



# Piecewise Planar Super-Resolution for 3D Scene

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# Outline

- Background of super-resolution
- Related work
- Model introduction
- Proposed method
- Experiments and results
- Conclusion

# Background of super-resolution

- Reconstruct a high resolution image with one or multiple low resolution images.
- Compensation for the limit of the camera device.
- Use for image or video enhancement.

# Related work

- Single-view image resolution

J. Yang, J. Wright, T. S. Huang, and Y. Ma, "Image super-resolution via sparse representation."

**Disadvantage:** cannot take advantages from multiviews.

- Multi-view image resolution

S. Farsiu, D. Robinson, M. Elad, and P. Milanfar, "Fast and robust super-resolution."

A. V. Bhavsar and A. Rajagopalan, "Resolution enhancement in multi-image stereo."

**Disadvantage:** some algorithms only solve for 2D images; or largely depends on the accurate depth estimation to reconstruct for 3D scene.

# Model introduction

$$Y_k = DHW_k I_{X_0}, k = 0, 1, 2, \dots, K - 1.$$

- $I_{x0}$  is the reference image frame;  $W_k$  is some warp transform (the transform may be different for different parts of the image since it is a 3D scene image); H is the blur kernel; D is the down-sampling operator;  $Y_k$  is the low resolution image of the k-th frame.
- The question is how to reconstruct the high resolution image from multiview low resolution images.
- **Solution:** Segment images into piecewise planar parts and estimate the  $W_k$  transform for each part!

# Proposed method

- Depth estimation by graph cut

Y. Boykov, O. Veksler, and R. Zabih, "Fast approximate energy minimization via graph cuts."

The depth information is only used for plane segmentation.

- Plane segmentation

We label each pixel point by minimizing the following object function,

$$l_{p_0} = \arg \min_l \left( |1 - n_l^T p_0|^2 + \lambda \sum_{p \in C(p_0)} |l - l_p|^2 \right)$$

# Proposed method

- Homography and warp transform estimation  
Here we update the pixel label by minimizing the intensity difference for the same point from different frames,

$$l_{p_0} = \arg \min_{l=1,2,\dots,m_{opt}} \left( \sum_{k=1,2,\dots,K-1} \sum_{p_l \in C(p_0)} d_k(p_l) \right)$$

where the intensity difference is defined below,

$$d_k(p_\pi) = |I(p_\pi) - I(H_{\pi,k}p_\pi)|^2 V_{p_\pi} / N_{C(p_\pi)}$$

Finally after label updated, we estimate the transform by labeled feature points.

# Proposed method

- Image reconstruction

Project the reconstructed image into image subspace by using Tikhonov regularization,

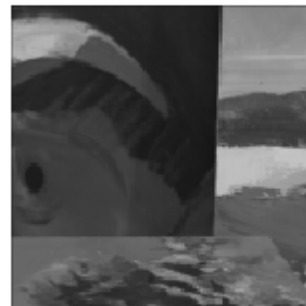
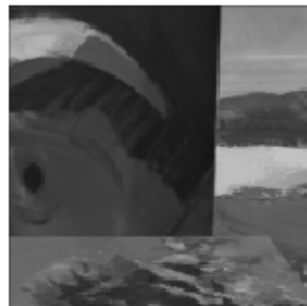
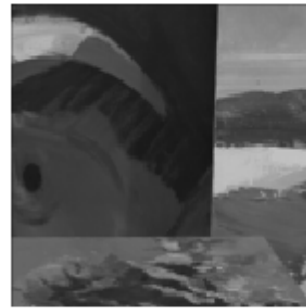
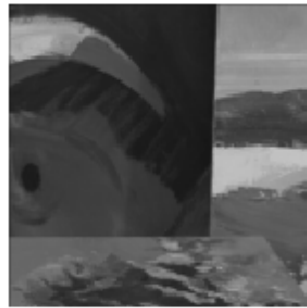
$$\hat{I}_{X_0} = \arg \min_{I_{X_0}} \left\{ \sum_{k=1}^K \|QM_k I_{X_0} - QY_k\|_2^2 + \alpha \|LI_{X_0}\|_2^2 \right\}$$

Here, we use a diagonal matrix  $Q$  to remove the occlusion and artifacts between plane boundaries. We set the diagonal elements equal to zero if they are invisible.

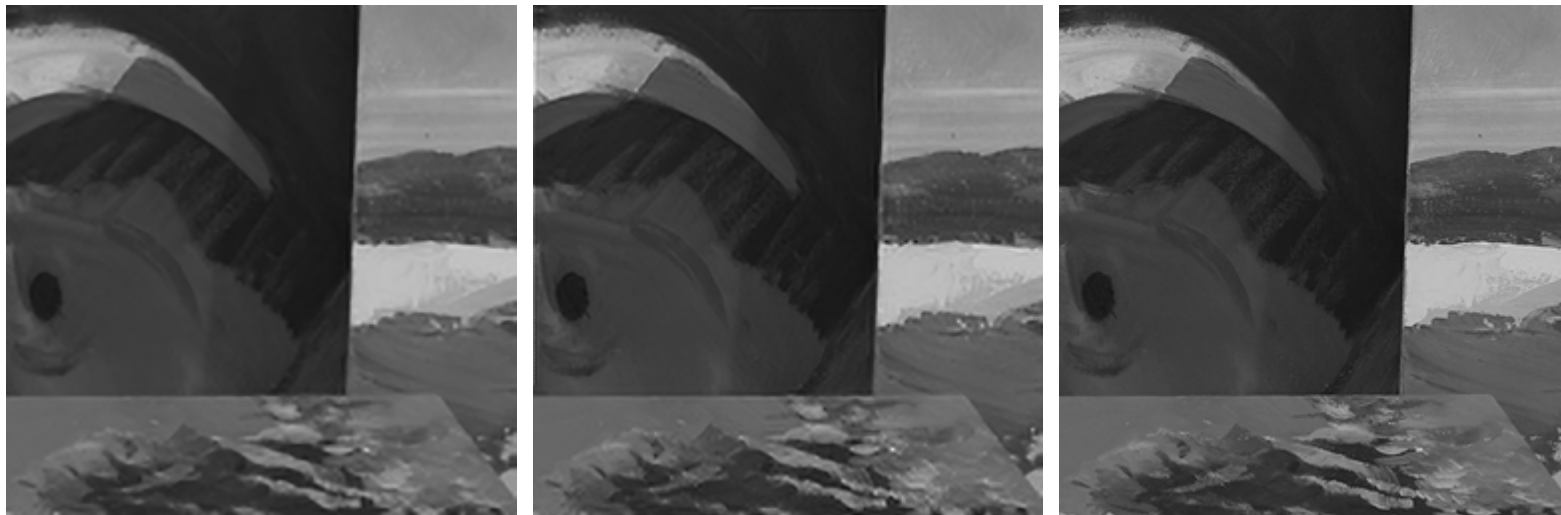


# Experiments and results

- "Bull" images from Middlebury dataset  
Four low resolution images are shown below.

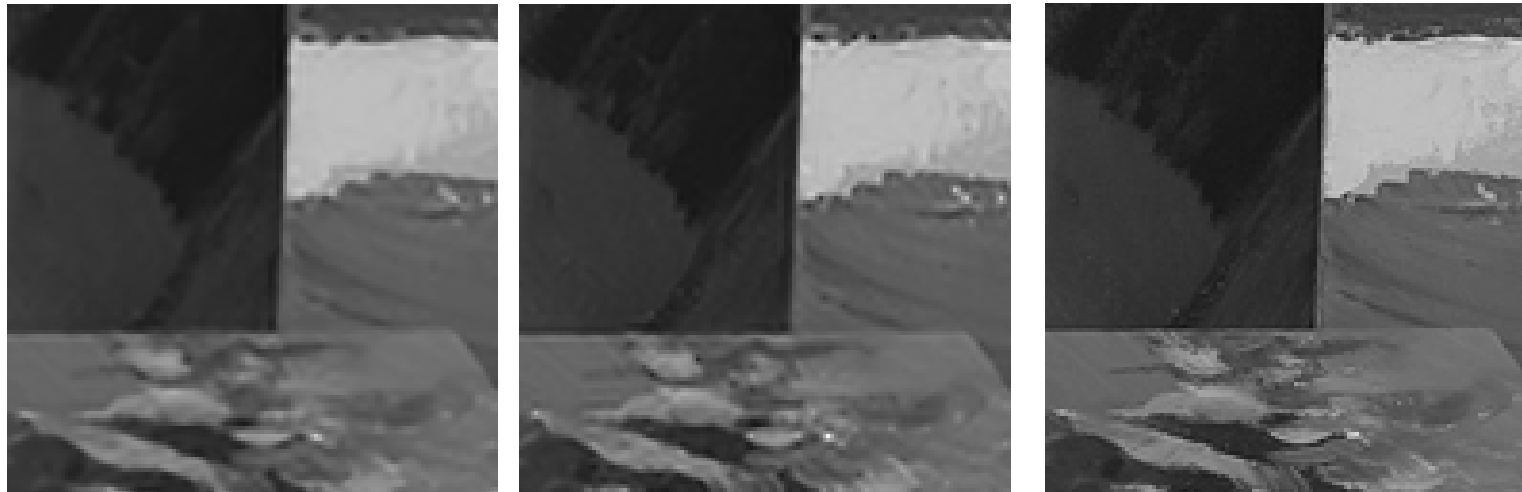


# Experiments and results



From left to right: Single-view SR (PSNR = 35.1667),  
Proposed method (PSNR = 35.3245), Ground truth.

# Experiments and results

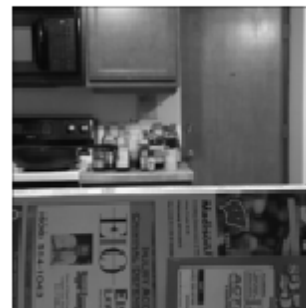


Cropped image results. From left to right: Single-view SR, Proposed method, Ground truth.

# Experiments and results

- Kitchen Scene

Four low resolution images are shown below.



# Experiments and results



From left to right: Single-view SR (PSNR = 28.0398),  
Proposed method (PSNR = 29.3387), Ground truth.

# Experiments and results



Cropped image results. From left to right: Single-view SR, Proposed method, Ground truth.

# Conclusion and future work

- With combined information from multiview low resolution images, we can get a better performance than single view reconstruction.
- We will look for solutions that combines the advantages from both single-view and multiview super-resolution.