



estimation accuracy is higher than that of the conventional feature-based ones, and can be used in geometric calibration and target positioning of remote sensing images as well the multi-frame relative detection of time-series images.

**Key words:** remote sensing image; cloud scene; image jitter estimation; sub-pixel; model of image gray level

## 1 引言

[1-2] 遥感图像几何校正和定位精度直接影响着遥感信息的提取和定量分析。随着遥感技术的发展，遥感图像的应用越来越广泛，对图像几何校正和定位精度的要求也越来越高。传统的基于特征的方法，如基于角点、线段的匹配方法，其精度受限于特征提取的准确性和匹配算法的鲁棒性。近年来，基于深度学习的方法在图像识别和定位方面取得了显著进展，但其计算复杂度较高，且需要大量的训练数据。本文提出了一种基于子像素精度的图像灰度线性建模方法，旨在提高遥感图像的几何校正和定位精度。该方法通过建立图像灰度与几何参数的线性模型，实现了对图像几何畸变的精确校正。实验结果表明，该方法在精度和效率方面均优于传统方法。参考文献 [3-5]、[6-9]、[10-16]、[17]、[18-20]。

## 2 图像灰度线性建模

假设图像灰度分布服从线性模型，即对于任意像素点  $(i, j)$ ，其灰度值  $B_0$  可以表示为：

$$B_0(i+k, j+m) = a_{ij} + g_{ij} \cdot m + h_{ij} \cdot k, \quad (1)$$

其中  $(k, m) \in \{(0, 0), (0, -1), (0, 1), (-1, 0), (1, 0)\}$ ， $(a_{ij}, g_{ij}, h_{ij})$  为待估计的模型参数。

$$\frac{\partial f}{\partial g_{ij}} = \sum_{k,m} 2 \cdot [\mathbf{B}_0(i+k, j+m) - (a_{ij} + g_{ij}m + h_{ij}k)] \cdot (-m) = 0,$$

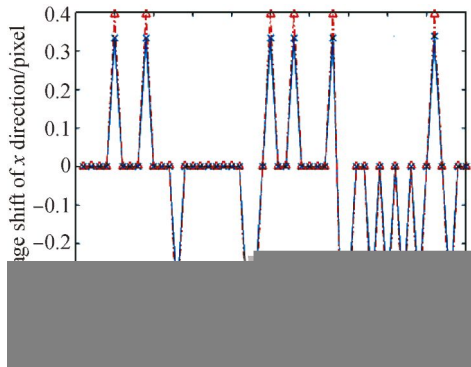
$$\frac{\partial f}{\partial h_{ij}} = \sum_{k,m} 2 \cdot [\mathbf{B}_0(i+k, j+m) - (a_{ij} + g_{ij}m + h_{ij}k)] \cdot (-k) = 0. \quad (4)$$

:

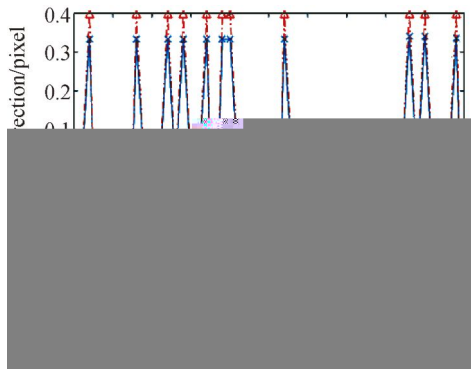
$$\begin{pmatrix} \sum_{k,m} \mathbf{B}_0(i+k, j+m) \\ \sum_{k,m} m \cdot \mathbf{B}_0(i+k, j+m) \\ \sum_{k,m} k \cdot \mathbf{B}_0(i+k, j+m) \end{pmatrix} = \begin{pmatrix} \sum_{k,m} 1 & \sum_{k,m} m & \sum_{k,m} k \\ \sum_{k,m} m & \sum_{k,m} m^2 & \sum_{k,m} k \cdot m \\ \sum_{k,m} k & \sum_{k,m} k \cdot m & \sum_{k,m} k^2 \end{pmatrix} \begin{pmatrix} a_{ij} \\ g_{ij} \\ h_{ij} \end{pmatrix} = \mathbf{A} \cdot \begin{matrix} a_i \\ \\ \end{matrix}$$



4(c) (d), (g) (h), (k) (l)  
 , “ $\times$ ”  
 , “ $\Delta$ ”  
 ,  $10^{-1}$  ,  
 $10^{-3}$  .

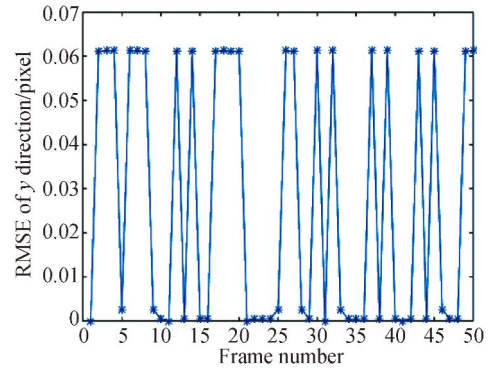


(a) Result in  $x$  direction with amplitude of 1 pixel



(b) Result in  $y$  direction with amplitude of 1 pixel

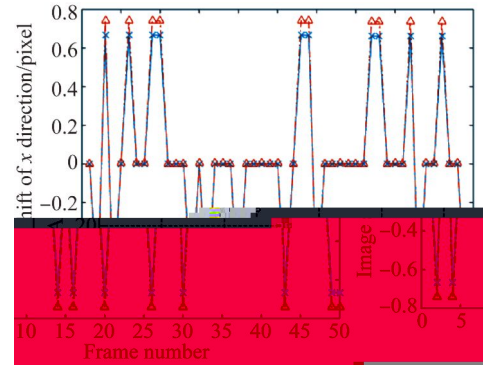
(c) (a)  $x$   
 (c) RMSE of (a) in  $x$  direction



(d) (b)  $y$   
 (d) RMSE of (b) in  $y$  direction

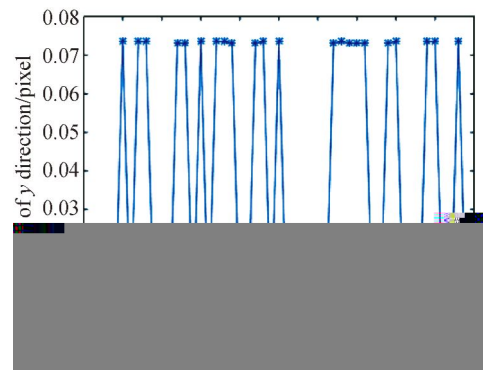
(e) 2  $x$

(e) Result in  $x$  direction with amplitude of 2 pixel

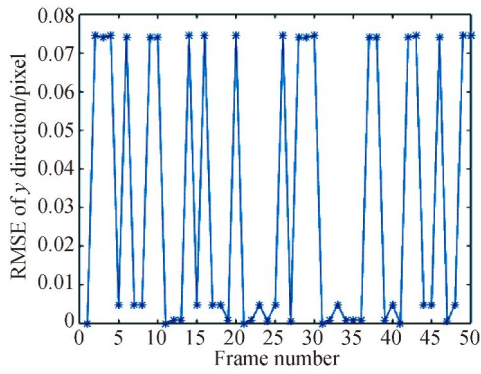


(f) 2  $y$

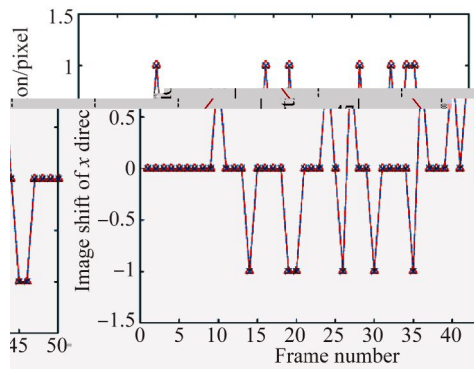
(f) Result in  $y$  direction with amplitude of 2 pixel



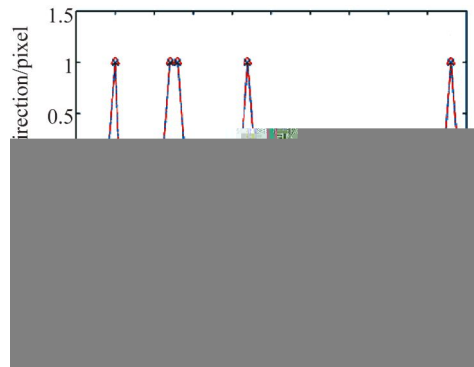
(g) (e)  $x$   
 (g) RMSE of (e) in  $x$  direction



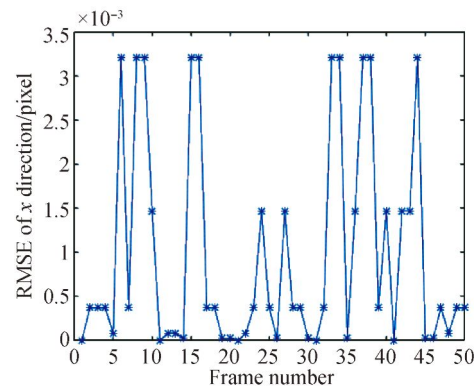
(h) (f) y  
(h) RMSE of (f) in y direction



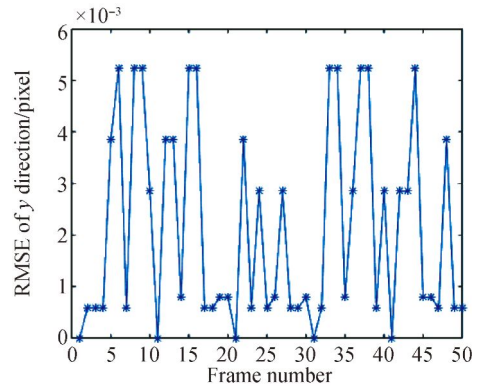
(i) 3 x  
(i) Result in x direction with amplitude of 3 pixel



(j) 3 y  
(j) Result in y direction with amplitude of 3 pixel

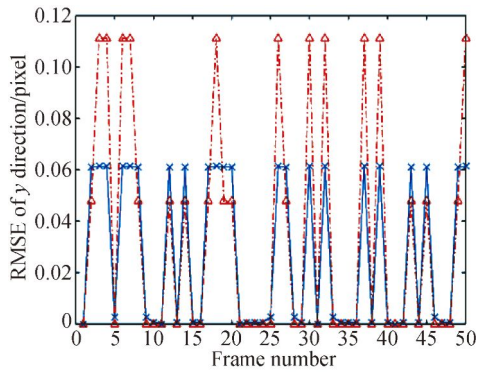


(k) (i) x  
(k) RMSE of (i) in x direction

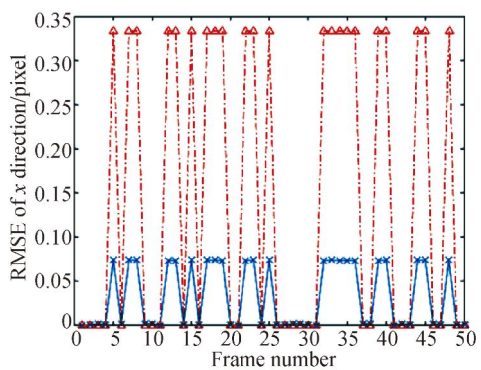


(l) (j) y  
(l) RMSE of (j) in y direction

4 Fig. 4 Results and corresponding errors of jitter estimation for image sequences



5 Fig. 5 Comparison of RMSE between proposed algorithm and conventional ones in y direction with amplitude of 1 pixel



6 Fig. 6 Comparison of RMSE between proposed algorithm and conventional ones in x direction with amplitude of 2 pixel

[21]  
[21]  
(SIFT)

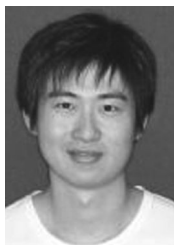
## 5 结 论

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