



1 *Conference Proceedings Paper*

2 **Satellite-based identification of Aquaculture Farming**
3 **using Neural Network Method over Coastal Areas**
4 **around Bhitarkanika, Odisha**

5 **Sumedha Surbhi Singh¹ and Dr. Bikash Ranjan Parida¹**

6 Center for Land Resources Management, School of Natural Resource Management, Central University of
7 Jharkhand, Ranchi, Jharkhand—835205, India.

8 ¹sumedhasurbhi78@gmail.com

9 bikash.parida@cuja.ac.in

10

11 **Abstract:** Aquaculture is the farming of fish, crustaceans, molluscus, aquatic plants, algae, and
12 other aquatic organisms. Aquaculture farming in coastal areas of India plays key role in economy,
13 which contributes 1. % of GDP. In Odisha, aquaculture system exports 26% of its products to foreign
14 countries. Artificial neural networks have a feature of pattern recognition, which uses training
15 dataset to identify pattern of any feature from satellite images. The term pattern recognition
16 considers a wide range of information and processing problems of great practical significance. This
17 study have been carried over two coastal districts namely, Bhadrak and Kendrapada in Odisha state.
18 Here, Landsat-8 satellite data (OLI sensor) has been used and training sites have been generated.
19 The pattern recognition feature of neural network have been used to extract aquaculture features
20 from satellite image. We have analyzed the area that have been converted to aquaculture from 2002
21 to 2017 using the neural network classification. There was two-fold increase in aquaculture activities
22 from year 2002 to 2017 in the two coastal districts. The increases in aquaculture activities indicated
23 that aquaculture plays important role in socio-economic developmental of coastal people.

24 **Keywords:** - Artificial neural network; Pattern recognition; Aquaculture

25

26 **1. INTRODUCTION**

27 With the burgeoning coastal population in India, food demands have been increased over the
28 years. Sea food is very popular in coastal regions and to meet the demand, aquaculture systems were
29 growing very fast. Aquaculture was used to produce food and other commercial products that were
30 extracted from fishes, prawns, shrimps, mussels, and other marine life. There are two types of
31 aquaculture- marine and freshwater. The Marine aquaculture focuses on the production of shrimps,
32 fishes, mussels, oysters, and seaweeds. India has a coastline of 7,517 km, therefore, it has huge
33 potential for marine aquaculture. In India, the annual fisheries and aquaculture production has
34 increased from 0.75 million tonnes in 1950-51 to 9.6 million tonnes in 2013-14 [1] with regard to annual
35 fisheries and aquaculture production, India stood second next to China [1]. Over 10% of the global
36 fish diversity can be found over the Indian subcontinent and >14.5 million people depend on fisheries
37 activities for their livelihood. The total export value of aquaculture products in 2015-16 was over 4.7
38 billion euros [2].

39 Artificial neural network is a computing system, which was designed after the operation of
40 neurons in human brain. Neural networks were used for complex signal processing or image
41 recognition [3]. Examples of commercial use of neural network were handwriting recognition, speech
42 to text transcription, oil exploration, data analysis, and facial recognition. As humans recognize any

43 object through their experience, computers also have capability to identify any object based on its
44 example data set. This feature is called pattern recognition and used for computer vision [4].
45 Computer understands the pattern of pixels in example data set and then recognize the object from
46 other images.

47 The satellite images and the extracted thematic maps provide higher level information to
48 recognize, monitor, and management of resources [5]. Image classification depends on the spectral
49 characteristics of feature. It is important to refine techniques to improve the accuracy of image
50 classification for deriving land use and land cover maps [6]. Popular methods of satellite image
51 classification are mainly based on digital value of example data set. Neural Network classification
52 method typically based on digital values as well as their pattern. River, ocean, lagoon, and
53 aquaculture all these features give similar reflectance in satellite image, the only difference between
54 all these features was aquaculture, which has regular geometrical shapes. Other features such as river,
55 ocean, etc. were usually irregular pattern.

56 Odisha is a coastal state of India with a coastline of 480.4 km. There are 13 ports and 57 fish
57 landing centers in Odisha [7]. Bhadrak and Kendrapara districts were in coastal regions, wherein
58 aquaculture practices were increasing rapidly over the last two decades. These activities are one of
59 the major source of income of middle-class people. Foreign export of these products makes this
60 activity even more profitable, while the risk component may not be neglected. As Odisha government
61 is promoting aquaculture practices via 'Fish Pond Yojna', people have started aqua farming [8]. The
62 main objective of this study are to extract aquaculture from multi-spectral satellite images based on
63 neural network classification method and to estimate the dynamics of land use and land cover
64 changes owing to aquaculture.

65 2. STUDY AREA & DATA USED

66 The study area comprises the two coastal districts (Bhadrak and Kendrapara) of Odisha, India.
67 Bhadrak district is located between 21°0'N to 20°59' N & 86°17'E to 86°53' E. Its area is 2,505 km².
68 Its population is 1,506,522 and population density is 601 per km². Dhamra port is located on the banks
69 of river Baitrani. Kendrapara district is located between 20°20' N to 20°37' N & 86°14' E to 87°01'
70 E. Its area is 2,644 km². Total population there is 1,439,891 and population density is 492.38 per km².
71 Bhitarkanika National Park is also there. It is a famous tourist place in Odisha. The location of
72 Bhadrak and Kendrapara district are shown in Figure 1.

73 The Landsat 7 ETM+ and Landsat-8 images were obtained from USGS
74 (www.earthexplorer.usgs.gov). The ETM+ images are acquired for the year 2002 while the landsat-
75 8 OLI images were used for the year 2017. Landsat 7 has six spectral bands in the visible to SWIR
76 range with the spatial resolution of 30 m and temporal resolution of 16 days. It has two sensors: OLI
77 (Operational Land Imager) and TIRS (Thermal Infrared Sensor). It has eleven bands with Visible to
78 SWIR bands having spatial resolution of 30 m and temporal resolution of 16 days.

80 Table 1: Details of Data used and the corresponding path and row
81

Details	Year 2002		Year 2017	
Data Acquisition	16-12-2002	29-10-2002	04-03-2017	04-03-2017
Path	139	139	139	139
Row	45	46	45	46

82

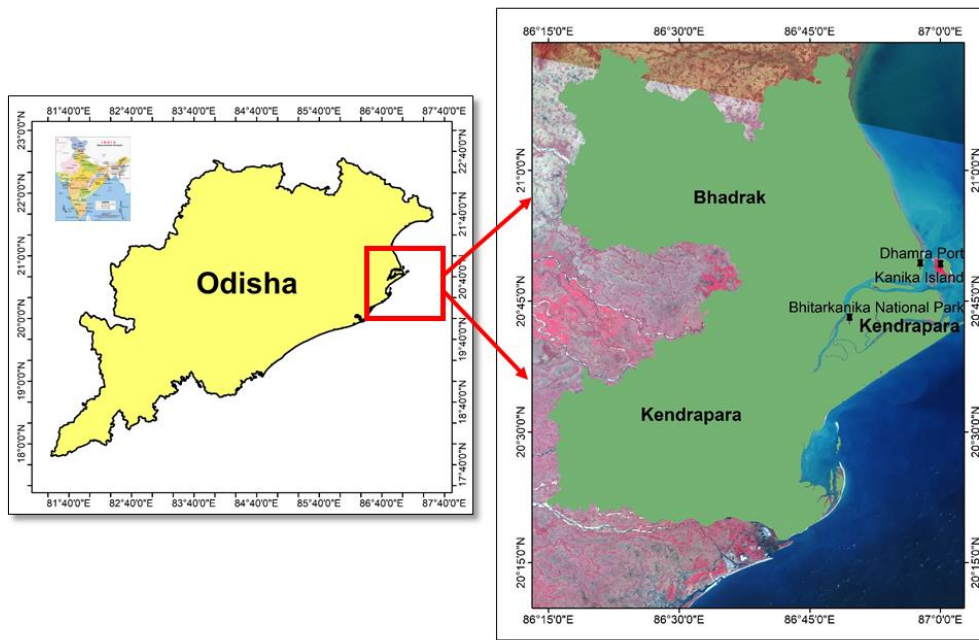


Figure 1: The location map of two coastal districts, namely, Bhadrak and Kendrapara in the state of Odisha, India

84 **3. METHODOLOGY**

85 To view changes between 2002 and 2017 Landsat satellite imageries have been used. Two tiles
 86 of Landsat images were downloaded for each year and further they were mosaicked using the image
 87 processing software. The flow chart of methodology has been shown in Figure 2. Firstly, the
 88 radiometric calibration performed by applying FLAASH settings in ENVI for four bands i.e. blue,
 89 green, red & NIR band. Then dark pixel subtraction was performed to eliminate the effect of
 90 atmospheric scattering. This is an atmospheric correction method as dark objects include a substantial
 91 component of atmospheric scattering. Neural network (NN) classification tool in ENVI software was
 92 used to classify the image into five classes, namely Aquaculture, River, and ocean, Mangrove, Wet
 93 land, and other remaining features. The NN technique has used the standard backpropagation
 94 method for classification. More attention was given towards the ROI selection for aquaculture and
 95 river class. The classified images were used for area calculation for each class. The Accuracy
 96 assessment has been performed with the help of Google Earth Images.

97

Table 2 Specifications of neural network classifications

Parameter	Value
Training threshold contribution	0.900
Training rate	0.2
Training RMS exit criteria	0.1
No. of hidden layers	1
No. of training iterations	1000

98

99

100
 101

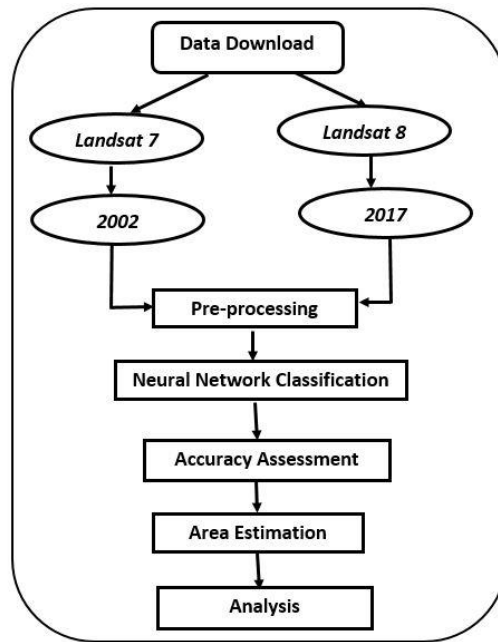


Figure 2: Methodology showing the detailed steps used in NN classification.

102 **4. RESULTS & DISCUSSION**

103 The satellite images were classified into five major classes using the NN method. The classified
 104 maps were shown for years 2002 and 2017 in Figure 3. Results indicate that there was increase in
 105 mangrove area over the period 2002 to 2017. Since there is abundance of other vegetation in 2002,
 106 mangrove area has been classified as others. Aquaculture have increased from 20.76 km² in 2002 to
 107 44.86 km² in 2017.

108 Table 3 area statistics for different land use and land cover classes for years 2002 & 2017

Type	2002		2017	
	Area(in km ²)	Percentage (%)	Area(in km ²)	Percentage (%)
Aquaculture	20.76	0.36	44.86	0.79
River	832.37	14.68	863.19	15.23
Wet land	135.92	2.38	100.63	1.77
Mangrove	155.10	2.74	212.16	3.74
Others	4523.91	79.81	4447.28	78.46

109

110 Table 4 Accuracy assessment of classified maps for the years 2002 and 2017.

Type	2002		2017	
	Percentage (%)	Kappa	Percentage (%)	Kappa
Aquaculture	77.4	0.72	86.1	0.82
River	88.6	0.84	87.1	0.84
Mangrove	79.4	0.74	85.7	0.82

Wet land	75.0	0.74	85.7	0.83
Others	80.9	0.74	82.6	0.76
Overall	81.2	0.75	85.2	0.81

111

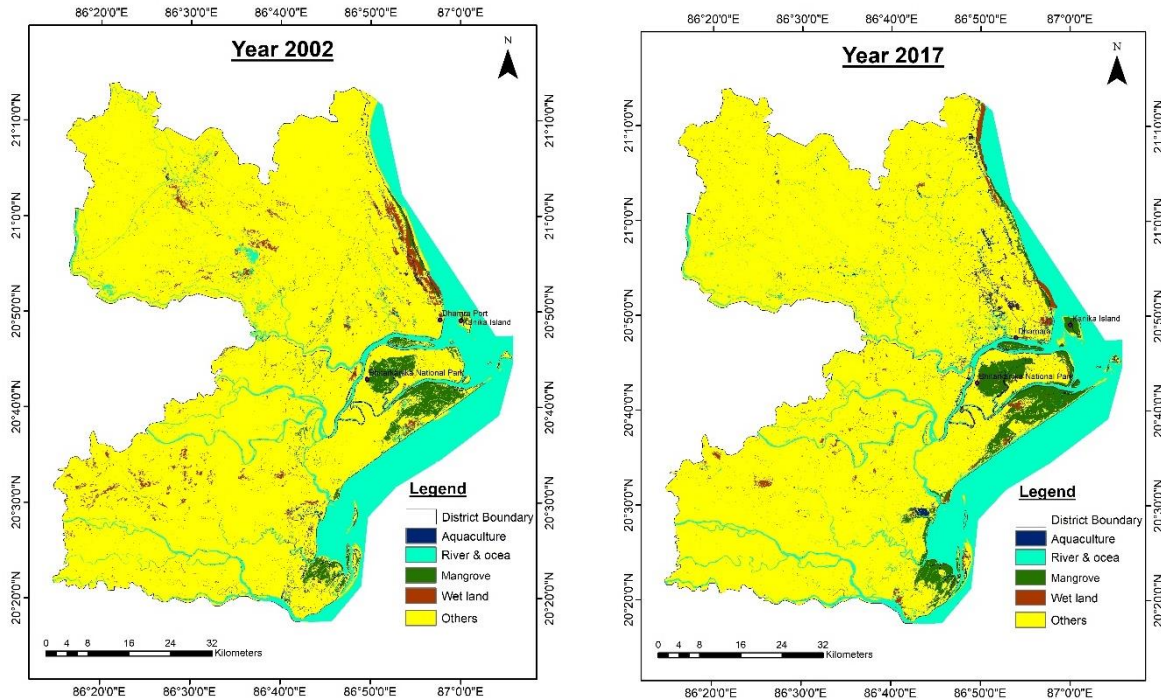


Figure 3: Classified maps of land use and land cover for Bhadrak and Kendrapara districts for the years 2002 & 2007

112

113 The Area under aquaculture have increased from 0.36% to 0.79% over 15 years. The increase in
 114 aquaculture was about two-fold. There was large increase in aquaculture activities in Bhadrak district
 115 compared to Kendrapara.

116 The overall accuracy of classification in year 2002 was 81.2% and accuracy of classification of
 117 year 2017 image was 85.2%. Accuracy of aquaculture is 77.4% in year 2002 as the aquaculture class
 118 were classified as river because of the signature of water was same for both river and aquaculture.
 119 Accuracy of aquaculture increases up to 86.1% in 2017. Wide streams and ocean are accurately
 120 classified but narrow streams are classified into some other classes. Kappa value for 2002 classified
 121 image is 0.75 and for 2017 the value is 0.81.

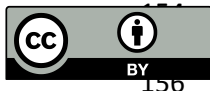
122 **5. CONCLUSION**

123 Neural network (NN) classification method has been very helpful in delineation of aquaculture.
 124 Other popular classification methods such as nearest neighborhood, parallel piped methods won't
 125 give satisfying accuracy, while classification of similar reflectance features. The NN classification
 126 method has given up to 86% accurate results, when it comes to extraction of aquaculture. There was
 127 a problem with narrow streams and thus the higher resolution satellite images may resolve these
 128 errors. The NN method takes more time for training but when it comes to differentiation between
 129 similar textured features when only shape or pattern is different, this method gives satisfying results.

130 There was increase in aquaculture up to two-fold 216.08% over the years 2002 to 2017. Remote
 131 sensing and GIS have been very helpful in estimating the increase in aquaculture.

132 **References**

- 133 1. FAO 2014 National Aquaculture Sector Overview India, p. 1; Ministry of Agriculture, Departments of
134 Animals Husbandry, Dairying and fisheries 2014. Handbook on fisheries Statistics 2014, p. 5.
135 2. Jelte de Jong, 2017, Aquaculture of India
136 3. Artificial Neural Network from www.technopedia.com, Retrieved on 9/11/2017
137 4. John Peter Jeason, 2004, The neural approach to pattern recognition. From ACM digital library, vol.2004
138 from <http://ubiquity.acm.org> retrieved on 13/11/2017.
139 5. Boshir Ahmed, Md. Abdullah Al Noman, 2015, Land cover classification for satellite images based on
140 normalization technique and Artificial Neural Network, IEEE, DOI-10.1109/CCIE.2015.7399300
141 6. N.A.Mahmon, Norsuzill Ya'acob, 2014, A review on classification of satellite image using Artificial Neural
142 Network (ANN), IEEE, DOI-10.1109/ICSGRC.2014.6908713.
143 7. Ramesh, R., Purvaja, R and Senthil Vel, 2011, A Shoreline change assessment for Odisha coast
144 8. Odisha Fisheries policy, 2015, from investodisha.gov.in, retrieved on 10/11/2017
145 9. J.S.J. Wijesingha , R.W.D.M. Kumara, P. Kajanathan, R.M.K.G.S.P.B. Koswatte, K.R.M.U. Bandara, 2012,
146 automatic road feature extraction from high resolution Satellite images using LVQ neural networks, 33rd
147 Asian Conference on Remote Sensing
148 10. Tim Kang, 2015, Using Neural Networks for Image Classification, Part of Artificial intelligence and
149 Robotics commons from: http://scholarworks.sjsu.edu/etd_project
150 11. T.K. Sharma, N. S.S. Babu, Y.N. Mamatha, Satellite image feature extraction using neural network
151 technique, Part of Advances in intelligent Systems and computing, vol.174, pp 101-106
152 12. Michael Nielson, 2017, Chapter2, How backpropagation algorithm works, from
153 www.neuralnetworksanddeeplearning.com



© 2017 by the authors; licensee MDPI, Basel, Switzerland. This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC-BY) license (<http://creativecommons.org/licenses/by/4.0/>).