

A Robust Method for Adaptive Center Extraction of Linear Structured Light Stripe

LU Yonghua^{1*}, ZHANG Jia¹, LI Xiaoyan², LI Yanlong², TAN Jie²

1. College of Mechanical and Electrical Engineering, Nanjing University of Aeronautics and Astronautics,
Nanjing 210016, P.R. China;

2. State-Owned Jinjiang Machine Factory, Chengdu 610043, P.R. China

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Abstract: In the non-contact measurement using the linear structured light (LSL), the extraction precision of the light stripe center directly affects the measurement accuracy of the whole detection system. To solve the problem that general algorithms cannot accurately extract the center of the light stripe with the uneven width and unstable grey-value distribution, an adaptive optimization method is proposed. In this method, the stripe region is firstly segmented, and the widths of the laser stripe are calculated by boundary detection. The initial stripe center points are computed by the quadratic weighted grayscale centroid method based on the self-adaptive stripe width. After that, these center points are optimized according to the determined slope threshold. The sub-pixel coordinates of these center points are recalculated. Detailed analysis is also performed in line with the proposed evaluation index of the extraction algorithm. The experimental results show that the mean square error of extracted center points is only 0.1 pixel, meaning that the accuracy of laser stripe center extraction is improved significantly by the method. Furthermore, the method can run effectively at a relatively low computational time cost, and can demonstrate great robustness as well.

Key words: laser stripe; image processing; center extraction; self-adaptive; evaluation index

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0 Introduction

In optical non-contact measurement, due to its high precision, good real-time and easy to realize, the linear structure light (LSL) mode is widely used in many fields, such as automated welding^[1], dimensional measurement^[2], 3D reconstruction of object surfaces^[3], surface quality inspection^[4], food detection^[5-6], etc. Since the laser stripe photographed by the CCD camera has the width of a few or tens pixels, whether or not the stripe center can be accurately extracted will largely determine the measurement reliability of the entire visual inspection system. Therefore, it is necessary to consider the accuracy, stability and efficiency of the laser stripe extraction algorithm in the implementation process for real-time vision measurement based on

the linear structure light.

The laser stripe center extraction algorithm can be divided into two categories: traditional algorithm and improved algorithm. The traditional methods mainly include skeleton refinement method, geometric center method, extreme value method, etc.^[7] These algorithms generally rely on the geometric contour or grayscale maximum value of the stripe to obtain the position of the center points. They are simple to implement, fast to extract, but poor in accuracy and sensitive to noise. Besides, the direction template method, the Steger method and the grayscale centroid method, which have relatively more accurate extraction results but poor real-time, fall into the category of conventional methods as well. Using the direction template method to obtain the stripe center can significantly suppress the

*Corresponding author, E-mail address: nuaa_lyh@nuaa.edu.cn.

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influence of noise in the extraction process^[8]. However, the efficiency suffers due to a large number of template-based mathematical calculations, or the accuracy is not satisfactory because of a basis on only four direction templates, that is, vertical, horizontal, left 45° and right 45°. The Steger method^[9], which is designed to extract the sub-pixel center points by performing convolution on every image pixel with the Hessian matrix. During this process, the eigenvalues and eigenvectors of each Hessian matrix need to be solved. Although its accuracy is as high as sub-pixel level, the computational complexity is also significantly higher, resulting in a long calculation time. In order to improve the efficiency of the Steger method, the graphics processing unit (GPU) can be applied for the stripe center inspection, which is used to remarkably shorten the processing time of line detection and center extraction^[10]. Methods based on parabolic, Gaussian' spline interpolation or template matching are even worse than the easily computable threshold operation, while the grayscale centroid method supplies best results in practical application^[11]. In addition, the grayscale centroid method has become one of the commonly used methods for laser stripe center extraction due to its high-accuracy, efficiency and easy to implement^[12]. In the study of improved grayscale centroid method, the dynamic least square method is used to fit the center points determined by the grayscale centroid method^[13]. Meanwhile, a rectangular frame at each initial center point is defined, two sides of which are parallel to the tangent vector and the normal vector at the center point respectively. The length of the rectangular side parallel to the tangent vector is obtained by the radius of curvature of the point. Finally, the exact sub-pixel positions of the center points are calculated along the normal vector direction inside the rectangle. A robust laser stripe extraction method based on the grayscale centroid method is proposed for 3D reconstruction^[14]. The center points are extracted preliminarily by the thinning algorithm, of which the normal directions are also calculated by using the Hes-

sian matrix. Then the final accurate center points can be obtained along this direction. This improved method can be run in real time and has a better performance than the simplified Hessian matrix method.

In addition to the above improved methods, there are also many other measures for the center extraction of the laser stripes. By analyzing the characteristics of laser fringes, a stripe center extraction method of multi-Gaussian signal fitting based on wavelet transform is proposed^[15]. Different expectations and variances are used to obtain the best fitting result of each laser stripe cross-section and the position of the stripe center point is determined based on the symmetry center of the fitted Gaussian signal. Based on an ideal light intensity model, the center point of each cross-section of the light stripe is calculated according to the conservation laws of Legendre moment^[16-17]. Meanwhile, a smoothing spline algorithm is applied to eliminate the noise. The boundary-connection is used to determine the light stripe region, and the improved split-and-Merge approach is used to extract the laser stripe center-line on the detected object^[18]. The experimental results show that the proposed method is fast, robust and accurate. To solve the problem that the laser stripe center is difficult to be accurately extracted due to the strong specular reflection on the metal surface, a collar-wise laser stripe extraction method based on Gaussian filter and sub-pixel interpolation is put forward^[19], which is suitable for real-time online detection of 3D morphology in the industrial environment.

In practical applications, the light intensity distribution of the laser stripe, which is projected by the ordinary laser projector, is often uneven. The width of each cross-section of the laser stripe changes obviously. In addition, the reflection condition of the detected objects is usually quite different. Therefore, it is easy to lead to some problems such as inaccurate extraction of the laser stripe center, obvious defect of broken line and so on. As can be concluded from the above analysis, few researches discussed this problem. What's more, the optimization effect, accuracy and reliability of the above methods

need to be improved. In this paper, an adaptive optimization algorithm for extracting the laser stripe center is proposed. Firstly, the region of interest (ROI) of the stripe image is determined. The initial center points of the stripe, which are extracted by using the quadratic weighted grayscale centroid method based on self-adaptive width, are recalculated according to the computed slope threshold. Finally, the sub-pixel center points with high accuracy can be achieved by performing the average-value optimization method. The proposed method and other traditional methods are analyzed and compared in a detail and comprehensive way, which is on the basis of the well-rounded evaluation index proposed in this paper.

1 Image Preprocessing

The detailed flowchart of optimization algorithm in this paper is shown in Fig.1. Firstly, the laser stripe image captured by a CCD industrial camera is sequentially subjected to operations such as median filtering, threshold segmentation, as well as morphological closing operation. And ROI of the image is determined after analyzing the features of it. Then the width of each cross-section of laser stripe is obtained using the edge detection method. Meanwhile, initial central points are extracted by applying adaptive width quadratic weighted center of gravity method. Finally, the accurate sub-pixel coordinates of all central points are acquired, using the average optimization algorithm.

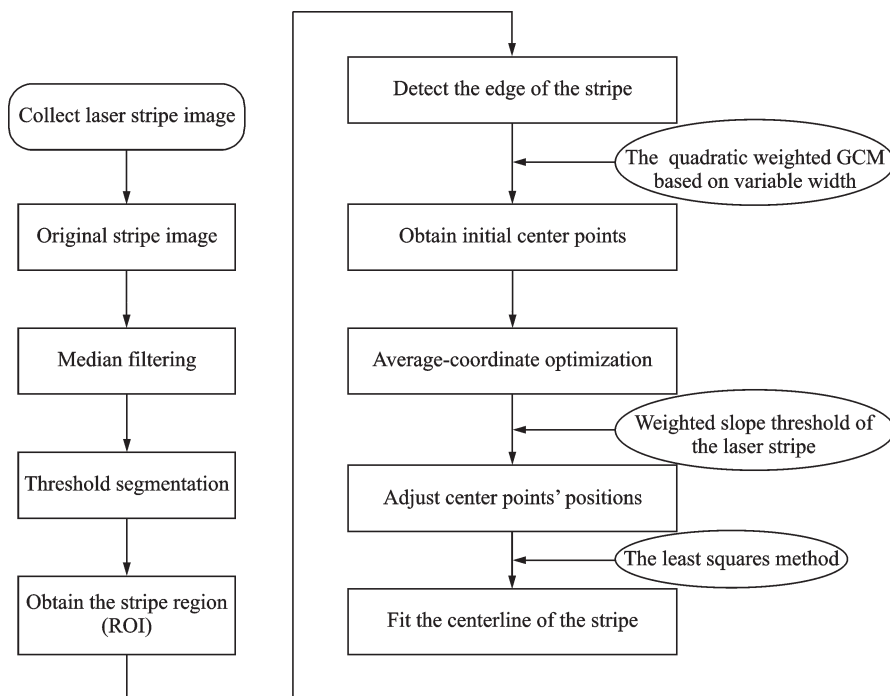


Fig.1 Flowchart of the proposed optimization method

1.1 Characteristics of laser stripe

Under ideal condition, the light-intensity in the cross section of a laser stripe exhibits a Gaussian distribution. However, under practical circumstance, due to the interference of the field environment, the quality of the laser, the material of the measured object surface and other factors, the actually acquired image of light stripe is shown in Fig.2(a). And the

grey-value distribution in a representative cross-section is shown in Fig.2(b). It can be seen that, the closer the pixels are to the light stripe center, the faster their grey-values increase, and there are multiple maximum grey-values at the center. The grey-value on both sides of the stripe is almost zero. Generally, the distribution of the grey-value is similar to a Gaussian distribution.

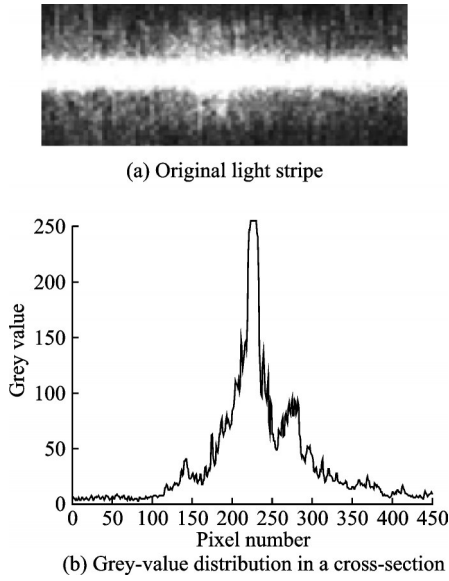


Fig.2 Laser stripe and grey-value distribution in a cross-section

1.2 Preprocessing method

After completing the median filtering operation, image binarization, a global adaptive image segmentation algorithm is adopted to obtain the binary image of a laser stripe in this paper. The algorithm, using the maximum inter-class variance method, i.e., Otsu method, calculates the optimal threshold of image segmentation, which maximizes the difference between foreground and background of an image. The greater the inter-class variance between the two parts is, the greater the difference of them will be. When the largest inter-class variance is obtained, the probability of misclassifying the foreground and background of an image is the smallest. The equation for calculating the inter-class variance is

$$g = w_0 \times (u_0 - u)^2 + w_1 \times (u_1 - u)^2 \quad (1)$$

where w_0 is the proportion of foreground pixel points in an image, u_0 the average grey-value of the foreground in an image, w_1 the ratio of background pixel points in an image, u_1 the average grey-value of the background in an image, and u the total average grey-value of an image, which can be expressed as

$$u = w_0 \times u_0 + w_1 \times u_1 \quad (2)$$

Denoted by t is the segmentation threshold of the image foreground and background, which is the optimal segmentation threshold of an image when

making g in Eq.(1) reaches the maximum. The laser image is segmented, according to the optimal segmentation threshold t , by using the global adaptive binarization segmentation algorithm, shown as

$$G(x,y) = \begin{cases} 1 & f(x,y) > t \\ 0 & f(x,y) \leq t \end{cases} \quad (3)$$

where $f(x, y)$ is the grey-value of a pixel point with image coordinate (x, y) , and $G(x, y)$ the grey-value of a pixel point after image segmentation.

In order to bridge the narrow discontinuity and slender gully of the stripe, eliminate the small holes, and smooth the contour of the binary stripe at the same time, the morphological closure operation is applied in this paper. Morphological closure operation is an image processing technique that combines two morphological operations (morphological dilation and morphological corrosion). Its mathematical model is expressed as

$$A \bullet B = (A \oplus B) \ominus B \quad (4)$$

where A is the image to be processed and B the structural element of morphological operation.

Morphological dilation operation can be expressed as

$$A \oplus B = \{x, y | (B)_{xy} \cap A \neq \emptyset\} \quad (5)$$

Morphological corrosion operation can then be expressed as

$$A \ominus B = \{x, y | (B)_{xy} \supseteq A\} \quad (6)$$

Morphological closure operation is performed on the image of the binary laser stripe, and the result image is shown in Fig.3.



Fig.3 Binary laser stripe (enlarged)

The method to determine the laser stripe region (i.e., ROI) is to retrieve the grey-value $G(x, y)$ of the pixels of the binary light stripe column by column. The pixels are scanned from the left end of the stripe until the first pixel with the grey-value $G(x, y) = 255$ is detected, and the pixels are scanned from the right until the last one with the grey-value $G(x, y) = 255$ is detected in the last col-

umn of the stripe. These two obtained pixels' coordinates are marked as (x_{\min}, y_{\min}) and (x_{\max}, y_{\max}) respectively. Therefore, the set of pixel points within the ROI region can be expressed as

$$\{G(x, y) | x_{\min} \leq x \leq x_{\max}, y_{\min} \leq y \leq y_{\max}\} \quad (7)$$

It can be seen from the processed laser stripe image that the width varies along the length of the stripe. For this reason, the optimization algorithm in this paper obtains the width of each cross-section of the stripe by detecting the upper and lower boundary of it, and extracts the center of each cross-section within its width range. Inside ROI of image, the binary laser stripe is scanned column by column to obtain the upper and lower boundary, and the width of each cross-section of the stripe (denoted by w_i) is computed, as shown in Fig.4.

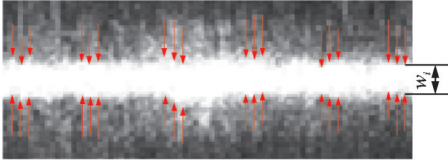


Fig.4 Schematic diagram of width calculation

Then the pixel set of the i th column required for calculating the center point's coordinate is expressed as

$$\begin{aligned} & \{G(i, y) | y_{i, \text{up}} \leq y \leq y_{i, \text{down}}\} \text{ or} \\ & \{G(i, y) | y_{i, \text{up}} \leq y \leq y_{i, \text{up}} + w_i\} \end{aligned} \quad (8)$$

where $y_{i, \text{up}}$ and $y_{i, \text{down}}$ are respectively the upper and the lower boundary y coordinates of the stripe, $w_i = y_{i, \text{down}} - y_{i, \text{up}}$.

2 Light Stripe Center Extraction

2.1 Adaptive extraction for sub-pixel center of laser stripe

Considering the inconsistent stripe width along the extension direction and small grey-value difference at the stripe center, the quadratic weighted centroid method based on the adaptive width is adopted in this paper to extract sub-pixel center points of the laser stripe. The computation principle of the method is shown in Fig.5. The width w_i of each cross-section of the laser stripe and the pixel set $G(i, y)$ of the i th column have been obtained from the above

parts. The coordinates of each center point in every column of the laser stripe which are denoted by P_i in the schematic diagram are calculated by using the method. The dots in the graph are the extracted center points of the stripe, which are all at sub-pixel level.

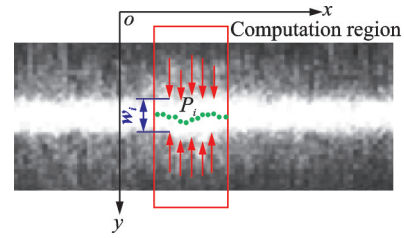


Fig.5 Principle for center extraction using self-adaptive quadratic weighted centroid method

The equation for calculating the coordinate of the center point of each cross-section is written as

$$y'_{\text{center}} = \frac{\sum_{y=y_{i, \text{up}}}^{y_{i, \text{up}} + w_i} G(i, y)^2 \cdot y}{\sum_{y=y_{i, \text{up}}}^{y_{i, \text{up}} + w_i} G(i, y)^2} \quad (9)$$

where $y_{i, \text{up}}$ is the y coordinate of the upper boundary of each cross-section of the laser stripe (under image coordinate system), w_i the width of the i th cross-section of the stripe, $G(i, y)$ the grey-value of the pixel whose image coordinate is y in the i th cross-section of the stripe, and y'_{center} the initial center coordinate of each cross-section of the laser stripe.

The distribution of the center points preliminarily extracted by Eq.(9) is shown in Fig.6. It shows that the fluctuation of these center points is relatively apparent.

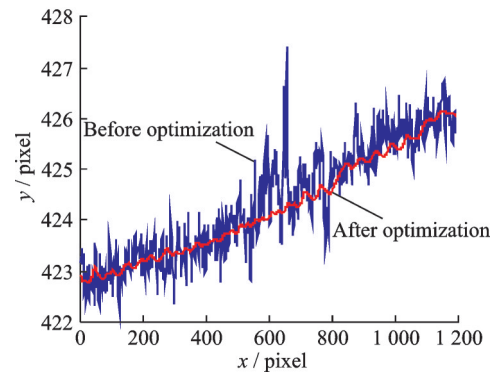


Fig.6 Distribution of extracted center points

2.2 Optimization for center points

Some of these initial center points deviate from the center position of the laser stripe due to bad quality of the laser projector. In order to ensure the high-accuracy of the fitted center line, the optimization for these center points is performed in this paper. The initial center points are optimized in two steps.

The first step is calculating the mean y -coordinate of center points within a certain region, the region moves one pixel every time and its size is fixed. The calculation process can be expressed as follows

$$y_{\text{center}}^1(m) = \frac{\sum_{x=m-\frac{a-1}{2}}^{m+\frac{a+1}{2}} y'_{\text{center}}(x) - y'_{\text{center}}(m)}{a-1} \quad (10)$$

where $y'_{\text{center}}(m)$ is the coordinate of the initially extracted center point in the $(m+1)$ th column of the laser stripe, a the domain size for calculating the average y -coordinate of the center points, which is generally an odd number ($a \geq 1$), $y'_{\text{center}}(x)$ the coordinate of the initially extracted center point in the x th column of the laser stripe, and $y_{\text{center}}^1(m)$ the coordinate of the center point in the $(m+1)$ th column after optimization.

The second optimization step is to judge one center point whether has a large deviation according to a slope threshold, if so, the coordinate of the point need to be re-calculated. The slope threshold is determined by calculating the approximate slope of the center line fitted in the above part. Final center points' coordinates are obtained by

$$y_{\text{center}}^2(m) = \begin{cases} y_{\text{center}}^1(m) & k \leq 10k_0 \\ y_{\text{center}}^1(m-b) + b \times k_0 & k > 10k_0 \end{cases} \quad (11)$$

where k_0 is the slope threshold of the laser stripe, the value of which is determined according to the tilt angle of the laser stripe and the selection rule of the coordinate axis, and the optimized structure can not be affected by the selection of k_0 value. k is the slope of center points within a certain region, and this region also moves one pixel every time and its size is fixed. b is a constant which represents the step size of re-calculating the point's coordinate, and it needs to be confirmed in the experiment. $y_{\text{center}}^2(m)$ is the fi-

nal coordinate of the center point in the $(m+1)$ th column of the laser stripe.

According to Eq.(9), the initial coordinates of center points are obtained, and Eq.(10) and Eq.(11) are used to adjust the coordinates of some center points whose deviations are a bit larger.

After the above optimization operation, the distribution of the extracted center points of the laser stripe is shown in Fig.6. It can be seen that the fluctuation of center points decreases compared with that before optimization. Therefore, the effect of the proposed optimization operation in this paper is obvious.

3 Experiments and Discussion

The visual measurement system based on LSL set up in this paper is shown in Fig.7. In the experiment, VS 2013 is taken as the development platform, and the programming language C++ is utilized to perform the proposed optimization method, wherein, some data structures and common image process algorithms from OpenCV are also used. A high-precision CCD industrial camera, with 1 292 pixel \times 964 pixel resolution and $3.75 \mu\text{m} \times 3.75 \mu\text{m}$ pixel size, is used. The megapixel lens with 8 mm focal length is selected. The laser maximum power is 30 mW and the wavelength of the laser light is 650 nm (red light).

In order to verify the extraction effect of the proposed method, skeleton refinement method, grayscale centroid method and Hessian matrix method are compared.

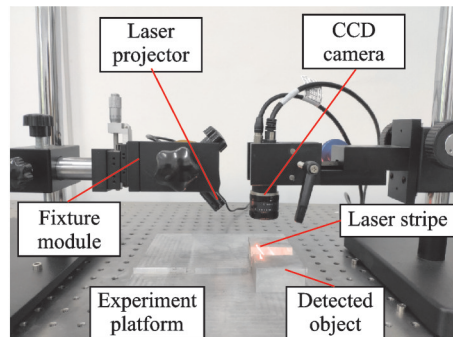


Fig.7 Experimental measurement system based on LSL

3.1 Computational complexity

Time complexity and space complexity are important evaluation systems and evaluation criteria for computational complexity.

Time complexity, one of the key technologies of visual detection, whether or not the laser stripe extraction method is high-efficient is an important aspect to be considered. In order to determine whether these extraction methods can be applied in real time, the runtime of them must be calculated.

In this experiment, the computer for the image processing has a CPU of Intel i5-4210U 1.7 GHz and a RAM of 4 GB. For each laser image, the center extraction program runs 10 times, and the average time of different center extraction methods is shown in Table 1.

Table 1 Aaverage time of different center extraction methods

Method	Skeleton refinement method	Grayscale centroid method	Hessian matrix method	Proposed method
<i>t</i> /ms	593	156	1 512	140

As shown in Table 1, the Hessian matrix method is the most time-consuming, which cannot run in real time, for a large amount of convolution is needed in extracting the center points of the laser stripe. Using the skeleton refinement method and the grayscale centroid method to determine the position of center points also takes a bit longer time. On the contrary, the proposed optimization method simplifies the process of extracting center points. Therefore, the proposed method not only ensures the extraction accuracy, but also makes the running time shorter. Namely, it needs relatively low computational time cost to finish the extraction process.

For space complexity, according to the image acquisition equipment and computer configuration in this paper, the maximum memory for the algorithm of proposed method is 68 MB, the output image resolution is 1 292 pixel×964 pixel, and the algorithm program size is 425 KB.

3.2 Extraction accuracy

Fig.8 shows that the laser stripe center line extracted by the proposed method is at the actual center position of the laser stripe. It proves that the optimization method can effectively adjust center points' positions to the center of the laser stripe when these points deviate from the center significantly.



Fig.8 Center line of light stripe extracted by the proposed method

To test whether the center point extraction of one algorithm is accurate or not, the standard deviation σ , which is defined as the mean square error of the distance between extracted center points and the fitted straight line, needs to be calculated as

$$\sigma = \sqrt{\frac{\sum_{i=1}^n (d_i - \bar{d})^2}{n}} \quad (12)$$

where d_i is the distance from the i -th center point to the fitted line, \bar{d} the average distance between center points and the fitted line, and n the number of extracted center points. d_i is obtained from the calculation formula of the distance between the point and the line, so d_i can then be calculated by

$$d_i = \left| \frac{Ax_i + By_i + C}{\sqrt{A^2 + B^2}} \right| \quad (13)$$

where x_i and y_i are the x -coordinate and y -coordinate of the i th center point, respectively. A , B and C are the coefficients of the linear equation $Ax + By + C = 0$.

The purpose of the algorithm itself is to extract clearer center points and fit centerline of laser stripe. Compared with original laser stripe, the optimized centerline is smoother and straighter, which is more in line with the actual situation, and there will be no over-optimization. The distributions of the center points extracted by the proposed optimization method and the other traditional methods are shown in

Fig.9. Obviously, the center points extracted by the proposed method have the smallest volatility, while the grayscale centroid method has noticeable burr and broken-line problem. In addition, the skeleton refinement method and the Hessian matrix method demonstrate the characteristic of step-like variation, with poor accuracy and stability. The standard deviations σ of each algorithm are listed in Table 2. Compared with the traditional methods, the standard deviation of the proposed method is the smallest, which means that its extraction precision of laser stripe center points is the best.

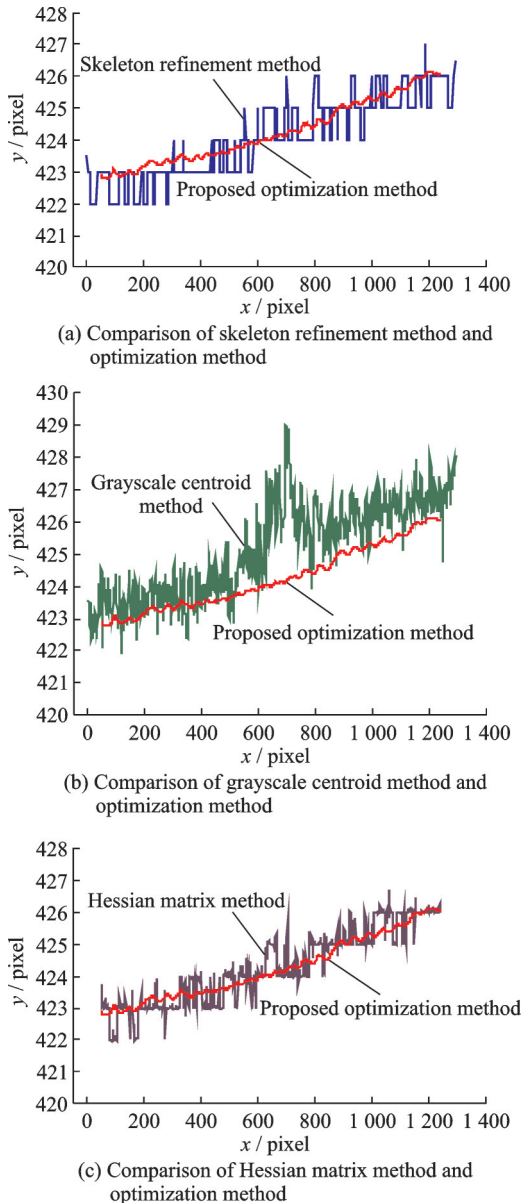


Fig.9 Distribution of center points extracted by each method

Table 2 Standard deviation of distance from extracted center points to fitting line

Method	Skeleton refinement method	Grayscale centroid method	Hessian matrix method	Proposed method
σ/pixel	0.36	0.55	0.32	0.23

3.3 Repeatability error

The repeatability error (Er) of an algorithm refers to the deviation of the center points extracted at different moments, which reflects the ability of the algorithm to resist random noise at different time. Er can be represented as

$$Er = \frac{\sum_{j=1}^p Er_j}{p} \quad (14)$$

where p is the total number of laser stripe images taken by CCD camera at different moments.

The error Er_j can be obtained by

$$Er_j = \frac{\sum_{i=1}^n |y_{j,i} - y_{1,i}|}{n} \quad (15)$$

where $y_{j,i}$ is the coordinate of the i th center point of the j th laser image, and n the number of extracted center points of the laser stripe.

As for laser stripe images captured at different time, the repeatability error Er of four different extraction methods are calculated, as shown in Table 3. Compared with the traditional methods, the proposed method retains the minimum repeatability error. So it can extract laser stripe center points with the best accuracy and reliability.

Table 3 Repeatability error of extracting center points at different time

Method	Skeleton refinement method	Grayscale centroid method	Hessian matrix method	Proposed method
Er/pixel	0.037 7	0.204 6	0.061 7	0.019 8

3.4 Robustness

In order to verify the robustness of the proposed method, parameters of the measurement sys-

tem and the experiment environment are changed. Firstly, the laser power is adjusted to the maximum, medium and minimum, and the center points of the stripe are extracted by this method at different power. These extracted points are fitted to a straight line by performing the least square method. The fitted center line is shown in Fig.10. It can be seen

that the obtained center line does not deviate from the actual central position with the change of the laser power. The error values in Table 4 fluctuate to some extent, but the error is small, which can ensure high precision. Therefore, these data show that the proposed method can provide a good result and stable performance.

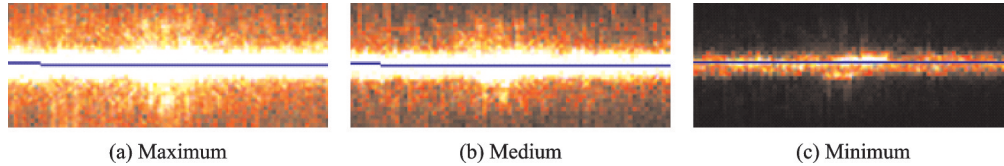


Fig.10 Center-lines extracted by the proposed method at different laser power

Table 4 Extraction error of the proposed method at different laser power

Evaluation index	Maximum	Medium	Minimum
σ/pixel	0.23	0.23	0.13
Er/pixel	0.094 3	0.019 8	0.024 9

Then, LSL is projected onto the surface of three different objects, that is aluminum plate (metal), CD and ordinary cardboard. Fig.11 shows that the proposed method can accurately extract these center lines, which means that the obtained center lines are all in the actual center positions of these

stripes. Although the error data in Table 5 fluctuate with the variety of the measured objects, the overall values are small. The main reason for this is that the proposed method increases the computational weight of the grey-value of pixels at the center when calculating the coordinates of the center points of the laser stripe, and optimizes the positions of initial center points. Therefore, the proposed method can reduce the effects of environmental parameter changes and noise disturbances in the process of extracting the stripe center.

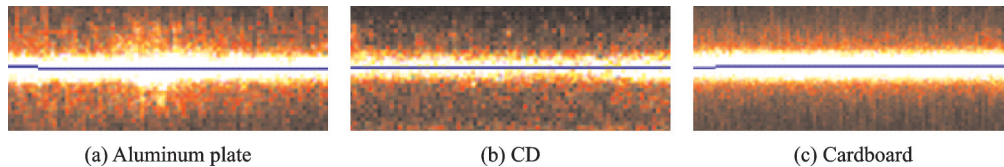


Fig.11 Center-lines extracted by proposed method on different objects

Table 5 Extraction error of the proposed method on different detected objects

Evaluation index	Metal	CD	Cardboard
σ/pixel	0.23	0.19	0.28
Er/pixel	0.019 8	0.011 2	0.037 7

4 Conclusions

An adaptive optimization method for laser stripe center point extraction is proposed. The method helps solve some problems that usually happen in actual industrial site, such as large deviation of extracted center points of the laser stripe, obvious bro-

ken-line defect of the extracted center line and problems caused by variable width, and uneven grey-value distribution of the laser stripe and other factors. The laser image is preprocessed, and ROI is determined. Based on obtaining the quadratic weighted barycenter of the laser stripe, an adaptive method is used in this paper. Then the positions of initially extracted center points are optimized according to the obtained slope threshold of the laser stripe. The proposed method can run in real time and provide a better performance than the traditional methods. The first experimental result shows that the standard de-

variation of distance from extracted center points to the fitted line is only 0.13 pixel, improved by about 30% compared with other extraction methods, which illustrates that the accuracy of the proposed optimization method is relatively high. Additionally, the proposed method also reduces the extraction repeatability error by around 50%. Another experimental result demonstrates that this method keeps great robustness on the condition that some environment parameters may change.

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Author Prof. LU Yonghua received his Ph. D. degree in Mechatronic Engineering from Nanjing University of Aero-

nautics and Astronautics, China, in 2005. He is working as a professor in College of Mechanical and Electrical Engineering, Nanjing University of Aeronautics and Astronautics. His research interests are intelligent detection and control, test systems, robots, and sensors.

Author contributions Prof. LU Yonghua designed the study, revised and modified the manuscript. Mr. ZHANG Jia

conducted the analysis and wrote the manuscript. Engineers LI Xiaoyan, LI Yanlong, and TAN Jie contributed to the discussion and background of the study. All authors commented on the manuscript draft and approved the submission.

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线性结构光条纹自适应中心提取的鲁棒方法

陆永华¹, 张佳¹, 李小焰², 李雁龙², 谭杰²

(1. 南京航空航天大学机电学院, 南京 210016, 中国; 2. 成都国营锦江机械厂, 成都 610043, 中国)

摘要:在采用线性结构光(Linear structured light, LSL)方式的非接触式测量中,光条纹中心的提取精度直接影响整个检测系统的测量精度。针对通用算法无法准确提取宽度不均匀、灰度值分布不均匀的条纹中心的问题,本文提出了一种自适应优化方法。在该方法中,首先分割条纹区域,通过边界检测来计算激光条纹的宽度。通过基于自适应条纹宽度的二次加权灰度质心法计算初始条纹中心点。之后,根据确定的斜率阈值优化这些中心点,重新计算并获得这些中心点的子像素坐标,同时根据提出的提取算法评估指标对算法进行了详细分析。实验中,提取的中心点的均方误差仅为0.1个像素,结果表明该方法可以显著提高激光条纹中心点的提取精度。此外,该方法可以以相对较低的计算时间有效地运行,鲁棒性良好。

关键词:激光条纹;图像处理;中心提取;自适应;评价指标