information's. In every RF step, the positive and negative illustrations gave by the client is utilized to decide few the most vital highlights for the comparing order errand, by methods for a component assurance advancement. After element choice, a SVM classifier is prepared to recognize important and insignificant pictures as indicated by client inclination, utilizing confinements from the client cases on the arrangement of chose highlights. The prepared classifier is in this manner used to give a refreshed positioning of the database pictures spoke to in the space of the chose highlights. This approach centers to limit the hole between low level highlights portrayal of pictures and the client's abnormal state semantic ideas. For that, it utilizes SVM in light of RF (Relevance Feedback) to take in client's question ideas. SVM and highlight likeness based importance input utilizing best component blend enhances the exactness of recovery. As number of input builds the recovery exactness likewise moves forward. Be that as it may, in importance input, for similar yield distinctive clients may have diverse perspectives about similitude. So it turns into a perplexing procedure.

d) semantic image retrieval by combining color, texture and shape features:

The issue of retrieving wanted picture from tremendous database is a noteworthy issue. The subjectivity of human acumen and the rich substance of the pictures additionally increment the unpredictability of the issue. To conquer this issue, another question by-case procedure utilizing different color, and shape, texture highlights is being proposed here. The system must develop such that it takes into account the different views from different users. Here, the system uses a two phase methodology. In the main stage, highlight database is made. In the second stage pictures identified with the inquiry picture wanted the by the client is recovered. For picture recovery, the database is isolated coarsely. It is finished utilizing tone histogram strategy. Highlight coordinating is then done on this lessened dataset. Toward the finish of this progression, for each component, an arrangement of pictures is gotten. At last, we recover the pictures by joining every one of the highlights which brings about an arrangement of pictures which are semantically

more like the question picture. A noteworthy preferred standpoint of this technique is that it doesn't miss any important pictures. Be that as it may, the procedure is tedious.

e) CBIR using multiple svm ensembles: here, multiple SVM

Gatherings [9] rely upon one against-all SVM multi class approach. Given a database that has been divided into N classes previously, the initial band by N SVM machine is trained. Specified a question picture, the hopeful class to which the inquiry picture has a place is ascertained utilizing this SVM group. Next, a new ensemble is created based on the one-against all approach keeping in mind the end goal to enhance the objective inquiry. The method stops when only a solitary class is returned which finishes the inquiry characterization organize. The pictures are to be preprocessed with Discrete Cosine Transform (DCT) for include extraction before an outfit is developed. The system basically fuses three modules: Feature Extraction module, Query module and Retrieval module. In the component extraction module, the techniques to convert images to feature vectors are included. The thought here is to get a smaller portrayal of the picture. Consequently, the component space has fewer measurements than the first picture highlight space. This feature space includes shape highlights, shading, surface, histogram, edge highlights and picture change highlights. The query module includes highlight extraction of the question picture and furthermore gives assets to make alterations on the inquiry pictures or even combination of watchwords onto the inquiry pictures. At last, in the recovery module some likeness measure is figured between the inquiry picture and database pictures. At that point they got values are arranged and the pictures with most noteworthy closeness are returned as the objective ones. In various SVM outfits for CBIR, the element extraction step displays a minimized portrayal of the picture by utilizing the DCT of the picture. At that point, the N SVM gathering is developed, one for each class of the database. Given the query image, this ensemble is used to find the candidate classes for the query classification. In particular, each SVM "I" restores a genuine number which is deciphered as the likelihood that the inquiry has a place with the comparing class C i. So that only the classes whose probability is larger than the mean are selected. Next, another SVM outfit is built with the chosen classes, utilizing the same prior methodology, and connected to enhance the objective hunt. The procedure stops when just a single class is returned which finishes the question characterization arrange. This class is then used as a piece of the last progress for comparability estimation and recuperation of the photo. The method is "iterative" as in each example of the fundamental circle we take the consequence of the past one keeping in mind the end goal to refine the order of the inquiry. Fundamental preferred

standpoint of this strategy is that it narrows down the search space and also could handle large image database.

APPLICATIONS OF CBIR

Following are some applications where CBIR technique is mainly used.

- Crime prevention: Automatic face recognition systems, used by police forces.
- Security Check: Finger print or retina scanning for access privileges.
- Medical Diagnosis: Using CBIR in a medical database of medical images to aid diagnosis by identifying similar past cases.
- Intellectual Property: Trademark image registration, where a new candidate mark is compared with existing marks to ensure no risk of confusing property ownership.
- Architectural and engineering design Designer needs to be aware of previous designs, particularly if these can be adapted to the problem at hand. Hence the ability to search design archives for previous examples which are in some way similar, or meet specified suitability criteria, can be valuable.
- Publishing and Fashion
- Geographical information and remote sensing.
- Home Entertainment. [8].

VI. LITERATURE SURVEY

Heng Xu (2017) et al exhibits about The "semantic hole" issue which exists the low-level picture pixels got by machines and unusual state semantic ideas saw by human has always been a key challenge for lots of applications, such as computer vision, pattern recognition, CBIR. The current achievement of profound learning examines brings a desire for crossing over the semantic hole. However, it still has some restrictions for CBIR tasks, because the machine could not well comprehend the semantic concepts from low-level pixels to high-level semantic ideas. In this paper, we presented the Relevance Feedback (RF) Model, which catches the clients' input data. When the system returned the initial retrieval results to the user and the initial retrieval results meet the demand of the user, the retrieval process is called off. Generally, relevance feedback is usually added due to the poor results of retrieval. Our CBIR system asks the user to feedback the information related to query image. Then the initial retrieval results are resorted based the updated user's feedback information. When the resorted results meet the demand of the user, RF model is stop and return the final optimal results to users. The RF is performed iteratively until the user is satisfied with the refined results. Our proposed feedback model is optimized for each user's results. From our empirical studies, deep learning combining with RF model significant. [9]

Yujiao Zhang (2016) et al presents about the existing algorithms of CBIR remove worldwide highlights in the entire picture to question, which have repetitive count and will without a doubt diminish the productivity of the recovery. In the light of this issue, a calculation in view of the blend of Harris Laput corners and SVM pertinence criticism is proposed in this paper. To start with, picture corners are removed by Harris-Laplace corner identifier and the notable locale is gotten by the thickness proportion in each appropriated territory of picture corners. At that point, shading and shape in the remarkable district are intertwined for the underlying recovery. At long last, importance criticism in view of SVM grouping is brought into CBIR. [10]

Kommineni Naga (2016) et al shows In today's present image processing world, Object Recognition is most important feature for images. In such signal and image processing sections Scale Invariant Feature Transform (SIFT) plays an important role as robust local invariant feature descriptor for object recognition. To further improve the recognition and subsequently the retrieval, Sparse coding using SIFT features are performed using a novel approach as Linear Spatial Pyramid Matching which improves the object recognition such as images or data. The content of the image is extracted using SIFT. Sparse feature portrayals for the SIFT highlights are then processed utilizing the educated lexicon. These portrayals are additionally pooled through spatial pyramid coordinating bits which have a settled measurement highlight vectors that speaks to the entire picture. The proposed method effectively represents the features of the images and these features are used in image retrieval. Based on of the question picture, the Euclidean separation is computed with database pictures and comparative pictures are come about. [11]

Pradnya Vikhar (2016) et al presents about Because of across the board applications found in numerous territories, CBIR framework is drawing in consideration of numerous analysts. Viability of any CBIR framework relies upon the highlights removed to speak to a picture. So incorporate extraction is the vital advance in plan and improvement of any CBIR framework. Most generally utilized highlights to speak to pictures are Color, texture and shape. As of late created CBIR framework consolidates these highlights to adequately speak to a picture. This paper initially talks about the idea and extent of substance based picture recovery framework. It additionally incorporates the diagram of MPEG-7 edge histogram descriptor (EDH) to remove the substance from pictures. Help it gives the likelihood of SVM classifier. In this paper the fundamental CBIR system is delivered by joining features like shading minutes, color correlogram and Gabor surface features close by edge histogram descriptor. [12]

Xiaodong Huang(2016) et al shows going To limit the semantic hole and increment the recovery productivity in

picture recovery, RF has for some time been a vital approach, where the dynamic SVM based RFs are generally connected to CBIR. In the interim, the model of SVM isn't discriminative, on the grounds that the names of the picture highlights are lacking misused. Both inside class and between-class disperse grids are engaged with DELM to improve the segregation limit of ELM for RF. The exploratory outcomes on two benchmark datasets (Corel-1K and Corel-10K) delineate that our proposed strategy for this paper accomplishes a superior execution than the best in class methods.[13]

Ningthoujam Sunita Devi (2016) et al presents about Face acknowledgment is a standout amongst the best uses of picture investigation and understanding and has increased much consideration in a decades ago. In this paper, we reason a straightforward and quick half and half face acknowledgment framework in view of CBIR and SVM. The Gabor wavelets (GW), Wavelet Transformation (WT), and principal component analysis (PCA) are used as feature extraction manner to generate a feature vector. The Euclidean Distance as a similarity measurement used to retrieve similar images and fed into the SVM is for recognition. The experimental results also indicate that the fusion of PCA, GW, and WT features as a feature vector performs reasonably well with 99.9% acknowledgment exactness of the proposed framework and can be appropriate for genuine applications.[14]

Katta Suganya et al. (2016) present that This paper proposes another two-organize procedure in which introductory advance is highlight extraction utilizing low level highlights (shading, shape and surface) while SVM classifier is utilized as a piece of the second intends to manage the boisterous positive representations. In this manner, a capable calculation of picture recovery in view of color correlogram for shading highlight extraction, wavelet transform for extricating shape highlights and Gabor wavelet for surface element extraction is proposed. Further, various components and diverse separation measurements are consolidated to get picture comparability utilizing SVM classifier. Results in light of this approach are discovered empowering as far as color, shape and texture image arrangement precision.[15].

SyntycheGbèhounouet.al. (2016) present that On this paper, settle on probably of low stage features utilized as a part of CBIR particularly these focused n SIFT descriptors. To bear in mind troublesome feeling conviction system, here keep in mind color and texture highlights and one global scene descriptor: GIST. Supposed the select element could totally encrypt high level data about emotions in view of their precision in the diverse CBIR applications.[16]

Nooby Mariam, et. al. (2015) CBIR structures use the substance of the photos to address and get to the photos.

Content basically suggests the photo descriptors like shading, surface and condition of the photo .Among the assorted picture highlights, edges are the critical one as edges speak to for the most part the neighborhood force varieties. Be that as it may, on account of shading pictures keeping in mind the end goal to get acceptable outcomes, we should consider the shade of the picture amid recovery forms. This paper delineates another method in which both edge and shading highlights of the pictures are considered for age of highlight vectors. DWT is used to spare the nitty gritty substance of the pictures nearby the lessening of the measure of the part vector.[17].

Ms. Apurva, et al. (2014) In this paper CBIR first the HSV shading space is measure to obtain the shading histogram and surface properties. Using these components a feature matrix is formed. Then this matrix is map with the quality of global color histogram and local color histogram, which are analyzed and compare. Based on this principle, CBIR system utilized color, texture and shape fused features to retrieve desired image from the large database and hence provide more competence or improvement in image retrieval than the particular feature retrieval system which means improved image retrieval results.[18]

Abderrahim Khatabi, et al. (2014) In this paper the shape is one of the important significant property used in CBIR, but for a CBIR shape representation be supposed to assure several properties such as rotation invariance, robustness, in this article we for example, pivot invariance, power, in this article we are endeavoring to study and consolidate two shape descriptors: the shape descriptor in view of the territory of MPEG-7, It's laid out on a unit plate in polar directions and the shape descriptor established characterize of MPEG-7 is focused on the delineation of the CSS.[19]

Min Huang,a,b, et al. (2015) On this paper the picture content, one of a kind graphics have extraordinary focuses, image retrieval approach founded on single feature has a shrink performance, and it cannot follow to all pictures, so an picture retrieval approach utilizing multi-characteristic fusion is proposed. In this method, the color moment in RGB color house in mixture with the color histogram in HSV color area is used for color function extraction, the improved Zernike moments are used for shape characteristic extraction, and the grey stage co-prevalence matrix is used for texture function extraction, then combining these three facets. In the end, respectively making use of color points, form elements, texture aspects as good as the fused points for picture retrieval, the experimental outcome show that the picture retrieval process founded on multi-feature fusion has enhanced retrieval presentation.[20].

VIII. COMPARISON TABLE^[21]

Sr . No.	Paper name	Feature extraction method	Performance evaluation parameter	Advantages	Disadvantages
1.	Color & Texture Features for CBIR	Color histogram, Standard wavelet	Retrieval accuracy	Improves the retrieval accuracy	Insufficient feature set
2.	CBIR using color, texture & shape feature	Color moment, Gabor filter, GVF	Retrieval efficiency	Create robust feature set	High semantic gap
3.	CBIR Using Feature Combination & RF	Color moment, Gabor, wavelet, Co occurrence Matrix	Precision	Minimize the semantic gap using RF with SVM	It is time consuming to label negative examples
4.	Semantic Image Retrieval by Combining three Features	Color histogram, Tamura, Zernike moment & edge	Precision and recall	Reduce dataset All similar image of related features are retrieved	Similarity measurement and image retrieval perform two times so it increases calculations
5.	CBIR using Multiple SVM's Ensemble	Daubechies wavelet	Precision, classification accuracy	Narrow down search space Handle large image database	Feature sets not sufficient

IX. CONCLUSION

In this paper we give a detail investigation of image retrieval framework as a survey. It won't exclude every single part of individual works, however this paper endeavors to manage an itemized audit of the most well-known customary and present day picture recovery systems from early substance based frameworks to content based recovery. The work in the region of CBIR is contemplated and some not commendable commitment in this field is accounted for in this paper different difficulties in planning and improvement of CBIR framework has been made an extension for inquire about in this field. Quantities of use of CBIR are existing which needs additionally work to improve their outcomes.

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