HIGH SPEED LUNG FIELD SEGMENTATION AND ABNORMALITIY DETECTION USING CHAN VESE AND REGION SNAKE BASED MODEL

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ABSTRACT: A portion of ionizing radiation is utilised by Chest X-Ray(CXR) to create a vision within the chest area. It can be used to help analyze steady cough, fever, heart and chest injuries or pain. It likewise might also be used to help figure out and screen treatment for any kind of assortment in lung conditions, consider, emphysema, pneumonia and cancer. Chest x-beam is simple and easy, it is very valuable in catastrophe findings and treatments. It is one of the most usually endorsed clinical imaging strategies, frequently with more than two to ten times a greater number of outputs other than imaging modalities, for example CT scan, MRI and PET outputs. Chest X-Rays can likewise decide whether you have fluid in the lungs, or liquid or air encompassing the lungs. Clinically Lung fields in CXRs shows the zone of lungs. Organ segmentation is a urgent advance to get powerful PC helped identification on CXR. In this work, we propose hybrid approach for segmentation of lungs fields to identify the abnormal pieces of the lungs. The essential examination is required in chest x-rays to check whether the lungs structure coordinate with a typical lung or not. In this work, a strategy for lung field segmentation that depend's on Chan-Vese segmentation algorithm is implemented for abnormal lungs field detection with region snake based algorithm. Chan-Vese model of segmentation is one of the powerful and flexible method with in active contours. This study can help to extract the damaged parts of the lungs clearly from the CXRs.

Keywords: Chest X-Ray(CXR), Chan-Vese Segmentation algorithm, Lung field segmentation, Region Snake Based Counter Model.

Abbreviation: x-ray images, segmentation, segmentation of lung fields, abnormal lung fields, lung mask, lung boundaries, structure edge detector, region snake based model, chan vese, abnormality detection, existing methods, processing time, edge detection.

I. INTRODUCTION

The invention of X-rays by Roentgen[1] in 1895 has altered the field of indicative medication. Xray hardware is moderately reasonable and broadly accessible in medical by the doctors. Today assortments of other imaging systems like Magnetic Resonance Imaging (MRI) and Computed Tomography (CT) are accessible. In any case, chest radiograph is as yet the most generally utilized imaging methodology. General radiographs are an underlying demonstrative instrument for an assortment of clinical conditions. They are as yet the most usually utilized radiological assessment by a long shot, making up inany event 33% of all assessments in a regular radiology department.[2] The computer-aided diagnosis (CADx) and detection (CADe) frameworks have been generally utilized in clinical practice. Chest radiography is broadly utilized to treat lung illnesses. Accepting lung illness for instance, numerous X-ray radiographs based CADx and CADe frameworks. S. Katsuragawa and K.Doi.[3], In chest radiography, Computer-aided diagnosis have been created to help radiologists to improve demonstrative exactness and decrease the pace of missed detections.

The Lung fields segmented programmatically has gotten impressive consideration in scientists point of view for breaking down chest radiographs. Lung field is the most intriguing region in the lung infection diagnosis with regards to chest radiographs. For the lung malady diagnosis size, shape and surface of a lung field are key parameters, it is important to

fragment the lung field from X-ray chest images. The lung fields segmented accurately can save doctors' undertakings for the lung life frameworks. Additionally, this system is a principal portion of a computer-aided diagnosis structure for recognizing lung handles and recognizing proof of the lung life structures. What's more, this procedure is an important segment of a computerized diagnostic framework for identifying lung abnormalities. The lung fields segmentation is additionally valuable for the anatomic locale based preparing of CXRs, for example, differentiate upgrade of lung boundaries and bone concealment. Be that as it may, a precise lung fields segmentation in CXRs stays a test for a few reasons. Enormous anatomical shape varieties could be shown by lung fields, including fluctuating measurements of heart or different pathologies, and across various patients which are taking radiographs. Also, Lung fields in CXRs have two or three superimposed structures, for example, ribs, clavicles, and lung vasculatures, which don't layout the edges of the lung fields. At clavicle and rib regions strong edges may achieve places of interest or off base lung shapes in some lung field segmentation moves close. What's more, portioning the lung zenith is troublesome due to the shifting forces in the upper clavicle bone area. In the proposed investigation image contours is utilized. In Image contours detection is a procedure which is joining all the customary focuses with their boundaries and having comparative power are utilized. The picture contours are a helpful instrument for medical picture investigation and acknowledgment. The contour is unique in relation to finding an Edge.

An edge is a point where there is sharp change in the pixel shading esteem which doesn't make it nonstop in nature and now and then makes it difficult to decide the state of the article. Contours can do more than "simply" identify edges. The calculation does to be sure discover edges of pictures yet in addition places them in a progressive system. This implies you can demand external fringes of articles distinguished in your pictures. Be that as it may, our further research is to locate the abnormal pieces of the lungs that parts don't have clear limit in the CXRs. This should be possible by Chan-Vese segmentation algorithm and Region Snake Based Counter Model. Area developing is a basic district based picture segmentation strategy. This way to deal with segmentation looks at neighbouring pixels and decides if the pixel neighbours ought to be added to the locale. Since, the procedure is iterated on, in a similar way as general information grouping algorithm. Algorithms play an important role in different applications of image processing when it comes to object segmentation. During the past few years, many models of active contour have been generally utilized for finding the items of contours. The given methodology has traditionally edge situated as the snake is headed to fit the limit of an edge map of the scene. In our paper, region snake based active based contour approach, that can be executed fastly in segmentation of the object displayed in an X-ray image. The algorithm, ideal in the Max. Likelihood sense, depends on the maths of the insights of internal and external locales and would so be able to be adjusted to various types of arbitrary fields which can depict the information picture. In this paper out point is to read this methodology for distinguishing abnormalities in Lung Fields. We will at that point portray the presentation of the fast algorithm usage of pre-owned methodology and will be applied by us into the following applications. Also, the proficiency of the given technique will actually appear in genuine image groupings.

II. RELATED WORK

Chest radiography(Chest X-beam) is diagnosing the medical images process generally utilized for chest and lung ailments. The programmed segmentation of lung fields has gotten impressive consideration from specialists so that they can undergo fundamental preprocessing in naturally dissecting chest radiographs (CXRs) [1][3][5]. A precise program that segments the lung fields that spare physicians' endeavors for manual evaluation and analysis of the life of the lung systems. Moreover, the procedure is an important segment of PC helped analysis framework for distinguishing lung knobs [8]. Additionally, segmentation of the lung fields is helpful for anatomic locale which is based on handling of CXRs, for example, differentiate upgrade of lung districts and bone suppression Past efforts done on the lung field segmentation are ordered in two classifications: which are low-level method and high level method. The low-level method center around edges and pixels, utilizing thresholding, edge identifying and also connecting, and pixelbased grouping or bunching to manage the process of segmentation. These low-level methods are normally quick and completely programmed. In any case, without the direction of earlier information on body structure and organ shape, they are frequently not accurate because of the changeability that is in images, for example, anomalous life systems and also poor picture quality. The High-level method, then again, attempt to use the earlier information on non exclusive thoracic images to defeat the inadequacies of the low-level methods. The elevated level methods applied on the lung field segmentation can be principally separated into three sorts. The very first type of technique is knowledge-based edge selection technique M. S. Brown, L. S. Wilsonb et.al. (1998) the second is statistical shape and appearance model based methods T. Xu(2016), M.

Mandal, R. Long, I. Cheng, and A. Basu (2012) and the third is hybrid methods. Candemir et.al. (2015) For the first type, and also connecting, and pixelbased grouping or bunching to manage the process of segmentation. These low-level methods are normally quick and completely programmed. In any case, without the direction of earlier information on body structure and organ shape, they are frequently not accurate because of the changeability that is in images, for example, anomalous life systems and also poor picture quality. The High-level method, then again, attempt to use the earlier information on nonexclusive thoracic images to defeat the inadequacies of the low-level methods. The elevated level methods applied on the lung field segmentation can be principally separated into three sorts. The very first type of technique is knowledge-based edge selection technique M. S. Brown, L. S. Wilsonb et.al. (1998) the second is statistical shape and appearance model based methods T. Xu(2016), M. Mandal, R. Long, I. Cheng, and A. Basu (2012) and the third is hybrid methods. Candemir et.al. (2015) For the first type, Ginneken and Romeny (2009) developed a rule based edge selection method. The rules were based on the anatomical knowledge of a lung. The candidate borders of the lung were extracted by a classifier that uses pixel location, pixel intensity, entropy, and the corrected location as the input features. Xuechen et.al. (2016) had given an segmentation technique dependent on appearance and real shape models. For the multi-scale, shape model and multi-step-size along with different snag parameters were utilized. For the appearance model, changed highlights with various cycles were utilized to depict various bits of the lung field edge. The proposed technique secured 93.1% which is for the direct accessible JSRT database. The analysis results exhibited that the given technique massacres other one of a kind shape model based strategies. Nevertheless, there is need to focus on diminishing noise, improving the methods, increasing the arrangement social occasion to raise the deformability of the shape model, using more features to delineate the lung field borders and using progression methods to tune the heaps of features.

III. PROPOSED METHODOLOGY

Aim of his paper is to obtain a definite and minimum time consuming method for the segmentation of lung fields with in Chest X-Ray to be implemented by the decision makers for real time applications. The previous methods were using PC or shape models but this paper detects lungs abnormalities from lung boundaries using segmentation. From the previous approaches SED is selected. The input image of the chest x-rays uses images of manually outlines lung fields for training the samples. A contour is simply the boundary of an object in an image. Trained SED produces boundary map and marker-controlled watershed transform (MWT) are used for transforming Ultra-metric contour map (UCM). UCM is used to extract Lung contours. Here, the prime objective is to add a new technique which can detect abnormal shape of lung and is inspired from Region Snake Based Active contour model. The input images are taken from Chest X-Ray in a suitable image format for MATLAB image processing. The method which is proposed, is evaluated on the basis of a database which is of frontal chest X-ray radiographs and is compiled by The Japanese Society of Radiological Technology (JSRT).

3.1 HYBRID METHOD

The leading algorithms of lung segmentation were proposed in period 2000–2019 are reviewed. In these techniques, the pre-eminent segments of the schemes are used to produce a better way to conquer the difficulties of lung boundary detection as well as to detect the abnormalities in the lungs. The existing segmentation techniques had the following problems which need to be addressed:

- 1. Not worked for abnormal lung images.
- 2. Took a lot of processing time.
- 3. System requirement for higher version like processor i7, and a high speed processor is required.
- 4. Did not have any self-learning capability to find the deformity or irregularities in the lungs detected in Chest X-Rays.

3.2 CHAN-VESE SEGMENTATION ALGORITHM

The Chan-Vese segmentation algorithm is intended to fragment objects without plainly characterized limits. This algorithm depends on level sets that are advanced iteratively to limit a vitality, which is characterized by weighted qualities relating to the whole of contrasts force from the normal incentive outside the segmented district, the entirety of contrasts from the normal incentive inside the segmented locale, and a term which is subject to the length of the limit of the segmented region. The most important part of this paper is Mumford-Shah model, that tends to be examined underneath. So, for picture which is scalar f(y): $\Omega \to I$, energy minimization task can be accompanied by the Mumford-Shah model which can be further expressed as the Minimize a, $\Gamma\{E(a, \Gamma) = \alpha \int \Omega(a-f)2dx + \beta \int \Omega/\Gamma|\nabla|^2 dx + \gamma \int \Gamma ds \} \dots$

As given above, "f" is the first info picture. Entire aim of the given model is to discover a smooth piece wise picture "a" and a minimum contour " Γ to minimize (1). Three positive penalty para meters are given as α , β , and γ . This piece of work is difficult to tackle because of conflicting measurement " μ " and " Γ ". So as to unravel Equation 1 around, Chan and Vese . First joined the decreased Mumford-Shah model and VLSM and proposed the accompanying Chan-Vese model with a thought to isolate a picture into two areas a1 and a2 having Ω 1 and Ω 2 mean values respectively.

Minimize a,
$$\Gamma\{E(a, \Gamma) = {}^{\alpha 1}\int\Omega 1(a1f)2dx + {}^{\alpha 2}\int\Omega 2(a2-f)2dx + {}^{\gamma}\int\Gamma^{ds}\}\dots 2$$

a = (a1, a2) is signified as sections of the image.

So,"
$$\Omega = \Omega 1 \cup \Omega 2$$
, $\Omega 1 \cap \Omega 2 = \emptyset$."

Tony Chan and LuminitaVese firstly proposed this algorithm. Most of the segmentation methods depend upon the edge detection processes. The segmentation limit given is shown with a level set function that also permits the segmentation to deal with topological changes fluently.

3.3 REGION SNAKE BASED MODEL

Region Snake Based model is an active contour method used in segmentation. The model predominantly attempts distinguishing the objective article taken for segmentation. It utilizes a specific measure of earlier information about the objective article shape particularly for complex items. Region snake based model additionally called snakes by and large designs by the use of spline emphasize to limit energy with different powers overseeing the radiography image Region Snake based model establishes deformable model to a picture through energy minimisation E inter portrays the internal-energy that characterizes perfection imperatives, where α settles the limit of expansion of snake and the limit of versatility feasible for the snake. β settles snake's inflexibility level. The internal energy can be represented in the Equ.-3.

Snake works productively with complex objective articles by separating the consider along with different littler targets. Snake model is intended to differ its shape and position while tending to look through the negligible energy state. Snake proliferates through the area of the picture to lessen the energy capacity, and expects to progressively move to the neighbourhood least. Snake is communicated by Equ-1. The parametric type of the curve is misused in the Snake model that has a greater number of points of interest than using understood and express curve structures.

So,
$$v(s,t)=(x(s,t),y(s,t))$$
 Equ-1

So, multi dimensional curve has coordinates x and y, Spline parameter is v having the range 0 to 1,

Linear parameter, $s \in [0,1]$ and $t \in [0,\infty]$ is time parameter.

The forces in snake incorporate external forces just as picture forces that helps in identification of essential features. At the point when the snake model moves around an enclosed curve, it moves with the impact of both internal and external energy to keep the complete energy least.

The all out energy of region snake based model is a summation of three sorts of energy in particular (I) internal energy (Einter) which relies upon the level of the spline identifying with the shape of the objective picture; (ii)external energy (Eexter) which incorporates the external forces given by the client and furthermore energy from different components;

(iii) Energy of the considered Image(EI). The final summation of the energy for the shape arrangement in the region snake based model is given by Equ. (2).

Eintern=
$$\sigma$$
| $\partial v/\partial s$ |²+ β | $\partial^2 v/\partial s^2$ | Equ. 3

Forthe most parts, limitations of External energy are used to characterize the snake close to the necessary neighbourhood least. It might be portrayed utilizing elevated level translation and connection.

Eimage=
$$p1I(x,y)+p2|\nabla I(x,y)|^2+...$$
 Equ-4

Image segmentation finds articles and boundaries (difference in the intensity of pixels) in images. All the more correctly, picture segmentation is the way toward appointing a values or mark to each pixel in a picture to such that pixels with a similar values can have same visual attributes. In proposed work, a MATLAB usage of Chan-Vese model for implementation of image segmentation.

To run the simulator, set simulation folder in root directory in MATLAB. The images for testing are placed in the folder. These images are selected form JSRT dataset. We have three images for testing.

The objective item with contour is appeared in the Equ.- 4, where line proficient is denoted by p1 and p2 and is called the edge effective. As per the higher estimations of p1 and p2, darker pixel locales are adjusted by the snake on account of positive worth and it advances towards the brilliant pixels when the worth is negative. Snake model utilized for segmentation of different sorts of pictures. The utilizations of dynamic snake model are expanding in a gigantic way particularly in the different imaging fields. In clinical imaging field, snake model is utilized section one locale of picture which has unique highlights contrasted with different districts of the picture. Various uses of customary Region Snake Based model in clinical images are used to identify glaucoma, tissues or cell picture segmentation, vascular area and different locales segmentation for analysis and investigation of disarranges or variations from the norm. For instance, a cut of Chest X-Ray picture is considered for segmentation utilizing snake model. Chest X-Ray picture has the areas of internal organs like lungs and heart. As in figure-1, The segmentation of lung fields for the chest is applied by Region Snake Based model. Shape that's created in the Chest-X ray could be utilized for additional preparing.

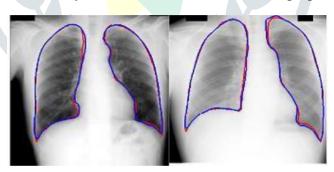


Figure 1. Segmentation of chest image using RegionSnake Based model.

IV. BLOCK DIAGRAM

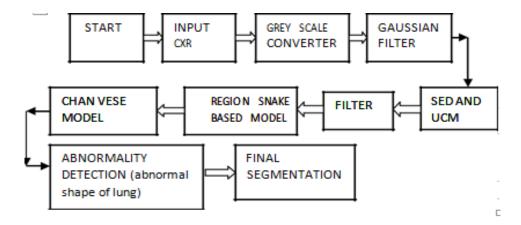
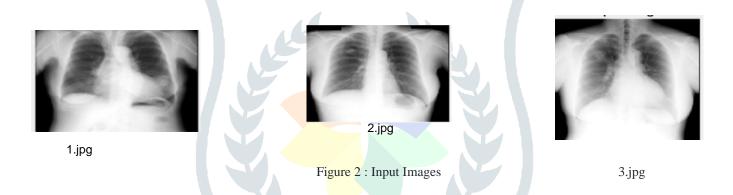


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V. EXPERIMENTAL RESULTS

1. In computer vision, segmentation alludes to the way toward dividing a digital image into various segments (super pixels). The segmentation changes the view of a picture into something that is increasingly important and simpler to examine. In this step, the image file is read, resized and converted to gray scale.

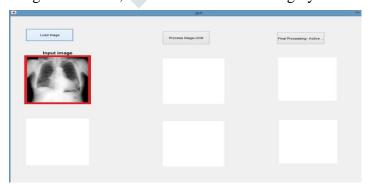


Figure 3: Loaded Image in Simulator

2. Run "gui.m" directly to start simulator. Click on the Load Image button, to load input image. Suppose 1.jpg is loaded in the simulator.

3.Click on the Processed Image for applying SEDUCM procedure.

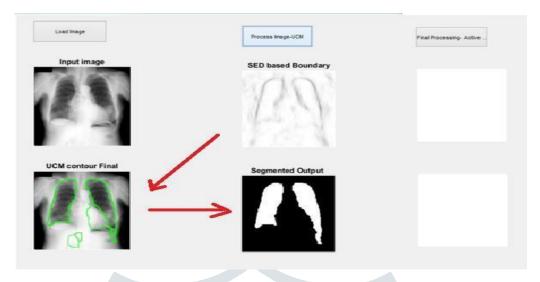


Figure 4: SEDUCM Approach

In this step edgesTrain_CXRLungfield() and edgeDetect() method of Structured Edge Toolbox are called to set options for training, to set structured edge model trained withe edgesTrain. This will detect the edges and display the SED based boundaries. After that it performs SEDUCM procedure for lung segmentation. For SEDUCM procedure sed_seg(img,model)method is called with two arguments, one is the Chest X-Ray, second is the model.

[lungMask, boundaryMap, ucmMap, \sim , \sim] =sed_seg(inp1, model); This function computes ultra-metric contour map from super pixels and returns three images that are boundary map, Lungs mask and SEDUCM segmented output



Figure 5; BoundaryMap Figure 6: UCM Map



(Lung Mask image is formed by combining left lung and right lung)

Figure 7: SEDUCM segmented output

5. Now it's time to implement Chan-Vese model with Active Contour Snake Algorithm to detect the abnormalities in the Lung fields by clicking the third button.

Figure 8: Final Processing for Active Contour Model.

Steps performed are:

- I-imread(image_file) % input an image file
- So, "Nx,Ny,Nz=size(I)" % size of an image
- inp=rgb2gray(I); %Convert color image to gray scale image
- inp=im2double (inp); %Convert input image to double array
- Computer edge detector function call active_contour_minimization_ mex() to return Inside Mean and Outside Mean and segmented image. Its output is shown below:

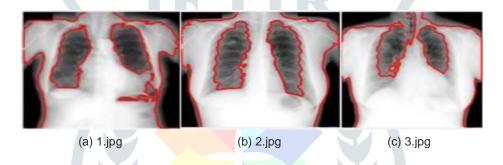


Figure 9: Final Segmented Image Highlighting Lung Fields Abnormalities.

VI. DISCUSSIONS AND RESULTS

Chan-Vese model is an adaptable strategy for some fields of computer vision i.e, segmentation in images. Be that as it may, segmentation with this techniques and new approaches includes a great deal of emphasis in general image locale, which prompts a low ascertaining effectiveness, particularly for medical images. In this approach, another iterative Chan-Vese model with Region Snake Based Counter Model is executed to distinguish variations from the norm additionally in the lung fields. Some quick development algorithms, for example, the Region Based Snake Algorithm can be received to improve the productivity of segmentation. This model is applied to segmentation of Chest X-Ray pictures, and examinations affirm its elite, which makes this methodology increasingly suitable for doctors and researchers.

Overall Performance of the proposed methodology							
Figure(9)	Image	Image Size(in pixels)	Segmentation Time(in seconds)	Lambda	MeanIn	Meanout	
Fig (a)	1.jpg	256x252	0.205618	0.00983	59.2582	198.9907	
Fig (b)	2.jpg	256x250	0.667556	0.00951	70.5074	211.2940	
Fig (c)	3.jpg	256x251	0.163111	0.009875	67.1837	224.2244	

Table 1-Overall Performance methodology shown in the above table

Comparing proposed method with existing methodologies according to segmentation time

Image	Image Size (in pixels)	FCM	SED	Region Grow	Region Snake
	(iii pixolo)			0.011	Griano

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www.jetir.org 327

					Based
1.jpg	256x252	13.6787	4.7162	5.8959	0.205618
2.jpg	256x250	15.7654	4.7341	5.5682	0.667556
3.jpg	256x251	17.780	4.4775	5.5243	0.163111

Table 2 - Comparing Region Snake Based model with already existing models

VII. CONCLUSION

For the proposed investigation study, distinctive Chest radiographs were used to test the capability and execution of the proposed strategy. This paper successfully recognized and segmented the Chest variations from the norm in Chest X-Rays. The algorithm was attempted and executed in inconceivable programming device MATLAB. The results obtained at different emphasis in the proposed technique. Other than endorsement, we calculated the general execution of our proposed technique to the extent time taken for segmentation, which is considered as one of the most critical framework for working up with algorithms in a faster way(which is as showed up in Table 1). The Lung Fields are segmented in 0.205618 seconds, 0.667556 seconds and 0.163111 seconds with three picked pictures 1.jpg,2.jpg and 3.jpg separately. As appeared in Table-2, the results of the Region snake based model are contrasted and the Fuzzy C-Mean, Region Grow and SED models. The proposed algorithm acted in least possible time and performed particularly conversely with other techniques giving specialists and analysts a chance of-choice to examine the lung fields choice depending on whether they have to identify from inside or externally.

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329

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