

Review on line detection of wood panel images

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Abstract. In industrial, the modern intelligent degree of board counting is relatively low. Some small manufacturers still count by hand, but for large factories, manual counting needs a lot of human resources, and the accuracy of counting is low. With the rapid development of modern intelligence, image recognition is becoming more mature, some traditional algorithms keep emerging, such as Hough Transform, Fast Line Detector (FLD), Line Segment Detector (LSD) and other line detection algorithms, they have their own advantages and disadvantages, and are summarized and tested, compare which algorithm has higher accuracy and better effect in the field of board linear detection and counting. Finally, the operation mechanism, advantages and disadvantages are summarized, and the process and trend of the further optimization and development of the traditional algorithm line detection technology in the future are prospected, which provides some reference for the research in related fields.

Keywords: Straight line detection, Hough Transform, FLD, LSD

1. Introduction

In the field of industrial board counting, in the past, long time continuous observation by human eyes is not only expensive, but also very low efficiency, and there are subjective differences [1]. With the rise of artificial intelligence, the field of computer vision is constantly innovating, image recognition is more and more accurate, a variety of algorithms have emerged, through the design of automatic image recognition algorithm to solve the problem of human eye recognition. In the field of computer vision and image analysis, straight line detection has always been a hot research issue [2]. As a relatively traditional image recognition technology, it can be used as the basis for higher-level image feature analysis. In 2d, compared with curves and points with features [3], straight lines contain more information, such as the center point, slope, starting point, end point and angles of multiple straight lines. If it is a three dimensions object, it can be photographed from different angles, and then the algorithm is used for image recognition. If it is in the dark scene, such as the stratified wood boards are not obvious enough, or the indoor Windows are more reflective, the extraction of image features is relatively rare, and the effect will be relatively poor, you can solve the dark reflective problem by turning on the lights, drawing the curtains and other ways. Linear detection is also widely used in road detection [4-6], image analysis and matching [7-9], detection of vanishing points [10-12], three dimensions graph reconstruction [13-15], remote sensing image analysis [16-19] and other detection.

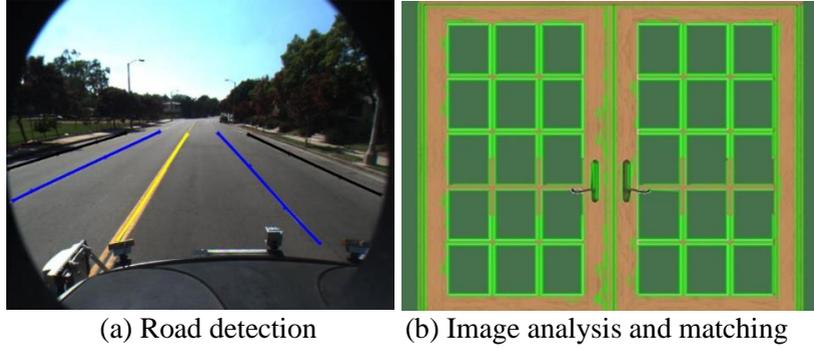


Figure 1. Application for line detection

In this paper, the existing research progress of line detection is sorted out, and it is applied to the image recognition of wooden panels. The main purpose is to make a comparative study of Hough Transform, FLD and LSD line detection algorithms, so as to see which line detection algorithm can identify the number of wooden panels more accurately and solve practical problems. Finally, the development and application of traditional linear detection algorithm in various fields and industries are prospected, which provides a reference for realizing accurate recognition, improving work efficiency and enhancing intelligence level.

2. Hough transform line detection

At present, Hough Transform linear detection has been studied by universities, research institutes and some domestic research institutes all over the world. Many scholars in mainland China are also committed to this research. For example, Hofer [20] et al. from abroad first proposed the technology of straight line detection, which can also be used to detect objects with regular shapes such as circles. However, at this time, the technology of straight line detection is not mature enough. Problems such as the inability to represent infinite slopes in computers still plague researchers. In this regard, Duda [21] et al. made a new breakthrough in line detection technology by replacing rectangular coordinate system with polar coordinate system, let, the slope of the perpendicular line is $\tan(\theta)$, the angle between the original line and the X-axis is $(90^\circ + \theta)$, then the slope is:

$$\tan 90^\circ + \theta = -\frac{1}{\tan \theta} = \frac{-\cos \theta}{\sin \theta} \quad (1)$$

If any point on the straight line is (x, y) , the slope is:

$$\frac{y-p}{x-q} = \frac{y-r \sin \theta}{x-r \cos \theta} \quad (2)$$

According to eq (1) and (2):

$$r = x \cos \theta + y \sin \theta \quad (3)$$

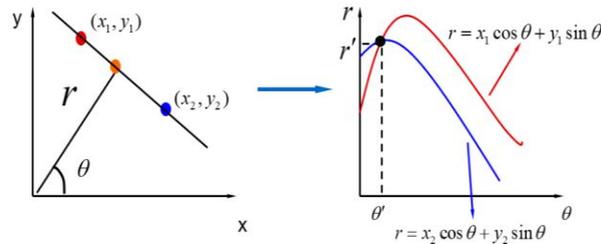


Figure 2. polar coordinate conversion process

After conversion, it can be seen that each point (x, y) in the image space corresponds to a sinusoidal curve in the polar coordinate space (r, θ) , and corresponding to collinear points in image space (r, θ) all sinusoids in space intersect a point (r', θ') , it solves the problem of too large value range and the problem that the slope infinity cannot be expressed in the computer, that's the standard Hough transform.

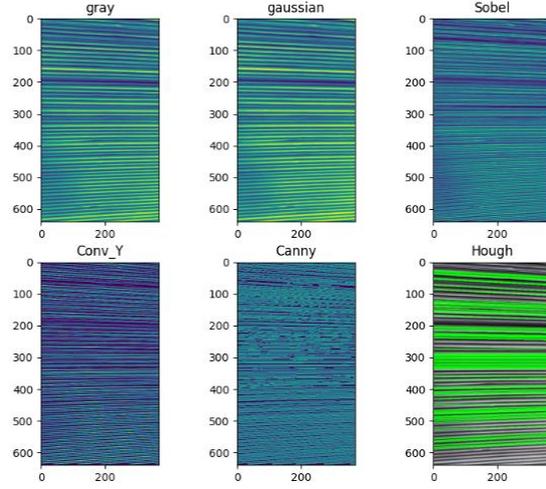


Figure 3. Hough Transform straight line detection

The figure above shows the application process of Hough Transform straight line detection in the actual problem board counting. First, the picture is transformed into a grayscale image, and then the grayscale image is processed with Gaussian. The results of gaussian processing are used to continue the Sobel operator processing, and then the convolution operation for the Y direction is carried out separately. Finally, Huogh Transform were used for detection and the image was drawn. The target recognition rate was sixty percent. Because the layering between boards is not obvious enough and the arrangement is not neat enough, the board of the upper layer will protrude and block the board of the next layer, resulting in the dark light of some parts of the picture taken, affecting the detection. Hough Transform line detection is a technology proposed earlier. It is quite remarkable that image recognition can reach the present level under the interference of a variety of factors, which provides guidance for the development of line detection technology in the future.

3. FLD line detection algorithm

FLD algorithm was first mentioned in the article straight line identification in urban outdoor environment, the paper tried to use the straight line features to replace the original feature points to some construction of outdoor scene recognition and detection, with some features of point and point, the characteristics of the straight line has a more easily find the robustness. Some features of a straight line are largely unaffected by changes in the external environment, such as light intensity, being obscured by other objects, changing multiple perspectives, etc. The supervised strategy is: after the projection, samples within the class should be aggregated together as much as possible, and samples between classes should be separated as much as possible. The degree of aggregation and separation can be measured by the Euclidean distance between the sample and the mean value, the solution method is a matrix composed of feature vectors of the first k spectral radius of $S_w^{-1}S_B$. X is the sample matrix, W is the projection matrix, y is the projected matrix, $y=W^T x$ is the projection process, dichotomies $J(W) = \text{degree of hashing between classes} / \text{degree of in-class hash}$:

$$J(W) = \frac{|\tilde{u}_1 - \tilde{u}_2|^2}{\tilde{s}_1^2 + \tilde{s}_2^2} \quad (4)$$

Among:

$$\tilde{u}_i = \frac{1}{N_i} \sum_{x \in w_i} y = W^T u_i \quad (5)$$

$$\tilde{s}_i^2 = \sum_{y \in w_i} (y - \tilde{u}_i)^2 = \sum_{x \in w_i} w^T (x - u_i)(x - u_i)^T w \quad (6)$$

According to eq (4) and (5) and (6):

$$J(W) = \frac{W^T S_B W}{W^T S_W W} \quad (7)$$

According to the above simplification results:

$$J(W) = \frac{|\hat{S}_B|}{|\hat{S}_W|} = \frac{|W^T S_B W|}{|W^T S_W W|} \quad (8)$$

have to:

$$S_w^{-1} S_B w = \lambda w \quad (9)$$

w is the matrix of eigenvectors of the first K spectral radius.

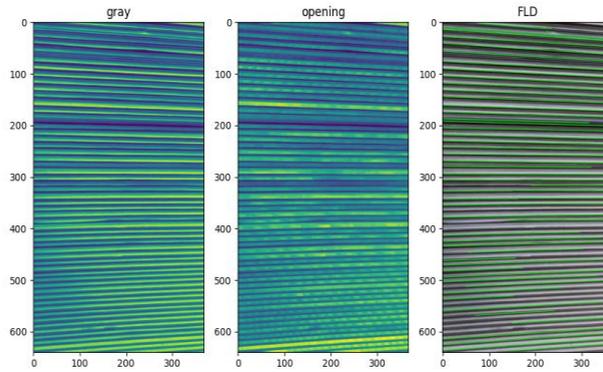


Figure 4. FLD straight line detection

The figure above shows the application process of FLD straight line detection in board counting in practical problems. First, the image is transformed into a gray scale image, then the convolution kernel is set for open operation processing, and an FLD object is created. The FLD object is used to call DETECT to execute detection results and return line data. As can be seen from the figure above, FLD's recognition effect is much better than Hough's, and the target recognition rate is as high as eighty-five percent. FLD is a line detection algorithm which has been improved greatly after Hough Transform, providing a new idea for intelligent recognition and scientific counting, and opening a new door in the field of line detection algorithm.

4. LSD line detection algorithm

LSD algorithm was proposed by Rafael Grompone et al in *LSD: A Line Segment Detector*. The time complexity of LSD algorithm is much lower than that of Hough, which saves a lot of time and improves efficiency. LSD algorithm is a local exploration and recognition of an image, calculate the set of pixels of a straight line, and then verify the solution by assuming each parameter, and then combine the set of pixels with the set of control errors, which can control the number of error detection adaptively. Generally, when it is necessary to identify an image and detect a straight line, the most intuitive idea is to identify and detect the collection of pixels in each part of the image with relatively large gradient changes. LSD algorithm is to detect the straight line of the image through the information of the gradient and the lines of the row and column. The purpose of LSD is to detect the part of the image where the pixel value jumps relatively large, which is generally the straight contour area, which is also one reason why we call it straight line segmentation. So gradients and row column lines are different, as shown here:

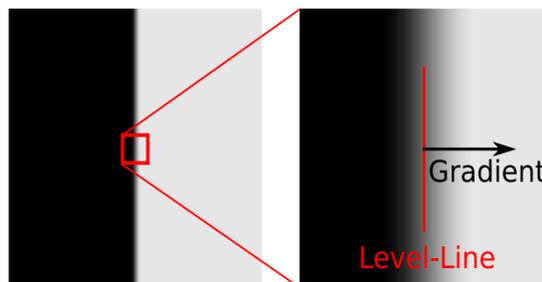


Figure 5. gradient and row column line

LSD will be calculated each pixel point around the degree of the ranks of the line, to produce a procession line area, in this region, each vector and a datum line tangent, so this area is divided into multiple parts can be connected, and under certain conditions they would have the same point of view of the ranks of the line. The connected area is called the line feasible region, as shown in the figure.

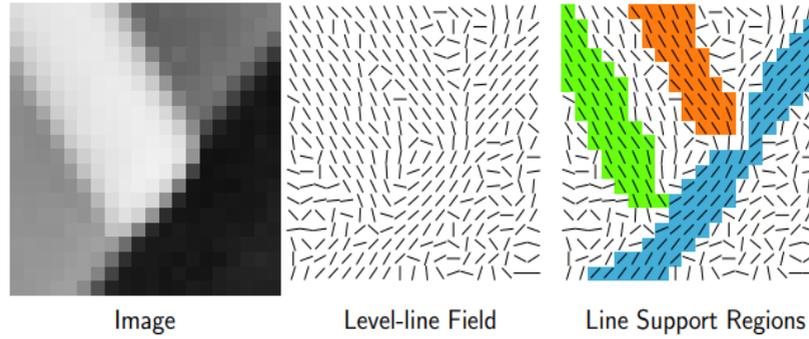


Figure 6. line feasible region

The line feasible region is a candidate region for linear segmentation, which requires a rectangular contour to correspond to it. The central axis of the feasible region of the line is used as a principal orientation of the rectangle that covers the entire region. A point in a rectangular area where the line and line angles and the principal axis angles are the same within a certain tolerance range is called a homogeneous point. In general, the number of all pixels in the homogeneous point and rectangular area will be calculated as an alternative area. LSD input must be a greyscale image, segmentation result set after the output is linear, the design idea of it is an automatic, intelligent image recognition and detection method, this method does not need to adjust the parameters, only need a few parameters can adjust the final performance of the algorithm, the several parameters is written after careful consideration, so as to adapt to a variety of actual situation. The following figure shows the process of LSD straight line segmentation

Algorithm 1: LSD: Line Segment Detector

input: An image I .
output: A list out of rectangles.

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1  $I_S \leftarrow \text{ScaleImage}(I, S, \sigma = \frac{S}{2})$ 
2  $(LLA, |\nabla I_S|, \text{OrderedListPixels}) \leftarrow \text{Gradient}(I_S)$ 
3  $\text{Status} \leftarrow \begin{cases} \text{USED,} & \text{pixels with } |\nabla I_S| \leq \rho \\ \text{NOT USED,} & \text{otherwise} \end{cases}$ 
4 foreach  $pixel P \in \text{OrderedListPixels}$  do
5   if  $\text{Status}(P) = \text{NOT USED}$  then
6      $region \leftarrow \text{RegionGrow}(P, \tau)$ 
7      $rect \leftarrow \text{Rectangle}(region)$ 
8     while  $\text{AlignedPixelDensity}(rect, \tau) < D$  do
9        $region \leftarrow \text{CutRegion}(region)$ 
10       $rect \leftarrow \text{Rectangle}(region)$ 
11    end
12     $rect \leftarrow \text{ImproveRectangle}(rect)$ 
13     $nfa \leftarrow \text{NFA}(rect)$ 
14    if  $nfa \leq \varepsilon$  then
15      Add  $rect \rightarrow out$ 
16    end
17  end
18 end

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Figure 7. LSD straight line segmentation flow chart

At the beginning of LSD algorithm, the input grayscale image is changed to eighty percent of the original, and the purpose of image reduction is to reduce the influence of the sawtooth in the image. Blur operation can also reduce the influence of the sawtooth in the image, but some white noise may be wrongly detected,

which requires open operation. The image is reduced by gaussian down sampling. Gradient calculation can be expressed by the following formula:

$$f_x(a, b) = \frac{p(a+1,b)+p(a+1,b+1)-p(a,b)-p(a,b+1)}{2} \quad (10)$$

$$f_y(a, b) = \frac{p(a,b+1)+p(a+1,b+1)-p(a,b)-p(a+1,b)}{2} \quad (11)$$

Here, $p(a,b)$ is the pixel value of grayscale image, and the angle calculation formula of row and line is as follows:

$$\arctan\left(\frac{f_x(a,b)}{-f_y(a,b)}\right) \quad (12)$$

Gradient amplitude:

$$F(a, b) = \sqrt{f_x^2(a, b) + f_y^2(a, b)} \quad (13)$$

LSD straight line segmentation is directional, there is a gradient difference of 180 degrees from white to black and from black to white, that is to say, the starting point and end point of LSD segmentation can not be arbitrarily changed. LSD line segmentation generally starts from pixels with high gradient amplitude, because the edges of pixels with high gradient amplitude are relatively strong, and the quicksort algorithm requires $O(n \log n)$ operations, and pseudo sorting can be realized in linear time. As for the threshold value of the gradient, the region with little change of pixels, that is, the pixel with gradient amplitude less than a certain value, will not be put into the line feasible region. For region growth, select any unused point in the sorting as the test point. Region growth will create a line feasible region. Unused region points will be updated.

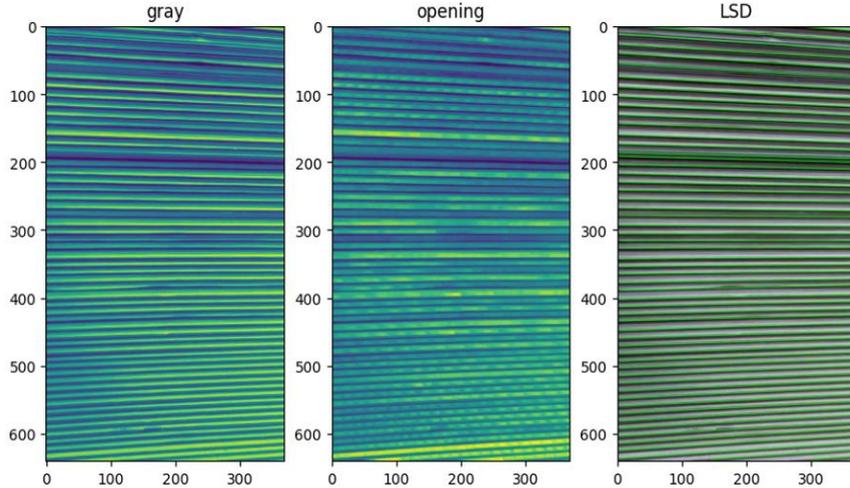


Figure 8. LSD straight line detection

The figure above shows the application process of LSD straight line detection in the actual problem board counting. First, the image is converted to gray scale, a convolution kernel is set for open operation, an LSD object is created, detect is used to execute detection results, and all the detected line data is returned, and then the line is drawn on the original image. It can be seen from the figure above that LSD has a much better recognition effect than Hough Transform and FLD, and the target recognition rate is as high as ninety-nine percent, which can be said to be a perfect algorithm in the field of practical problem board counting. Using only a pretreatment process of open operation and achieved the effect of better than expected, save a lot of time, improves the accuracy of recognition, LSD is great after Hough Transform and FLD ascension linear detection algorithm, its rapid and efficient characteristics favored by many researchers, for the intelligent identification, counting science provides an efficient algorithm, The rise

of the era of artificial intelligence. The following table shows the mechanism, advantages and disadvantages of the three line detection algorithms.

Table 1. Comparison of line detection algorithms

Algorithm	mechanism	advantage	shortcoming
Hough Transform line detection	Edge points are used to detect lines	Simple implementation, easy to understand, more convenient	Short line segment cannot be detected, breakpoint detection is not accurate enough, and the dense edge part is prone to problems
FLD line detection	Replace original SURF point features with straight line features	Compared with the previous algorithm, the recognition effect is better and the speed is faster	In the case of external environment interference, the recognition effect is not particularly good
LSD line detection	Based on local image analysis, the pixel point set is calculated, and the solution is verified by assuming parameters	Faster, more accurate identification and detection	The line segments identified in some places are incoherent, resulting in over-segmentation

5. Existing problems

Although early years has a large number of researchers engaged in the research of various linear detection algorithm, a variety of algorithm emerge in endlessly, the accuracy and effect of detection and recognition method has significantly improved, reducing the cost of time, but these algorithms to solve practical problems in real life there are still some shortcomings, mainly has the following several aspects.

1) When taking photos to collect experimental data, there will be serious reflection phenomenon if there is glass in the room, which will affect the recognition and detection of the algorithm. If there is no glass in the room and the light is dark, the collected data will appear that the layering between each board is not obvious, affecting the detection of straight lines, you can turn on the lamp to increase the light to solve the problem of low light. If the boards are placed too neatly, and each one is exactly the same color, there will be no gap between the boards, and the algorithm will determine that there is no boundary, resulting in false detection. Different shooting angles can also have an impact, as can shooting things other than the detection target.

2) In a real large factory environment, there are high requirements on shooting materials, with strict requirements on shooting angle, location, clarity, etc. The factory has a large space, and multiple sets of data need to be shot, specific analysis of specific scenes will consume certain human resources.

3) So far, researchers have designed most of the straight line detection algorithm is suitable for detection of specific environment or objects, each one has its own recognition principle, each have advantages and disadvantages, in the face of complex practical problems, will not be able to flexibly respond to various changes, intelligent remains to be improved, testing does not have universality.

6. Expectation

Straight line detection is widely used in computer vision, promote the development of the intelligent identification, for industrial intelligent identification, detection plays a very important role in the development of wisdom, in order to make the linear detection algorithm of identification is more accurate, further optimized, in the near future linear detection algorithm can from the following several aspects to explore and research.

1) Ultra clear image data without interference. Ultra clear image data without interference is very important to the recognition of line detection algorithm. Ultra clear image data without interference can improve the accuracy of line detection algorithm recognition, so as to improve the final recognition effect. It can develop more intelligent data acquisition technology of actual scene image, research and manufacture equipment and instruments that can flexibly cope with external environmental interference, so as to overcome problems such as reflection, shadow and interference of things unrelated to the detection target.

2) Optimization and improvement of line detection algorithm. By integrating the ideas of various algorithms and taking various factors into account, a better algorithm can be constructed, which can flexibly cope with and better solve practical problems, and improve the timeliness of the application of linear detection algorithm in real life.

With the development of artificial intelligence, computer vision is becoming more and more rapidly, the development of the new algorithm emerge in endlessly, in the actual problem is becoming more and more widely, the application of algorithm combined with the algorithm and optimization will be a new direction of the development of the later, the researchers in the future, with the help of algorithm will be more mature, will be more flexible to solve practical problems in real life, Will usher in a new era of intelligence.

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