

# International Journal of Innovative Research in Science, Engineering and Technology

(An ISO 3297: 2007 Certified Organization)

Website: www.ijirset.com
Vol. 6, Issue 2, February 2017

# **Breast Cancer Detection Using Image Enhancement and Neural Network**

Hakar J .Mohammed Salih<sup>1</sup>, Ahmet Cinar<sup>2</sup>

Student, Department of Computer Engineering, Firat University, Elazig, Turkey <sup>1</sup>
Associate Professor. Dr, Department of Computer Engineering, Firat University, Elazig, Turkey <sup>2</sup>

ABSTRACT: Breast cancer is one of the major reasons for women death. Detection of this disease in early stages can help to avoid the raising number of deaths. One of the most used algorithm for detecting breast cancer is by enhancement of mammogram images which is used to make desired image suitable for specific application. Also the visual quality of images can be improved using digital image enhancement method. In this paper neural network technique has been used to enhance the mammogram images. This method aims to earn some great benefits of improve and sharpening procedure that is designed to understand unexpected changes in the image intensity, which leads to recognize healthy person's mammogram. The used algorithm can also remove the noise of both sharpening and smoothing techniques caused by their application in image processing field. In this work, the proposed method has been implemented using MATLAB simulation software. The system have been trained and tested using several breast X-ray mammograms. Depending on the simulation results, the proposed method can advantageously enhance the selected mammogram image and successfully detect the breast cancer which can provide help that is additional radiologists to detect and identify infected mammograms of breast cancer.

**KEYWORDS:** Image processing, neural network, Image enhancement Mammogram, classification, Segmentation.

# I. INTRODUCTION

Cancer was a substantial health issues that will be general public recently. In accordance with IARC (International Agency for Research on Cancer tumors) from the exactly WHO (World Health Organization), 8.2 million fatalities happened to be brought on by cancers in 2012 and 27 millions of brand new instances of this disorder are anticipated before 2030. In particular, cancer of the breast is among common style of disease among female. Mortality of breast cancer is extremely higher when comparing to other kinds of disease. Discovery and prognosis of breast cancer is possible by imaging processes like, for example symptomatic mammograms x-rays, magnetized resonance imaging, ultrasound (sonography), and thermography. Imaging for the cancer assessment that has been examined for more than 4 many years. Nonetheless, biopsy will be the method in which is just diagnose with certainty if disease is really current. The most prevalent tend to be okay needle aspiration, key needle biopsy, vacuum-ass ☐ sted and surg ☐ cal (open) biopsy (SOB) among biopsy tips. The task consists in obtaining samples of tissue or muscle, which are fixed across a glass microscope fall for consequent assessment and staining this might be certainly tiny. Histopathological evaluation is an incredibly, frustrating job this is certainly specialized determined by the ability associated with influenced and pathologists by factors such as for example exhaustion and loss of focus. There can be a requirement that is pressing computer assisted diagnosis (CAD) to alleviate the workload on pathologists by filtering markets that are demonstrably harmless, so your gurus can focus on the more difficult-to-diagnose matters. An amount that is considerable of provides hence has been specialized in the world of cancer of breast histopathology image analysis, and also in specific with the automatic category of harmless or malignant files, for computer aided medical diagnosis. Pathology labs have started to go towards a workflow that will be completely digital by utilizing glide that is electronic the primary section of this technique. It was authorized because associated with introduction of scanners for whole scan imaging (WSI) that enable cost creation that is effective of representations of cup glide. In addition to value which are most conditions and terms of storage and scanning capacities with the picture data, one of many features of digital sl□des is that they let the usage



# International Journal of Innovative Research in Science, Engineering and Technology

(An ISO 3297: 2007 Certified Organization)

Website: www.ijirset.com
Vol. 6, Issue 2, February 2017

of graphics evaluation methods that make an effort to give off properties that are quantitative assist pathologists inside their efforts. An automatic mitosis detection strategy with great show could relieve subjectivity both together with tediousness of manual mitosis counting, As an example, by independently creating an activity that is mitotic or leading the pathologist in the right part within the structure with activity that is greatest that is mitotic. Auto element collection was attained utilizing a novel feature scheme this is certainly weighting. Function weights derive from the necessity of a characteristic and then we reject services with lower loads. A generation that is new of (brand-new populace ofwoods) is established which functions on a reduced ability put. Each forest associated with the trained woodland votes using their corresponding loads to execute the classification during the examination step.

#### II. RELATEDWORK

Dan C. Ciresan and JurgenSchmidhuber, represent in his researches, recognition is extremely hard. In reality, mitosis try a process that will be complex which a cell nucleus undergoes different transformations. On top of that, various image markets become described as various tissues types, which exhibit very adjustable appearance. A massive amount different framework may be noticed in histology photographs discolored with Hematosin& Eosin, plus in particular most dark-blue spots, many of which correspond to cellular nuclei. Only a subset of those is actually a phase that is mitotic must be recognized. A mitotic nucleus styles very much like a non-mitotic one, or like many dark-blue acne, to the point that an individual observer without considerable education cannot differentiate them [2] in most phase. Ueli Meier and JurgenSchmidhuber clarify that naturally plausible strong synthetic circle that is neural will. Little (frequently less) receptive sphere of convolutional winnertake -all neurons provide big community degree, generating about as numerous sparsely connected sensory layers as found in mammals between retina and cortex that is visual. Only champion neurons were educated. Several strong columns which can be neural specialists on inputs preprocessed in various tips; her forecasts were averaged. Artwork notes provide for rapid classes. Throughout the really MNIST that is competitive benchmark, our very own method is the first ever to achieve near-human show [1].Chao-HuiHUANGet and Hwee-Kuan LEE defines the approach for automated mitosis discovery, which gives crucial info during executing breast cancer prognosis. Essentially, the problem of mitotic recognition requires shape object classification that will be irregular. It is a rather task that is frustrating. A novel algorithm, named eXclusive Independent Component assessment (XICA) was proposed within this paper. The XICA is actually an extension of a generic ICA, but concentrating the aspects of distinctions (called foundation that is exclusive) between two classes of coaching patterns rather than the biggest (separate) hardware. In line with the residuals obtained from the processing that is general the special basis pair of the relative classes patterns, the computerized mitosis detection is completed. By computing the residual with the general factor that will be unique, we're able to classify the offered screening models. A strategy was introduced by you for mitosis recognition [3]. Kunihiko Fukushima explains that the network try selforganized by "learning without a teacher", and acquires a capability to recognize stimulation activities according to the similarity that is geometricalGestalt) of the forms without suffering from their own jobs. This network is provided a nickname "neocognitron". After end of self-organization, the circle has a structure similar to the hierarchy type of the artistic program that is anxious by Hubel and Wiesel. The network is composed of an input coating (photoreceptor variety) followed by a cascade connection of lots of standard frameworks, each of which is composed of two levels of cells connected in a cascade. The very first coating of each and every component is composed of "S-cells', which reveal attributes comparable to straightforward cells or lower purchase hypercomplex cells, and the coating this is certainly next of "C-cells" similar to complex tissue or maybe more order hypercomplex cells [4].

## III. PROBLEMSTATEMENT

Breast cancer will be the second influence this is certainly top of affecting females in the population, surpassed lung cancer. Earlier in the days discovery and prognosis of cancer of the breast advances the opportunities for profitable cures and data recovery that is total of client. There are various ways chest malignant tumors try identified, like, Breast Self-Examination (BSE), chemical breast evaluation (CBE), mammography or imaging, and surgical treatment. Mammography is considered the most method this is certainly effective breast cancer earlier identification and assessing of public or irregularities; it would possibly discover 85-90% of most breast cancers. To identify cancer of



1531

# International Journal of Innovative Research in Science, Engineering and Technology

(An ISO 3297: 2007 Certified Organization)

Website: <u>www.ijirset.com</u>
Vol. 6, Issue 2, February 2017

the breast we have to get a hold of problems like people and calcifications that indicate breast cancer Mammogram graphics enhancement is the method of influencing mammogram pictures to improve their unique comparison and present facilitate radiologists by reducing the noise to from inside the discovery of irregularities. The strategy accustomed manipulate mammogram imagery were separated into four major groups; the predictable enhancement.

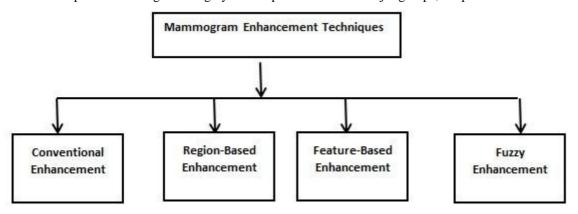


Fig1.MammogramImageEnhancementTechniques

#### IV. METHODOLOGY

#### A.IMAGE PROCESSING

Image running graphics control try a solution to transform an image into electronic kind and perform some processes on it, in order to get an image that will be enhanced to extract some useful details from it. It really is a type of indication in which insight is imaged, like movie frame or production and image is likely to be image or characteristics connected with that image. Often, image processing systems contain images which are managing two dimensional signals while using currently set sign operating methods to them. Its among rapidly technology being raising, featuring its software in a variety of areas of a business. Picture processing paperwork core study location within computers and engineering research professions too. Image processing running fundamentally consists of the subsequent three strategies include:

- a) Importing the image with optical scanner or by photography.
- b) Evaluating and influencing the picture including information compression and image enlargement and patterns which happen to be recognizing commonly to man sight like satellite photographs.
- c) Production will be the period that is final which outcome is generally altered picture or report that will be according to picture evaluation.

# **B.IMAGE ENHANCEMENT**

The main objective of image enhancement is always to process a given image so that the outcome is more suitable than the initial picture for an application this is certainly particular. They accentuate or sharpens image attributes for example borders, limits, or distinction to produce a display this is certainly graphic ideal for display and review. The improvement does not improve the details this is certainly built-in associated with facts, it advances the vibrant number of the chosen functions in order to be found effortlessly. The particular problem that is ultimate in graphics improvement is actually quantifying the criterion for improvement and, consequently, numerous picture improvement methods include empirical and need interactive treatments to acquire acceptable effects. Graphics enhancement means can be cantered on either spatial or frequency site skills.

Copyright to IJIRSET DOI:10.15680/IJIRSET.2017.0602015



# International Journal of Innovative Research in Science, Engineering and Technology

(An ISO 3297: 2007 Certified Organization)

Website: <u>www.ijirset.com</u>
Vol. 6, Issue 2, February 2017

## C.IMAGE SEGMENTATION

Image segmentation was a mid-level processing technique made use of to evaluate the graphics and certainly will feel described as a processing strategy used to identify or cluster a graphic into several disjoint section by groupingthe pixels to make an area of homogeneity using the pixel traits like grey amount, colours, surface, strength and various other services. The purpose that will be main of segmentation techniques is to get details in the order of fascination with an image which helps in annotation of the object scene. Graphics segmentation aims at domain- independent partition of the picture into a collection of aesthetically specific and homogeneous regions pertaining to attributes which happen to be specific. The objective this is certainly biggest of is clearly differentiate the thing and also the back ground in a picture. Sides recognition techniques are generally used in discovering discontinuities in grey stage imagery.

To discover consequential discontinuities in the stage that is grey will be the vital typical means in edge discovery. Image segmentation options for detecting discontinuities are boundary dependent methods.

Then graphics segmentation is in fact division of R into sub regions R1, R2....Rn, so that and it is influenced by following pair of formula if roentgen presents a graphic:

- a) Ri is a connected set, i=1, 2...n. b) Ri  $\cap$  Rj = Ø for all i and j, i  $\neq$  j c) Q (Ri) = True for i= 1, 2...n.
- d) Q (Ri U Rj) = False for adjoint regions, Ri and Rj

Where Q (Rk) is actually a predicate this is certainly rational. The principles outlined above mentions about continuity, one-to-one union, homogeneity and non-repeatability of the pixels after segmentation respectively.

# D.MORPHOLOGICAL OPERATIONS

Morphological picture handling was an accumulation non-linear procedures associated with the morphology or shape of services in an image. Based on morphological procedures rely merely from the purchasing that is comparative of principles, instead of her numerical standards, and they are especially suitable for the control of digital images. Morphological functions can certainly be used on greyscale artwork such her lighter move functionality is unfamiliar and therefore their particular downright pixel standards include of no or interest that is slight. Morphological methods probe a graphic with a shape this is certainly little layout called a structuring factor. The factor this is certainly structuring positioned at all feasible locations when you look at the image and is compared with the matching neighborhood of pixels. Some procedures test whether the element "fits" in the neighbourhood, and others try whether or not it "hits" or intersects the area: an operation this is certainly morphological a binary picture brings a unique digital graphics in which the pixel provides a non -zero worth only when the exam works at that location when you look at the input graphics. The factor that will be structuring lightweight digital Image, i.e. a tiny matrix of pixels, each with a value of zero or one:

- a) The matrix sizes identify how big is the aspect this is certainly structuring.
- b) The pattern of your and zeros determine the design associated with the factor this is certainly structuring.
- c) An origin from the structuring element is generally certainly one of their pixels, although generally t he source tends to be outside the aspect this is certainly structuring.

A rehearse that is usual to possess strange dimensions of the structuring matrix as well as the origin understood to be the hub from the matrix. Structuring aspects bring in morphological graphics handling the part this is certainly exact same convolution kernels in linear image selection.

#### V. ALGORITHMUSED

## A. GAUSSIANFILTER ALGORITHM

Gaussian filter is a filter whose feedback that was impulse a Gaussian purpose (or an approximation to it). Gaussian strain experience the land of obtaining no overshoot to a step purpose input while minimizing the fall and rise Opportunity.

The most operate that is general is



# International Journal of Innovative Research in Science, Engineering and Technology

(An ISO 3297: 2007 Certified Organization)

Website: www.ijirset.com

Vol. 6, Issue 2, February 2017

$$C(x) = \frac{1}{\sigma\sqrt{2\pi}}e^{-\frac{(x-a)^2}{2\sigma^2}}$$

A which called distribution hateful or statistical expectation accountable for submission shifting along x axis become zero: a=0; and work with simplified kind within our instance we can assume parameter

$$C(x) = \frac{1}{\sigma\sqrt{2\pi}}e^{-\frac{x^2}{2\sigma^2}}$$

#### B. GAUSSIANFILTER ALGORITHM

Steps of Gaussian filter algorithm are,

Step 1: Given window size 2N+1 calculate support points xn=3n/N, n=-N, -N+1... N; Step 2: Calculate values G"n;

Step 3: Calculate scale factor  $k'=\Sigma G''n$ ;

Step 4: Calculate window weights G'n=G"n/k';

Step 5: For every signal element

## C.CANNYEDGE DETECTION ALGORITHM

The formula operates in 5 procedures which can be different:

Step-1: smoothing: blurring associated with image to take out noise.

Step-2: Locating gradients: the edges should really be marked in which the gradients of the picture has thresholding magnitudes which happen to be large.

Step-3: no maximum inhibition: merely regional maxima must be designated as edges.

Step-4: two fold thresholing: possible edges become determined by thresholding

# D.ALGORITHM FOR MEDIAN FILTER

The below algorithm is employed to get rid of sodium and pepper sound through the corrupted graphics.

1st step: a 2-dimensional screen (denoted by  $3\times3$  W) of size 3x3 is chooses and concentrated across the prepared pixels p(x, y) in the graphics that will be corrupted.

2nd step: type the pixels from inside the chosen screen according to the raising purchase and looking for the average pixel importance denoted by Pmed), greatest pixel price (Pmax) and lowest pixel importance (Pmin) associated with vector V0 that is arranged. Today the most important and latest aspects of the vector V0 is the Pmax and Pmin respectively together with factor this is certainly center of vector will be the Pmed.

3rd step: In the event that processing pixel is the product range Pmin< P(x, y) < Pmax, Pmin> 0 and Pmax< 255, it is categorized as uncorrupted pixel and is leftover has been unchanged. Otherwise p(x, y) is classified as corrupted pixel. 4th step: next we do have the following both instances: instance

1: If Pmin<Pmed<Pmax and 0<Pmed<255, change the corrupted pixel p(x, y) with Pmed situation

2: In the event that symptom in case 1 just isn't pleased next Pmed is a noisy pixel if p(x, y) is corrupted pixel. In this situation compute the essential difference between each part of adjacent pixel over the vector that is sorted and get the difference vector VD . Then find the greatest difference between the draw their corresponding pixel and VD during the V0 towards the refined pixel.

Step 5: Step1 to step four become repeated before the control is done for the picture that is whole.

# E.IMAGE SEGMENTATION USING K-MEANS

Within this formulas are determining the length between each Centre and pixel for the cluster. The methods being algorithmic as follows,

Step 1: calculate the cluster means,

$$M = \frac{\sum_{i:c(i)=k} x_i}{N_k}, k = 1, \dots, K$$

k = number of cluster



# International Journal of Innovative Research in Science, Engineering and Technology

(An ISO 3297: 2007 Certified Organization)

Website: www.ijirset.com

Vol. 6, Issue 2, February 2017

Step 2: calculate the length involving the pixel plus the group center,

 $D(i) = arg min||x_i - M_k||^2$ , i = 1, ..., N

Step 3: then relocate to the group if the range try near the center. Normally proceed to the cluster that will be then.

Step 4: Re-estimate the middle. Repeat the process until to estimate the center.

#### VI. EXPERIMENTALRESULTS

## A.PRE-PROCESSING

The pre-processing task we have two mechanisms which were carried out first, noise can be removed by utilizing the filtration which is median. Then mammogram graphics improvement using the Gaussian filters. Noise refers to the place that is undesired of mammogram image. The pre-processing has been broken down two steps.

#### **B.NOISE REMOVAL**

The noise can be removed using four filtering method, the methods become Mean filter, average filter, Wiener filtration and Linear filter. In that filtering this is certainly above Median filtration is the best one review to some other. The Mean filtration is a sliding-window this is certainly easy filtration that replaces the cancer tumors worth into the window with all the average of the many pixel price within the graphics windows. The windows are generally rectangular but can any form. The average filter is a nonlinear filtering that is digital; it's utilized to get rid of the sound. The reduction is actually an average action that will be pre-processing enhance the results.

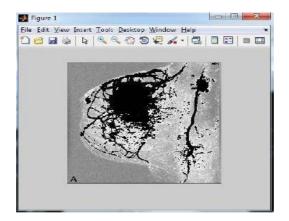


Fig2. Input Image

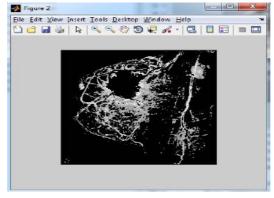


Fig3. Noise Removal image



# International Journal of Innovative Research in Science, Engineering and Technology

(An ISO 3297: 2007 Certified Organization)

Website: www.ijirset.com

Vol. 6, Issue 2, February 2017

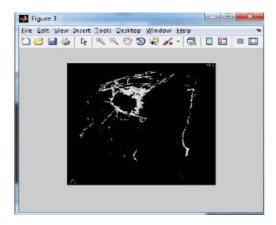


Fig4.Mammogram Enhancement image

# C. SEGMENTATION AND EDGE DETECTION

Picture segmentation involves partitioning the picture that is digital to multiple sections. The purpose of egmentation is always to simplify the representation of an image into extra meaningful and simpler to evaluate. Picture segmentation is accomplished utilizing the strategy that is thresholding. The mammogram picture could be segmented right after which edge may be identified making use of advantage discovery approach that will be canny.

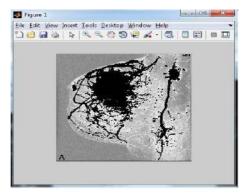


Fig5 .Input image

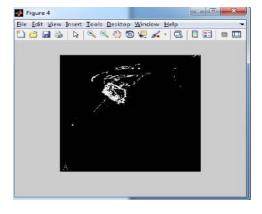


Fig6 .Edgedetectedimage



# International Journal of Innovative Research in Science, Engineering and Technology

(An ISO 3297: 2007 Certified Organization)

Website: <u>www.ijirset.com</u>
Vol. 6, Issue 2, February 2017

The edge discovery strategy is utilized to get the discontinuities out in the photographs. There's two categories of advantage discovery, hence they have been laplacian and gradient. Three fundamental actions of Edge Detections tend to be image smoothing, recognition of side details, edge localization. The side recognition that will be most readily useful is canny side recognition approach.

## D.MORPHOLOGICAL OPERATION

The process that is morphological completed to obtain the clear view of the size. Erosion, hole dilation and completing is done. Eventually the erode graphics can be overlapped together with the graphics that is earliest. For the reason that dilation that will be gray scale pixels towards the limits of things in a picture, while erosion eliminates pixels on item borders.

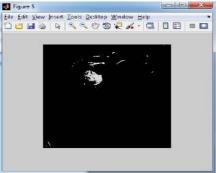


Fig7. Errosion image

## E.K-MEAN SEGMENTATION

K mean clustering information: K-means suggestion is amongst the reading, this is certainly unsupervised for your clusters. Clustering the graphics was grouping the pixels relating to some traits. It might be color, feel or level that will be gray. Contained in this approach segmentation is done based on grey size. The task pursue an easy method that is simple classify the provided datasets through a specific amount of clusters.



Fig8. Performance analysis of various segmentation algorithms on MR brainimage

Think K amount of clusters. The idea that will be biggest to define the K amount of centroids . One for each group . The next action is always to make the each importance that will be pixel to an offered Dataset and link they towards the centroid that will be nearby. This procedure continues till most of the pixels of offered graphics become assigned to the centroid that will be nearby.



# International Journal of Innovative Research in Science, Engineering and Technology

(An ISO 3297: 2007 Certified Organization)

Website: <u>www.ijirset.com</u>

Vol. 6, Issue 2, February 2017

# F.FEATURE EXTRACTION

The cluster which shows the tumor this is certainly predicted the k mean result try removed in feature removal. The removed group is actually put on the method that is thresholding. It uses digital mask throughout the image that will be entire. Within this process the digital mask are used on the image that is entire. In limit programming, each modify coefficient are compared to a threshold. Then it's if it is significantly less than the limit price considered as zero. It will if it is bigger than the threshold be regarded as you. The technique this is certainly thresholding an adaptive approach where solely those coefficients whose magnitudes were above a threshold tend to be retained within each block. Why don't we consider an image 'f which has the k level that will be gray. An integer value of threshold T, which is based on the scale this is certainly grey selection of k. The procedure this is certainly thresholding a comparison. Each pixel in 'f 'is compared to T. Based on that, digital decision is manufactured. That

Describes the value of the pixel that will be specific a Result graphics that is digital'.

$$g(n) = \begin{cases} '0' if f(n) \ge T \\ '1' if f(n) < T \end{cases}$$

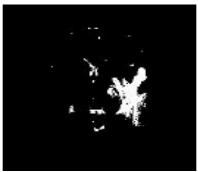


Fig9 .Output Image of Thresholding

## V. CONCLUSIONANDFUTUREWORK

The recommended means recognizes the tumefaction level based on the count of pixel principles in the region of tumefaction. This efforts is accomplished K-means that will be using algorithm discover the breast cancer during the early stage. The job that is pre-processing practiced earliest to remove sound and boost the mammogram. Then your segmentation are done Thresholding that is using technique. After that edge detection is used on have a boundary that will be away from bulk. In order to get a view that is away from bulk morphological blocking are done including dilation this is certainly gray scale gap answering and erosion. To overlap the image that will be original erode picture for finding a view this is certainly clear of tumefaction. This suggested techniques is conducted better and diagnose tumor level in the earlier period by itself. The suggested algorithm Revealed triumph that will be fantastic identifying the spot of great interest and precisely segmenting every one of the feedback test artwork. The action that is next get the suggested algorithm as one module of a larger algorithm that keeps the task provided right here. As with every optimization methods, given a large databases to work alongside will result in a greater precision number for the community that will be neural, and additional work at The image running coding may give results increases and a faster energy that is CPU the calculations.

## REFERENCES

<sup>[1]</sup> Dan Cires an Ueli Meier Jurgen Schmidhuber "Multi-column Deep Neural Networks for Image Classification"., 2012.

<sup>[2]</sup> Dan C. Cires, an, Alessandro Giusti, Luca M. Gambardella, JurgenSchmidhuber "Mitosis Detection in Breast Cancer Histology Images with Deep Neural Networks", 2013.

<sup>[3]</sup> Chao-Hui HUANG, Hwee-KuanLEE "Automated Mitosis Detection based on eXclusive Independent Component Analysis", 2012.

<sup>[4]</sup> Kunihiko Fukushima "Neocognitron: A Self-organizing Neural Network Model for a Mechanism of Pattern Recognition Unaffected" Shift in Position., 1980.



# International Journal of Innovative Research in Science, Engineering and Technology

(An ISO 3297: 2007 Certified Organization)

Website: www.ijirset.com

Vol. 6, Issue 2, February 2017

- [5] Dan Cires, an Ueli Meier Jurgen Schmidhuber "Multi-column Deep Neural Networks for Image Classification", 2012.
- [6] Haibo Wang 1, Angel Cruz-Roa, Ajay Basavanhally, Hannah Gilmorel, Natalie Shih3, Mike Feldman, John Tomaszewski, Fabio Gonzalez, and AnantMadabhushi"Cascaded Ensemble of Convolutional Neural Networks and Handcrafted Features for Mitosis Detection", 2014.
- [7] Sampat, Bovik, "Detection of Speculated Lesions in Mammograms," In Proc. of the 25th Annual Int. IEEE Conference on Eng. in Medicine and Biological Soc., pp. 810-813, 2008.
- [8] Schiabel, Santos, Angelo, "Segmentation Technique for Detecting Suspect Masses in Dense Breast Digitized Images as a Tool for Mammography CAD Schemes," In Proc. of the 2008 ACM Symp. On Appl. Computers., 2008.
- [9] PitchumaniAngayarkanni and NadiraBanu Kamal "Mathematical Morphological Approach Mammogram Image Segmentation and Classification" Journal of Engineering and Technology Vol.4, Issue 3, February 2014.
- [10] Shanmugavadivu and Sivakumar"Wavelet"Transformation-Based Detection of Masses in Digital Mammograms"International Journal of Research in Engineering and Technology Vol.3, Issue 2, February 2014.
- [11] Mohanlim, Kalra, .K., Kumar, N ," An Automatic Method to Enhance Microcalcifications using Normalized TsallisenTropy," Signal Process.,90, pp952-958, 2010.
- [12] Sampat, Bovik, "Detection of Speculated Lesions in Mammograms," In Proc. of the 25th Annual Int. IEEE Conference on Eng. in Medicine and Biological Soc., pp. 810-813, 2008.