

See discussions, stats, and author profiles for this publication at: <https://www.researchgate.net/publication/3776717>

Ship Detection In Radarsat SAR Imagery

Conference Paper · November 1998

DOI: 10.1109/ICSMC.1998.727570 · Source: IEEE Xplore

CITATIONS

12

READS

230

7 authors, including:



Shengrui Wang

Université de Sherbrooke

179 PUBLICATIONS 1,745 CITATIONS

[SEE PROFILE](#)



Ali El-Zaart

Beirut Arab University, Faculty of Science

89 PUBLICATIONS 444 CITATIONS

[SEE PROFILE](#)



Goze Bertin BENIE

Université de Sherbrooke

102 PUBLICATIONS 869 CITATIONS

[SEE PROFILE](#)



Michael Henschel

MacDonald, Dettwiler and Associates Ltd

38 PUBLICATIONS 161 CITATIONS

[SEE PROFILE](#)

Some of the authors of this publication are also working on these related projects:



Edge Detection in Prostate PSMA Images [View project](#)



Decoding categorical sequences [View project](#)

All content following this page was uploaded by **Michael Henschel** on 20 May 2014.

The user has requested enhancement of the downloaded file.

SHIP DETECTION IN RADARSAT SAR IMAGERY *

Qingshan Jiang [†] Shengrui Wang, Djemel Ziou, Ali El Zaart
Department of Mathematics and Computer Sciences
University of Sherbrooke
Sherbrooke, P.Q., J1K 2R1, Canada

Maria T. Rey
Defence Research Establishment Ottawa
3701 Carling Ave., Ottawa, Canada K1A 0Z4

Goze Bertin Béné
Centre d'applications et de recherches en télédétection
University of Sherbrooke
Sherbrooke, P.Q., J1K 2R1, Canada

Michael Henschel
Satlantic Incorporated
3295 Barrington Street, Halifax, Canada B3K 5X8

ABSTRACT

An automatic detection model for ship targets in RADARSAT SAR images is being developed by using statistical methods, Radon transform and other image processing techniques. This paper presents current progress made on the detection model.

Keywords: *K-distribution, Morphological filter, Radon transform, Ship target detection*

1. INTRODUCTION

There have already been considerable works done on ship and other target detection in a radar clutter background (see [6, 9, 10, 11]). In general, ships are identified in the SAR imagery as very bright features because of the corner reflection. In reality, with an appropriate choice of threshold, all visible ships to human eye can be detected. A statistical algorithm for quantifying RADARSAT SAR's ship detection has been proposed by Rey *et al* (see [9, 10]). The Constant False Alarm Rate (CFAR) technique has been used to improve ship target detection performance. The initial ship detection algorithm in the *Ocean Monitoring Workstation* (OMW) is CFAR algorithm based on K-distribution statistical fits, which was developed jointly by the *Defence Research Establishment Ottawa* (DREO) and the *Canada Centre for Remote Sensing* (CCRS).

Our project is an important part of a CRSNG-CSA-Industry research program on the use of Canadian RADARSAT imagery for coastal surveillance. The purpose of this project is detection of ships in RADARSAT SAR imagery by using statistical methods, Radon transform and other image processing techniques. The detection model developed is a modification made on the initial algorithm in [9]. The main

work is combination of the Radon transform technique and the K-distribution model to reduce false alarms and the computational time. In this paper, we will describe our detector model for ship targets in SAR images and show two experimental results based on the model.

2. DETECTION ALGORITHM

The basic structure of the detection algorithm is summarized in Figure 1. Different procedures are discussed accordingly in subsequent sections.

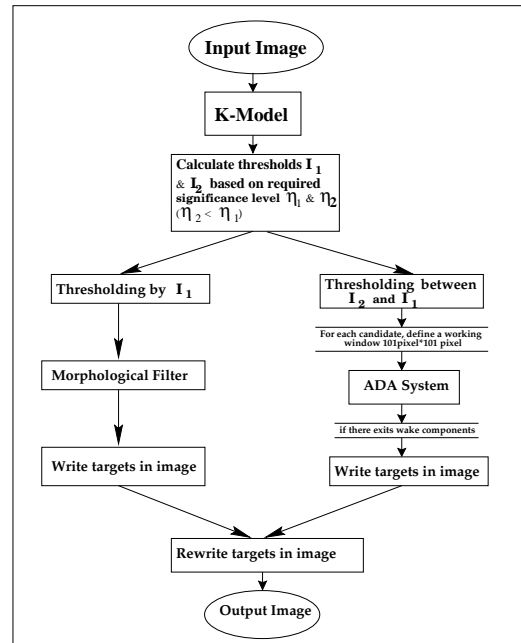


Figure 1: The flow diagram for ship target detection procedure

2.1. K-distribution Model

*This research work was specially financed by the NSERC-CSA-SSIG and the Industrial Partner Satlantic Inc

[†]Corresponding author. E-mail: jiang@dmi.usherb.ca

In our research work, we still use the multi-look intensity K-distribution to describe the probability density function (pdf) of RADARSAT SAR image intensity (see M. Rey [9]):

$$p(x) = \frac{2}{x\Gamma(\nu)\Gamma(L)} \left(\frac{L\nu x}{\mu}\right)^{\frac{L+\nu}{2}} K_{L-\nu} \left(2\sqrt{\frac{L\nu x}{\mu}}\right)$$

where μ is the image intensity mean, ν is a shape parameter, L is the number of statistically independent looks, Γ is the gamma-function, and $K_{\nu-L}$ is the modified Bessel function. The theoretical expressions for mean and variance are as follows:

$$E[x] = \mu$$

and

$$Var(x) = \left[\left(1 + \frac{1}{\nu}\right) \left(1 + \frac{1}{L}\right) - 1 \right] \mu^2 \quad (1)$$

where E is the expectation and Var the variance operator.

The considered density function may be completely specified by the image mean, the number of independent looks, and the order shape. The main problem here is how to estimate these parameters. The number of statistically independent looks in a SAR image is an essential parameter for determining the speckle level in the image. The number of looks L can be either specified by the SAR processor or estimated using statistical methods (see [13]). In our model, for a given data sample sequence $\{x_i\}_{i=0}^N$, we propose to estimate the look number L by

$$\hat{L} = \left\lceil \frac{\left(\frac{1}{N} \sum_{i=1}^N x_i\right)^2}{\frac{1}{N-1} \sum_{i=1}^N \left(x_i - \frac{1}{N} \sum_{i=1}^N x_i\right)^2} \right\rceil$$

based on the condition of $\nu > 0$ and the equation (1). Meanwhile, the parameter estimates of the mean and shape parameter using the first approach of Blacknell (see [3]) can be obtained from the equations:

$$\hat{\mu} = \frac{1}{N} \sum_{i=1}^N x_i$$

and

$$\left(1 + \frac{1}{\hat{\nu}}\right) \left(1 + \frac{1}{\hat{L}}\right) = \frac{\frac{1}{N} \sum_{i=1}^N x_i^2}{\left(\frac{1}{N} \sum_{i=1}^N x_i\right)^2}.$$

To examine that K-distribution is a suitable probability density function (pdf) for RADARSAT ocean scenes (see [2]), we use the mean-squared error as a goodness-of-fit test. i.e.,

$$\text{Error} = \frac{1}{256} \sum_{i=0}^{255} (h(i) - p(i))^2 \quad (2)$$

where $h(i)$ is the histogram of original image.

2.2. Radon Transform Technique

The Radon transform accentuates linear features in an image by integrating image intensity along all possible lines in an image. This transform is commonly used in algorithms for detecting linear features in an image even in the presence of noise. The Radon transform can be defined as:

$$\check{f}(\rho, \theta) = \int_D \int f(x, y) \delta(\rho - x \cos \theta - y \sin \theta) dx dy$$

where D is the entire x - y image plane, $f(x, y)$ is the image intensity (gray level) at position (x, y) , δ is the Dirac delta distribution, ρ is the length of the normal from the origin to the straight line, and θ is the angle between the normal and x -axis.

Details regarding the Radon transform is given in M. Rey [8] and Jiang *et al* [1]. In general, an automatic detection algorithm (ADA) developed using the Radon transform involves three consecutive processes: *pre-processing*, *Radon transform*, and *post-processing*. Here we propose to apply the Radon transform by integrating image intensity along all lines starting from the centre of each ship candidate.

2.3. Ship Target Detection Performance

The algorithm starts with testing the suitability of the intensity K-distribution. When the error calculated by the equation (2) is less than a given value α (usually $\alpha = 0.05$ is selected), we determine a threshold, I_c , by the solution to

$$\eta_c = \int_0^{I_c} p(x) dx \quad (3)$$

where $p(x)$ is a pdf with K-distribution and η_c represents the required significance level. This significance level corresponds to a constant false alarm rate (CFAR) of $(1 - \eta_c)$ for the pdf of intensity. Our ship detector model is divided into two parts (Figure 1):

The first part is used to identify almost all visible ship targets in a SAR image. Presently, it uses a

threshold I_1 which corresponds to a significance level η_1 (usually $\eta_1 = 0.995$ is selected) in the equation (3) to identify possible pixels and, after that, a morphological filter is applied to eliminate those false ship pixels. The morphological filter is a logical filter which pertains to the structure and shape of objects (see Lin [6]). The filter is a 7 by 7 moving window. Each image pixel is examined by placing in the filter centre. The filter then examines the 48 neighbouring pixels. If more than 7 neighbouring pixels are possible ship pixels, the centre pixel is considered as a true ship pixel.

The second part is mainly to refine some ship targets by using simple thresholding and Radon transform techniques. In fact, we first identify some pixels which have the image intensity between I_1 and I_2 that corresponds to another significance level η_2 (usually $\eta_2 = 0.95$ is selected) and, for each ship candidate, a Radon region (typically 101 pixel square) centred at the ship center is defined for detecting the corresponding ship wake. If there exist wake components, then we will take this candidate as a ship target, otherwise those false ship pixels will be removed.

3. EXPERIMENTAL RESULTS

The model developed is tested on a number of SAR images. The detection results are promising. Two examples are shown in the following. Figure 2(b) presents a result of the detection by directly using

a threshold calculated by the equation (3). As can be observed in Figure 2(b), thresholding does not exclude some false ship pixels. Therefore, it is necessary to remove those false pixels by the morphological erosion. The Figure 2(c) is the result of ship target detection in the first part by using morphological filter. Meanwhile, this is also the final detecting result because there is no ship target in the second part by using simple Radon transform. The computational time for this SAR image (374*436 pixels), which is a subimage of the m0109452 provided by DREO, is only 4.2 seconds.

Figures 3 illustrates another experimental result using this model. There exist ship targets in both of two parts. For that SAR image (1121*730 pixels) in Figure 3(a), we only need 13.5 seconds to detect those ship targets shown in Figure 3(d).

4. CONCLUSION AND FUTURE WORK

We have demonstrated one possible method of automatic detection of ships in RADARSAT SAR imagery. Further development is on the way to improve the applicability of our model and to reduce the computational time and false alarms. On the other hand, some experimental results have shown that K-distribution does not always give a good fit. Therefore, it is necessary to choose a new statistical model instead of K-model. There are many statistical models to be used to describe the distribution of SAR image intensities.

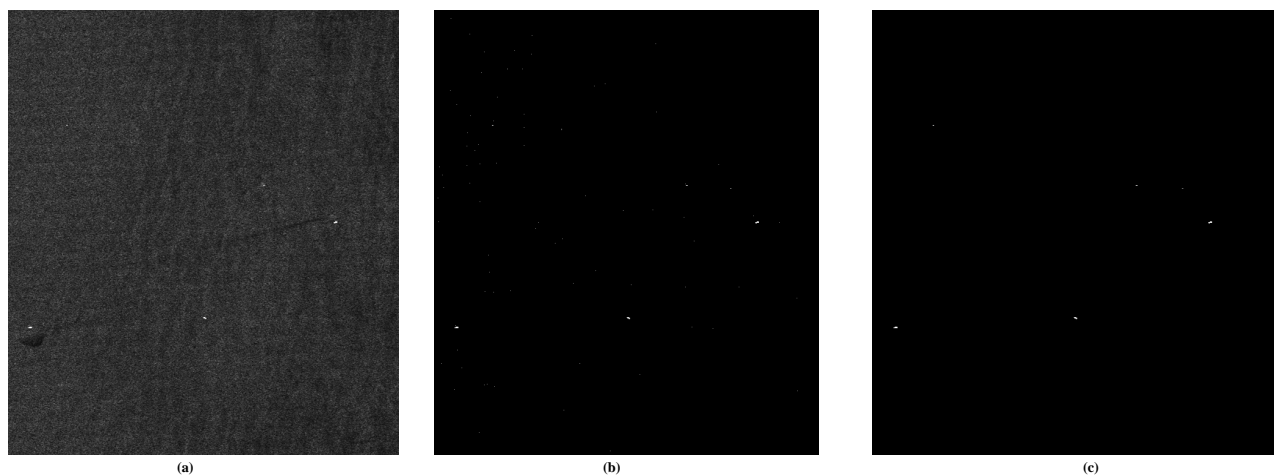


Figure 2: (a) Original image, (b) result using threshold I_1 , and (c) result using morphological filter

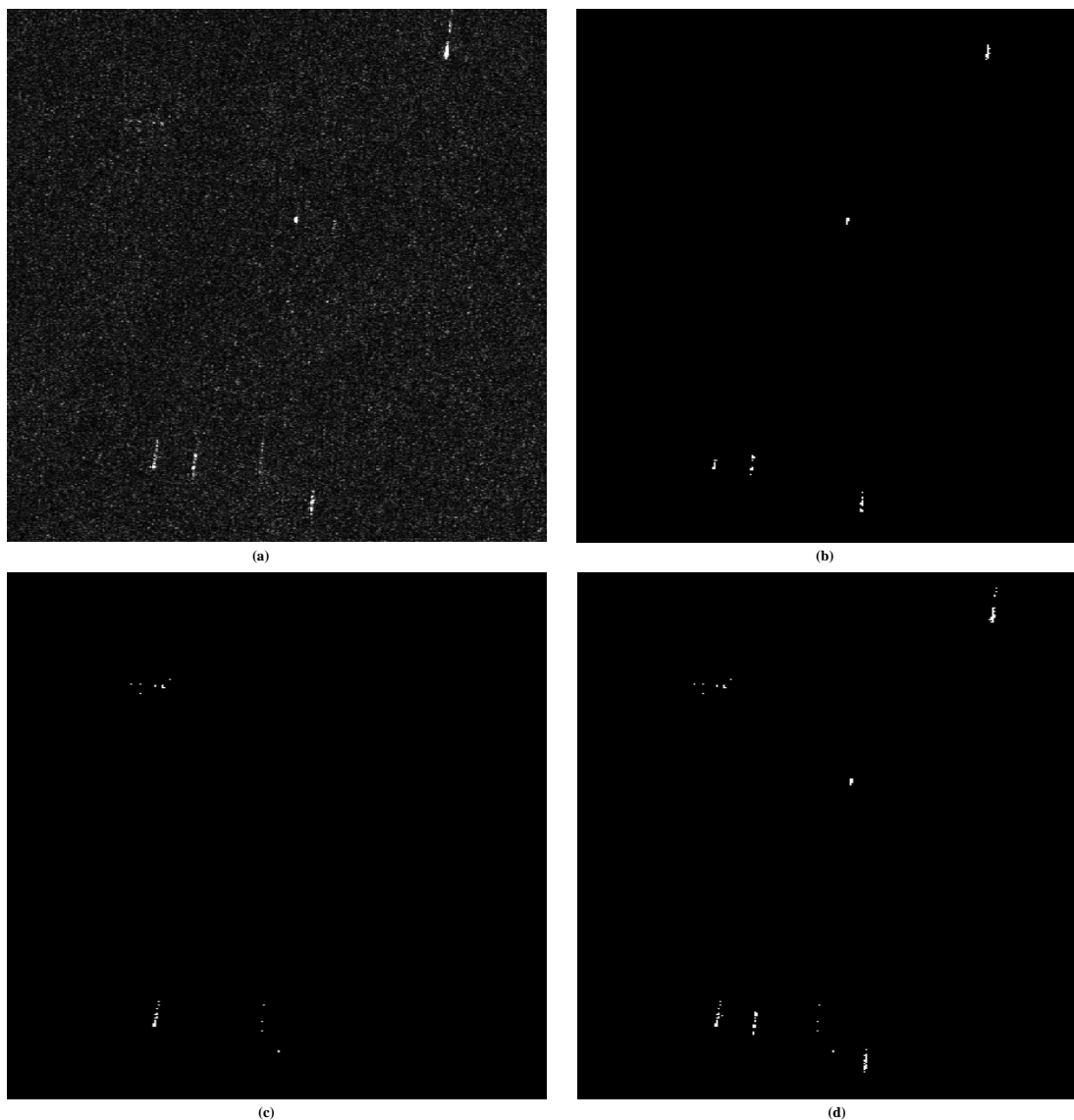


Figure 3: (a) Original image (a subimage of m0114461), (b) result in first part, (c) result in second part, and (d) the final detection result

In our future research work, for example, we will try to use a probabilistic neural networks statistical model (PNN-model) (see [14]) because this model usually makes an excellent fitting for the intensity of SAR imagery.

5. ACKNOWLEDGMENT

The authors acknowledge the Natural Sciences and Engineering Research Council (NSERC), and industrial partners such as Canadian Space Agency (CSA), SSIG Holdings Limited and Satlantic Inc. who provided financial support. The authors thank Dr. Lotfi

Ben Romdhane and Dr. Li Wei for their valuable suggestions and technical support. And also, thanks to Dr. K. Eldhuset and Dr. Lin I-I very much for having sent us many of their research papers.

References

- [1] Jiang Q., S. Wang, D. Ziou, G. B. Béné, and Ali El Zaart, "Application of Radon transform to ship detection in SAR imagery" *Technical report, University of Sherbrooke* (in preparation) 1998.

- [2] Jiang Q., S. Wang, D. Ziou, G. B. Béné, and Ali El Zaart, "K-distributed Model for the Statistics of RADARSAT Imagery" *Technical report, University of Sherbrooke* (in preparation) 1998.
- [3] Blacknell D., "New method for the simulation of correlated K-distributed clutter", *IEE Proc.-Radar, Sonar Navig.*, Vol. 141, No. 1 (1994) pp53-58.
- [4] Echard Jim D., "Estimation of Radar detection and false alarm probabilities", *IEEE Transactions on Aerospace and Electronic Systems* Vol. 27, No. 2 (1991) pp255-260.
- [5] Jakeman E., "Generalized K distribution: a statistical model for weak scattering", *J. Opt. Soc. Am. A*, Vol. 4, No. 9 (1987) pp1764-1772.
- [6] Lin I-I, L. K. Kwok, Y. C. Lin, and V. Khoo, "Ship and ship wake detection in the ERS SAR imagery using computer-based algorithm", *IGARSS'97*.
- [7] Olive C. J., "Correlated K-distributed clutter models", *Optica Acta* , Vol. 32, No. 12 (1985) pp1515-1547.
- [8] M. Rey, J. K. E. Tunaley, J. T. Folinsbee, P. A. Jahans, J. A. Dixon, and M. R. Vant, "Application of radon transform techniques to wake detection of Seasat-A SAR images", *IEEE Transactions on Geoscience and Remote Sensing* Vol. 28, No. 4 (1990) 553-560.
- [9] Rey M. T., T. Drosopoulos, and D. Petrovic, "A search procedure for ships in RADARSAT imagery" *DREO Report No. 1305*, 1996.
- [10] Vachon P. W., J. Campbell, C. Bjerklund, F. Dobson, and M. Rey, "Ship detection by the RADARSAT SAR: Validation of detection model predictions", *Canadian Journal of Remote Sensing*, Vol. 23, No. 1 (1997) pp48-59.
- [11] K. Eldhuset, "An automatic ship and ship wake detection system for space-borne SAR images in coastal regions", *IEEE Transactions on Geoscience and Remote Sensing* Vol. 34, No. 4 (1996) 1010-1019.
- [12] Conte E., M. Lops, and G. Ricci, "Radar detection in K-distributed clutter", *IEE Proc.-Radar, Sonar Navig.* Vol. 141, No. 2 (1994) pp116-118.
- [13] S. Foucher, G.B. Béné, and J. Boucher, "Maximum likelihood estimation of the number of looks in SAR images", submitted to *IEEE Transactions on Geoscience and Remote Sensing* (1997).
- [14] E. Aitnouri, S. Wang, and D. Ziou, "Estimation of a multi-modal histogram's pdf by a mixture Gaussians", *Technical report, University of Sherbrooke* (in preparation) 1998.
- [15] Y. Delignon, R. Garelo, and A. Hillion, "Statistical modeling of ocean SAR images", *IEE Proc.-Radar, Sonar Navig.*, Vol. 144, No. 6 (1997) pp348-354.