# A MULTI-THRESHOLD BASED MORPHOLOGICAL APPROACH FOR EXTRACTING COASTAL LINE FEATURE IN REMOTE SENSED IMAGES

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# ABSTRACT

While executing tasks such as sea surveilling, maritime searching and rescue, sea pollution monitoring utilizing remote sensed images, the coastal line feature should be determined at first. Thresholding methods is a type of simple but valid methods for image segmentation, likewise, they can be used to detect coastal line feature in remote sensed images. However, while conventional thresholding methods used to do it, they are always short of enough discriminating ability to objects' shadow, weak-scattering vegetations, dark artificial buildings, sea gulf blurred by noise along costal line. This paper proposes a multi-threshold based morphological approach, which divides the isolated regions by thresholding detecting into intra-continent, exterior-sea, and along-coastal isolated regions at first, and then utilizes two definitions and morphological operators to process along-coastal regions further so as to improve the detecting accuracy and decreasing false detecting, especially to enhance detecting accuracy for above objects' shadow, vegetations and dark artificial builds. Experiments are executed and the results exhibit the proposed approach possessing better performance than conventional thresholding approach.

### 1. INTRODUCTION

There are many advantages by utilizing remote sensed data to execute tasks such as sea monitoring, shipwreck rescue, sea pollution monitoring, et, including large area monitored, quickly responding time, much less cost, and so on, by which the efficiency of executing tasks can be improved prominently. Accordingly, optic and SAR data on-board have been used to monitor sea and ocean more and more.

While taking aforesaid application by remote sensed data, an important step to improve efficiency is to automatically extract coastal line feature by computer at first, then take accurate processing on targets in sea (http://www.wins.uva.nl/research/isis). To SAR data, thanks to the different scattering characteristics between water and solid material, intensity threshold method can be validly used to extract coastal line feature, but the result of extracting coastal line will be limited by the resolution and speckle. Optic data, because of its high resolution, even can be used to monitoring stowing away, smuggling besides aforesaid applications. In general, intensity threshold method can still be used to extract coastal line feature validly.

Thresholding method (Sahoo, 1988) is a type of simple but valid method for image analysis and image segmentation (Kohler, 1981), which has been used to process many types of image, including optic images, SAR images, multispectral images, etc. Simultaneously, it has propagated many detailed approaches (Kapur, 1985; Perez, 1987). Thresholding method can also be used to extract coastal feature in remote sensed images. However, if there are some dark regions like pseudo water areas, such as objects' shadow, weakly scattering vegetation, dim buildings along coastal region, some of them will probably be regarded as part of sea by traditional thresholding method, which will result in some false judgments. Nay, noise maybe makes some water area belonging to sea isolate, and result in false judgment.

In general, mathematical morphological operators (Heijmans, 1994) comprise *Erosion*, *Dilstion*, *Open*, *Close*, etc, and they are widely used to segment image, enhance image

(Pesaresi, 2001). This paper proposes a multi-threshold based morphological approach to extract coastal line feature in optic remote sensed images. At first, we use conventional gray thresholding approach to extract the base coastal line feature, which is a binary image comprises many complex isolated regions. Then, by defining the region distance, the isolated regions are divided into intra-continent isolated regions  $A_{iso}^{Cont}$ , exterior-sea isolated regions  $A_{iso}^{Sea}$ , and along-coastal isolated regions  $A_{iso}^{Coast}$ . Afterwards, the along-coastal isolated regions  $A_{iso}^{Coast}$  are made a further process, that is, area thresholds based on prior knowledge are used to identify  $A_{iso}^{Coast}$ 's continent or sea area attribute. A further process by morphological operator *Erosion* to the minimal-path is taken, which will connect the along-coastal isolated regions belonging to sea area with the main sea area. By it we can improve the accuracy of dividing sea area and continent area, and descend the false judgment rate. Finally, morphological operators Open and Close are used to fill the same attribute, continent or sea, areas, and acquire the accurate costal line feature in remote sensed images.

### 2. COASTAL LINE FEATURE EXTRACTING BY THRESHOLDING APPROACH

There are different characteristics for light scattering from all kinds of objects, which exhibit different color or intensity information in optic remote sensed images. Intensity threshold approach utilizes the water's dim intensity information to extract coastal line feature.

Assume intensity threshold to be Thresh, for optic remote sensed image I, I(i, j) is any one of pixels, then we process

$$I(i, j) = \begin{cases} 255 & if \ I(i, j) \ge Thresh, \\ 0 & if \ I(i, j) < Thresh. \end{cases}$$
(1)

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I(i, j) as following:

Empirically, *Thresh* selects image's mean intensity or its neighboring value, that is:

$$Thresh = mean(I) + \Delta \tag{2}$$

The  $\Delta$  in equation (2) is *Thresh*'s tuning. The *Thresh* can also be calculated by Otsu (Otsu, 1979) proposed approach.

By this procedure it's easy to divide the dim intensity main sea area,  $main A^{Sea}$  and strongly scattering main land,  $main A^{Cont}$ . Of course, in the land area, there are also some dim intensity regions, such as lake, weakly scattering vegetation, and objects' shadow, which will result in some isolated false sea area after threshold processing. Simultaneously, some bays along the coastal line may be isolated as water area because of noise, and island or ships in the sea will form land as isolated points or regions. Similarly, image's noise maybe results in some isolated points or regions, too. So the result by threshold processing will be a binary value image containing main coastal line feature.

In order to extract coastal line accurately, these isolated points or regions must be processed using morphological operators ulteriorly. For the sake of convenient description, in following we will regard all isolated points and regions as isolated regions.

#### 3. UTILIZE MORPHOLOGICAL OPERATORS TO INPROVE EXTRACTING COASTAL LINE FEATURE

### **Morphological Operators**

Suppose structure element as SE. For any one of pixel p of image I, its value is value(p). Assume  $N_{SE}(p)$  to be the neighbor region formed by SE operating on pixel p, then the *Erosion* operation SE acting on p is defined as:

$$Erosion_{SE}(p) = \{ \land value(p) \mid p \in \{p\} \cup \mathbb{N}_{SE}(p) \} \quad (3)$$

Similarly, the *Dilation* operation SE acting on p is defined as:

$$Dilation_{SE}(p) = \{ \lor value(p') | p' \in \{p\} \cup N_{SE}(p) \}$$
 (4)

Then the *Open* and *Close* operation by SE operating on pixel p can be defined as:

$$Open_{SE}(p) = Dilation_{SE}Erosion_{SE}(p)$$
 (5)

$$Close_{SE}(p) = Erosion_{SE}Dilation_{SE}(p)$$
 (6)

### 3.1 Judgment to Isolated Regions

**Definition 1** *region distance:* Assume two regions  $A_1$  and  $A_2$ , not connecting in 4-neighboring mode,  $P_1, P_2$  are one of

pixels in  $A_1, A_2$  respectively, and *Conn* is neighboring connecting mode between pixels, then the *region distance* between  $A_1$  and  $A_2$  is:

$$D(A_1, A_2) = \min_{P_1 \in A_1, P_2 \in A_2} (dist(P_1, P_2), Conn)$$
(7)

Points  $P_1^D$ ,  $P_2^D$  in  $A_1$  and  $A_2$ , the pixels corresponding to *region distance* are named *distance pixels*.

Generally, the *Conn* parameter in equation (3) selects 8 or 4 neighboring connection, and the *region distance* is zero if  $A_1$  connects with  $A_2$ . Apparently, the *distance pixels*  $P_1^D$ ,  $P_2^D$  in  $A_1, A_2$  corresponding to *region distance* are not unique.

It must be confirmed to whom an isolated region  $A_{iso}$  belongs before it is erased. We divide these isolated regions as intracontinent isolated region  $A_{iso}^{Cont}$ , exterior-sea isolated region  $A_{iso}^{Sea}$ , and along-coastal isolated region  $A_{iso}^{Coast}$ .

Suppose thresholds of *region distance* as  $Thresh_1^D$  and  $Thresh_2^D$ , then the isolated regions are divided by following formula:

$$A_{iso} \in \begin{cases} A_{iso}^{Cont} & \text{if } D(A_{iso}, main \ A^{Sea}) > Thresh_1^D, \\ A_{iso}^{Sea} & \text{if } D(A_{iso}, main \ A^{Cont}) > Thresh_2^D, \\ A_{iso}^{Coast} & \text{otherwise.} \end{cases}$$
(8)

In fact, to intra-continent isolated region and exterior-sea isolated regions, their continent or sea area attribute can be confirmed according to their intra-continent or exterior-sea attribute. However, to an along-coastal isolated region, it needs to confirm its continent or sea area attribute by further judgments. These judgments can be decided by its area characteristic. We regard the as sea area if its area follows a specific range.

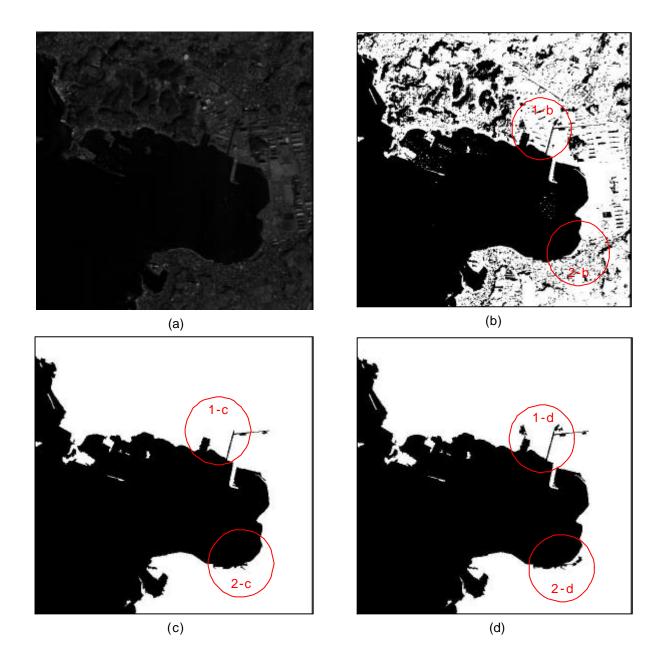
#### **3.2 Connecting Isolated Sea Regions**

After confirming the intra-continent or exterior-sea attribute of an along-coastal isolated region, if a region belongs to sea area, there is still a work to connect it with the *main*  $A^{Sea}$ , making it become part of the sea area.

**Definition 2** *minimal path*: Assume *distance pixels*  $P_1^D$ ,  $P_2^D$  in regions  $A_1$  and  $A_2$ , *Conn* is the neighboring mode, then the *minimal path* is defined as:

$$Path_{\min} = \left\{ Pixels | \min(dis(P_1^D, P_2^D, Conn)) \right\}$$
(9)

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**Figure 1** Experiment results for coastal line feature extraction. (a) Source remote sensed image, (b) Binary image after processed by gray threshold approach, (c) Coastal line feature extracted by conventional threshold approach, (d) Coastal line feature extracted by proposed approach.

Then, connecting an along-coastal isolated region belonging to the sea area with the *main*  $A^{Sea}$  can be implemented by 'waterlizing' the *minimal path* between the region  $A_{iso}^{Coast}$  and region *main*  $A^{Sea}$ .

### **3.3 Eliminate Other Isolated Regions**

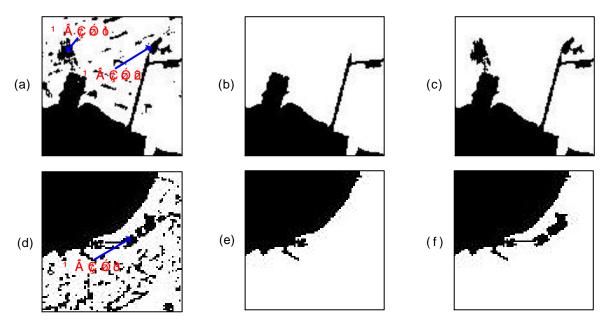
After executing above processing, isolated regions belonging to the sea area have been connected with the main sea area and become a whole sea area. The remaining processing is to eliminate other isolated regions. We can use a region-erasing operator to eliminate them, and make them become part of continent or sea. Assume  $Area(\cdot)$  an area operator for the same intensity and connecting region in a binary value image, to an isolated region  $A_{iso}$ , suppose its pixels' value is 1 then

$$I = \begin{cases} Open(A_{iso}) & \text{if } value(A_{iso}) = 1 \text{ and } Area(A_{iso}) < Thresh^{O} \\ Close(A_{iso}) & \text{if } value(A_{iso}) = 0 \text{ and } Area(A_{iso}) < Thresh^{C} \end{cases}$$
(10)

The  $Thresh^{O}$  and  $Thresh^{C}$  in equation (10) are area thresholds for *Open* and *Close* operation respectively.

After processed by foresaid steps, the coastal line feature in an optic remote sensed image will be extracted accurately.

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**Figure 2** Enlarged results of 1 and 2 regions labeled in figure 1-(b), 1-(c) and 1-(d). (a) Enlarged region of 1-b, (b) Enlarged region of 1-c, (c) Enlarged region of 1-d, (d) Enlarged region of 2-b, (e) Enlarged region of 2-c, (f) Enlarged region of 2-d.

### 4. EXPERIMENTS AND RESULTS ANALYSIS

In order to validate the proposed approach, a experiment has been taken on a remote sensed image. Here we set  $A_{iso}^{Sea}$  and  $A_{iso}^{Cont}$ 's region distance  $Thresh_1^D$ ,  $Thresh_2^D$  to 2 pixels, the connection mode Conn of region distance and minimal path to 4-connection. The *Open* operation's area threshold is 16 pixels, and the *Close* operation's area threshold is 50,000 pixels.

Figure 1 exhibits the experiment's source image and results. Figure 1-(a) is the source remote sensed image comprises continent and sea, and there are very complex regions along the coastal line. Figure 1-(b) is the binary image after processed by gray threshold approach, which shows a very complex binary image rather than a simple image just consisting of single continent and sea regions. Figure 1-(c) is a coastal line feature extracted by conventional threshold approach, while Figure 1-(d) is the coastal line feature extracted by proposed approach. In figure 1-(b), 1-(c) and 1-(d), there are two corresponding regions labeled 1-b, 2-b, 1-c, 2-c, and 1-d, 2d, which are two regions regarded as continent by conventional threshold approach, see 1-c and 1-d in figure 1-(c), however, are identified correctly by our proposed approach, see 1-d and 2-d in figure 1-(d).

Figure 2 shows the enlarged results of 1 and 2 regions labeled in figure 1-(b), 1-(c) and 1-(d). Figure 2-(a) is enlarged region of 1-b, figure 2-(b) is enlarged region of 1-c, figure 2-(c) is enlarged region of 1-d; Similarly, figure 2-(d) is enlarged region of 2-b, figure 2-(e) Enlarged region of 2-c, and figure 2-(f) is enlarged region of 2-d. From figure 2, the three isolated regions acquired by gray threshold approach are regarded as continent area falsely so that the coastal line feature's accuracy is crippled. The proposed approach in this paper identifies these false and corrects the results. Accordingly, a more accurate coastal line feature is extracted.

### 5. CONCLUSION AND FUTURE WORK

In this paper, a multi-threshold based morphological approach is addressed to extract coastal line feature from optic remote sensed images. Conventional thresholding approach is simple and valid for image segmentation. However, it will result in any false division to objects' shadow, weakly scattering vegetation, and dark buildings. By several morphological operators, simultaneously, proposing two definitions, region distance and minimal path, the proposed approach is proved to possess more accurate result than conventional threshold approach, which is validated by an experiment.

While multiple thresholds being used in the proposed approach, how to decide them adaptively is another important aspect needed to solve. Appropriate thresholds selection will provide optimized results (Nakagawa, 1979; Wang, 1984).

Thanks to the apparent comparison between water area and land in radar remote sensed image, data fusion methodology for optic images and SAR images can be used to extract coastal line feature, by which the advantages in every kind of data can be integrated and the result can be improved observably.

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