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PEDESTRIAN DETECTION IN INFRARED IMAGES: INTERVAL VALUED REPRESENTATION BASED APPROACH

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ABSTRACT

The evaluation in the cost of infrared cameras opens a new platform for attacking many untouched vision problems. This article proposes a novel method of representing infrared images by the use of edgelet features for object recognition application. The proposed technique makes use of interval valued representation for edgelet features of the infrared images. A scheme of identification of the objects based on the proposed features extraction and representation model is also designed. Hence the features are transformed in interval valued representation, the proposed model drastically reduces the dimension of the feature space which in turn reduces the computational time for object recognition in the infrared images. Further an extensive experimentation is conducted on publically available datasets. The result of the experiments tells us that the proposed algorithm outperforms for the state of the art technique. However, the main advantage of the proposed technique is that it takes relatively a less time for identification as it depends on a simple matching strategy.

Keywords: Object recognition, infrared images, interval valued representation.

1. INTRODUCTION

Pedestrian detection is one of the most important applications of computer vision which has several applications like Advanced Driver Assistance Systems (ADAS). In recent year there are plenty of algorithms were developed for efficient detection of pedestrians using image processing algorithms. Pedestrian detection is considered as one of the real time problem which requires efficient algorithms to solve these issues in uncontrolled environments like day time, evening time and in limited sun light. To tackle this, common cameras are not compatible because of the lack of capacity to capture the images in the night time. This article addresses the problem of detecting pedestrians in dull sun light or in night time using infrared camera. Detection of pedestrians in night time will open up new application for addressing security issues in the absence of sun light. In most of the applications we expect that security cameras or surveillance camera systems should work on an around the clock basis. Normal cameras which produce images in visible spectrum are not effective in the absence of natural light. Even though some solutions are there for such problems like morning time natural illumination and night time artificial illumination arrangement for the camera, but these solutions are not practically advisable. Also these solutions have limitations like shadow in the morning or day time. As a result, system may fail in capturing and identifying objects in the dark areas of the current environment. One of the solutions for such problems is usage of Infrared IR cameras instead of visible spectrum cameras. Infrared (IR) cameras are ideally suited to applications which require functioning at the night time and also in the dark light. [25-26]

This research article presents a method for detecting pedestrian in the dark sun light or dull light using infrared camera. The proposed approach consists of different stages like feature extraction, knowledge base construction stage and pedestrian detection stage. The details of the proposed algorithm are present in the respective section of the paper.

The rest of the paper is organized as follows. In section 2 a brief literature survey is presented. In section 3 we present the proposed model for object recognition in infrared images. Section 4 discusses about experimentation and comparative analysis performed on the proposed models. Paper will be concluded in section 5.



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2. LITERATURE SURVEY

This section presents a detailed literature survey of the feature extraction techniques for object recognition. Since this article focuses on the object recognition in the infrared images, we restrict our study to feature extraction of conventional object recognition approaches and few works on infrared images. The main aim of object recognition is to locate and identify instances of an object from an image with the help of features extracted from the images.

In literature most of the works on feature extraction techniques are classified into two categories like edge-based type and patch based feature types. From the survey it is clear that some approaches use combination of edge-based type and patch based feature type [1-5].

Edge Based Approaches

This method uses the edge map of the image and identifies the objects in the image in terms of edges [1, 2, 6-7]. Considering edges as features is advantageous because of many reasons, as they are largely invariant to illumination conditions and variations in objects' colors and textures. They also represent boundaries of the object well and represent the data efficiently in the large spatial extent of the images [6]. The main two deviations in these techniques are: use of the complete contour (shape) of the object as the feature [8-13] and use of collection of contour fragments as the feature of the object [1, 2, 6, 14-20]. Figure 2 shows an example of complete contour and collection of contours for an image.

Hamsici [8] the whole shape of the contour of the edges to get a foothold in the recognition of a set of points of contact between them. Schindler [12] considered the super-pixels, such as segmentation based approaches. They are considered to be close to the contours of the surrounding areas from the very beginning to get the contours of the closure. Ferrari [17] at the edges of the object detection offers the best of contemporary methods used in the most advanced edge detection method. After the closure of the contours of the edges to form a network connected across the small gap between them. [15] Ren is significantly more difficult because of the presence of background information in the natural images; the contours of the objects are used to complete a triangulation. All of these techniques require additional computation intensive treatment and are often sensitive to the choice of a variety of practical outlining parameters of note. The other problem with such a feature for testing and validation of images, is available to match the contours of even an incomplete image and therefore the entire contour of the degree is generally low [11].

Patch Based Approach

The patch based feature extraction approach has been in use since more than two decades [21], and edge-based features are relatively new in compared patch based technique. Moravec [21] considered local maxima of minimum intensity gradients, he called it as corners and selected a patch around these corners. This work is enhanced by Harris [22], which made the new detector less sensitive to noise, edges, and anisotropic nature of the corners proposed in [21]. In its regular form, such as the features of the object templates [23] in order to use the same size of a rectangular or square in local areas. Such features are effective for multi-scaling (the appearance of a variety of material). The following may not be suitable due to the size of the fixed patch. The size of the patch is small, it is big but may not cover the most important local feature. Such a feature is a short list of information may be lost. The size of the patch is large on the other hand, it may not be present simultaneously with other images or more than one separate covers. Another shortcoming of many small rectangular patches needs to be overcome in order to assess the attributes and the material. Both of these are computationally expensive and memory intensive. The images have a variety of features such as robustness, use of smaller or larger features, better and faster learning capabilities, and requiring less storage [24].

3. PROPOSED METHODOLOGY

This section presents the details of the proposed model for Pedestrian detection using supervised learning algorithm. The proposed model can be seen as different modules like interval valued representation stage and pedestrian detection stage.



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Interval valued Representation of Features

The proposed interval valued representation model is based on representing an object's description by edgelet features of the infrared images of a class in the form of symbolic data. An edgelet is a feature which is a short line segment or a curve present in the image which identifies the positions and normal vectors of the points in an edge by $\{U_i\}_{i=1}^k$ and $\{n_i^E\}_{i=1}^k$, k is the length of the edgelet. Given an input image I , denoted by $M'(p)$ and $n'(p)$ are the intensities of edge at position P of input image I . In practice, edge orientations are quantized and represented by $\{V_i^E\}_{i=1}^k$ and $V'(p)$ of the input image I respectively. A features sample of an object of a particular class suffers from intra class variations. An effective feature representation for capturing the variations of features samples through their assimilation by the use of interval valued representation called as symbolic feature vector is proposed.

Let $[Sp_1, Sp_2, Sp_3, \dots, Sp_n]$ be the set of n samples of class D_j , $j = 1, 2, 3, \dots, N$ (N denotes the number of classes (domains)) and let $Fp_i = [fp_{i1}, fp_{i2}, fp_{i3}, \dots, fp_{im}]$ be the m edgelet features of Sp_i of class Cd_j . The μ_{jk} , $k = 1, 2, \dots, m$ be the mean of k^{th} features and can be obtained from the following equation

$$\mu_{jk} = \frac{1}{n} \sum_{i=1}^n fp_{ik}$$

Standard deviation of the k^{th} feature and it is calculated using the following equation.

$$\sigma_{jk} = \left[\frac{1}{n} \sum_i (f_{ik} - \mu_{jk})^2 \right]^{\frac{1}{2}}$$

Now standard and mean deviation are considered in the identification of the intra class variations in k^{th} feature space of the j^{th} class and it is represented by interval valued feature representation as $[f_{jk}^-, f_{jk}^+]$ where

$$f_{jk}^- = \mu_{jk} - \sigma_{jk} \text{ and } f_{jk}^+ = \mu_{jk} + \sigma_{jk}$$

Now, these interval valued representation of the reference image of class Cd_j will be created by representing each in feature ($k=1, 2, 3, \dots, m$)

$$\{[f_{j1}^-, f_{j1}^+], [f_{j2}^-, f_{j2}^+], [f_{j3}^-, f_{j3}^+], \dots, [f_{jm}^-, f_{jm}^+]\}$$

Pedestrian Detection Stage

Pedestrian detection in infrared images presented in this work considers a query image which is described by the set of m crisp features, as they are the features of one sample of test image and are compared with the symbolic feature of the respective classes presented in the knowledgebase. Since the features are transformed into interval valued representation, the proposed model drastically reduces the dimension of the feature space which in turn minimizes the computational time for object recognition in the infrared images. So from this we can notice that the proposed edgelet features with interval valued out performs the state art techniques.

Let $F_{test} = [f_{t1}, f_{t2}, f_{t3}, \dots, f_{tm}]$ be the m -dimensional crisp features corresponding to a query image. During the object recognition, each k th feature value of the test image will be compared with the corresponding interval valued feature and examined whether the feature value of the test image lies within the corresponding interval. The number of features of a test image which fall inside the corresponding interval of the respective class will give the degree of similarity.

$$\text{Similarity (Test, Training)} = \sum_{k=1}^m \text{Sim}(f_{tk}, [f_{jk}^-, f_{jk}^+])$$

Here $[f_{jk}^-, f_{jk}^+]$ represents the k th feature interval of the j th class and it is defined as



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$$Similarity (Test, Training) = f(x) = \begin{cases} 1, & \text{if } (f_{tk} \geq f_{jk}^- \text{ and } f_{tk} \leq f_{jk}^+) \\ 0, & \text{otherwise} \end{cases}$$

- 1) Given a query image Sd_q , the class representative can be formed as explained in the previous sections which requires computation of $O(k.t+k)$. After creating the representative vector of a query image, we need to find out whether each representative value lies within the class interval or not. To compare with class it requires $O(2k)$ where k is the length of the representative vector. Therefore, to compare with all k classes it requires $k \times 2k$ computations and hence it is of $O(k.t+k+k^2)$

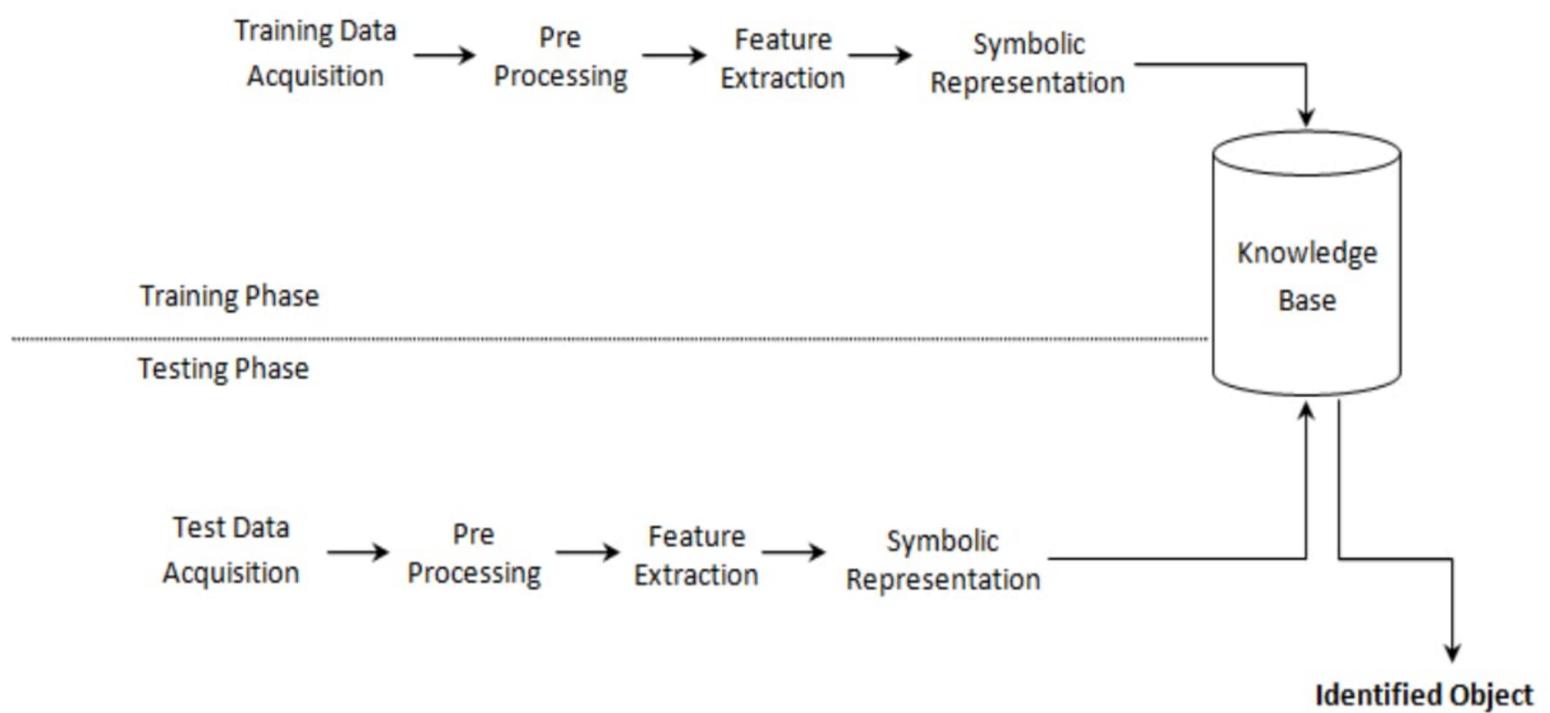


Figure 1 block diagram of the proposed approach

4. EXPERIMENTAL SETUP

This section presents the details of the experiments conducted to represent the effectiveness of the proposed method on publically available IR corpuses like OSU Thermal Pedestrian Database[28]. Two sets of experimentations are conducted where each set contains three different trails. In the first set of experiments, we have used 40% of the database for training and remaining 60 % is used for testing. In second set of experiments, we have used 60 % training and 40 % for testing [27]. In each trail we have randomly selected training and testing samples. For the purpose of evaluation of the results, we have calculated precision, recall and f-measure for each trail. The details of the experiments are shown in the following table1.

Table 1 : Result of the proposed method

Datasets	40% : 60%			60% : 40%		
	Precision	Recall	f Measure	Precision	Recall	f Measure
OSU Pedestrian Database	0.8421	0.8638	0.8528	0.8865	0.8921	0.8893

5. CONCLUSION

This article presents a novel method of representing infrared images by the use of edgelet features for object recognition applications. The proposed technique makes use of interval valued representation for edgelet features for identification of the objects in the infrared images. A method of identification of the objects based on the proposed edgelet features and interval valued representation model is also proposed. Since the features are transformed into interval valued representation, the proposed model drastically reduces the dimension of the



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feature space which intern reduces the computational time for object recognition in the infrared images. The proposed algorithm is critically analyzed on three publically available corpuses. Further an extensive experimentation is conducted on publically available datasets. Even though the proposed method requires minimum time for identification of objects in infrared images, result of the experiments tells us that the proposed algorithm outperforms the state of the art technique. However, the main advantage of the proposed technique is that it takes relatively a less time for identification as it depends on a simple matching strategy.

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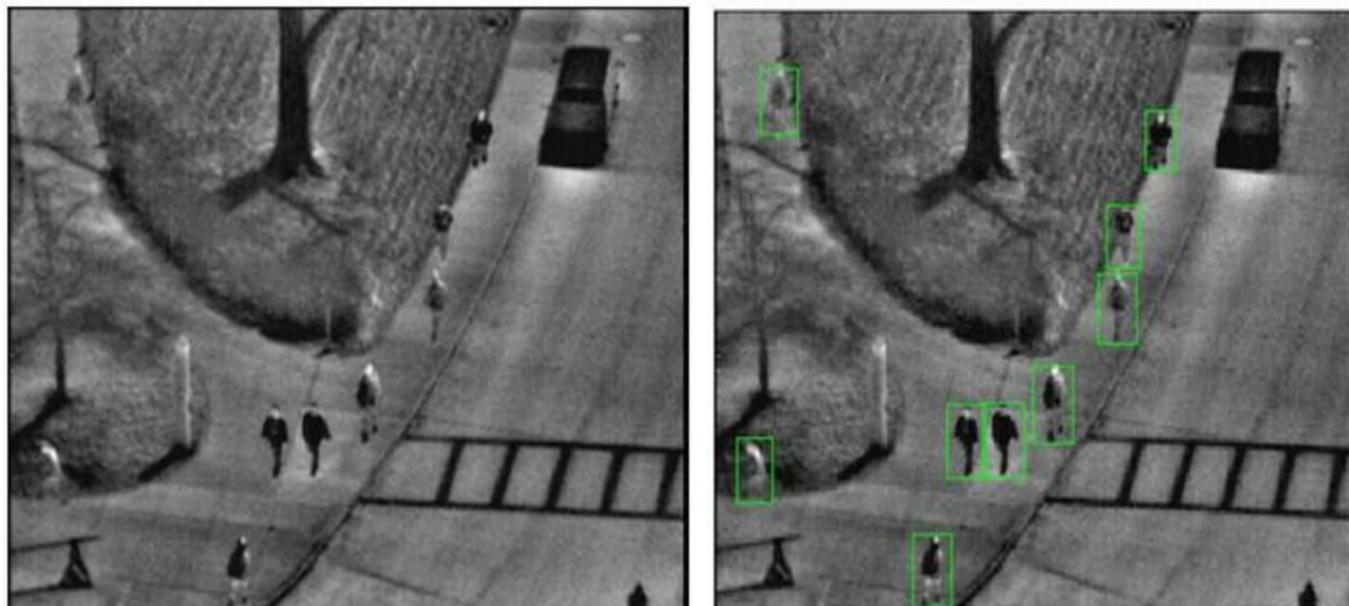


Figure 2: Output of the proposed approach