

COMP576: Image Denoising using Convolutional Neural Network

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Introduction and Motivation

- Taking photos with smartphones has become a popular way for people to record their lives. However, image denoising still remains one of the most challenging tasks when it comes to processing smartphone images.
- Deep learning techniques have received much attention in the area of smartphone image denoising.

Goal

Developing and training a CNN-based model that can demonstrate better performances of image denoising by comparing results of different network structures.

Dataset

- Smartphone Image Denoising Dataset (SIDD)^{[1][2]}
- Captured under different lighting conditions using five representative smartphone cameras
- Generated ground truth images
- 160 image pairs (noisy and ground-truth), 160 scene instances

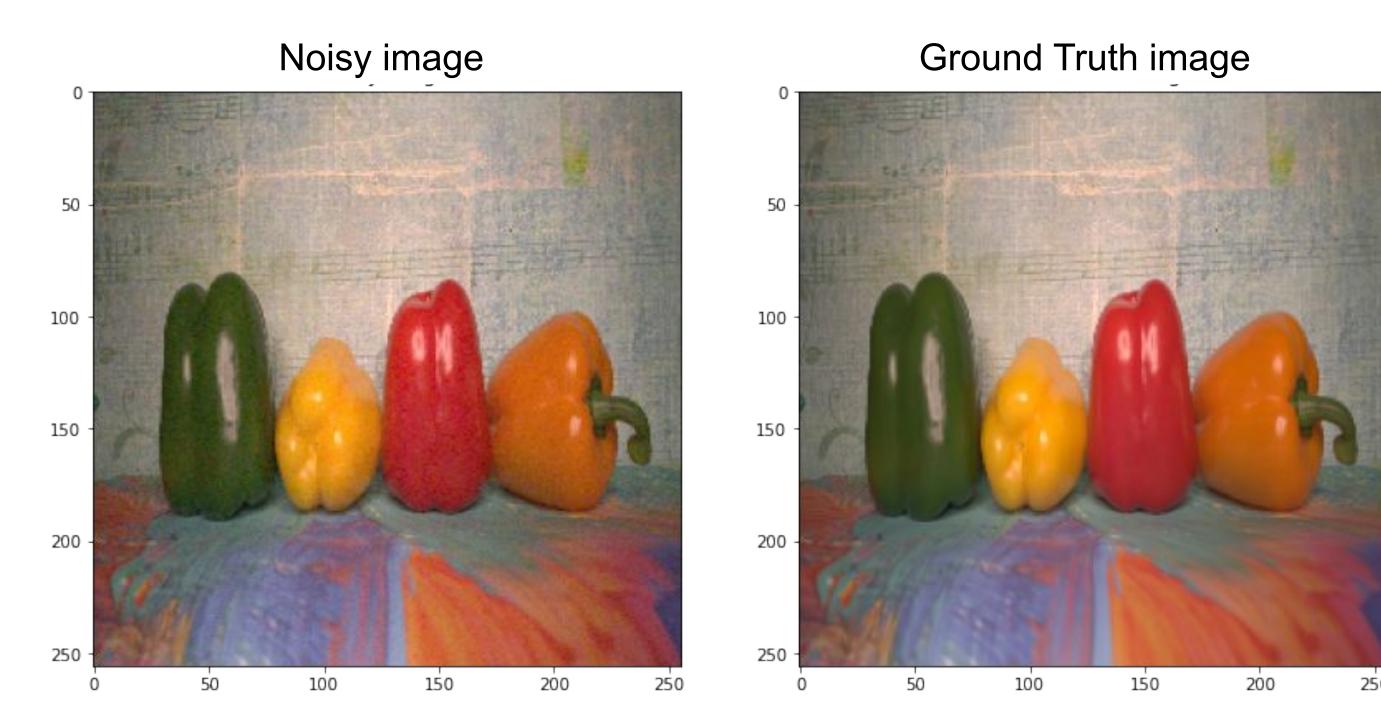


Figure 1. A pair of sample dataset

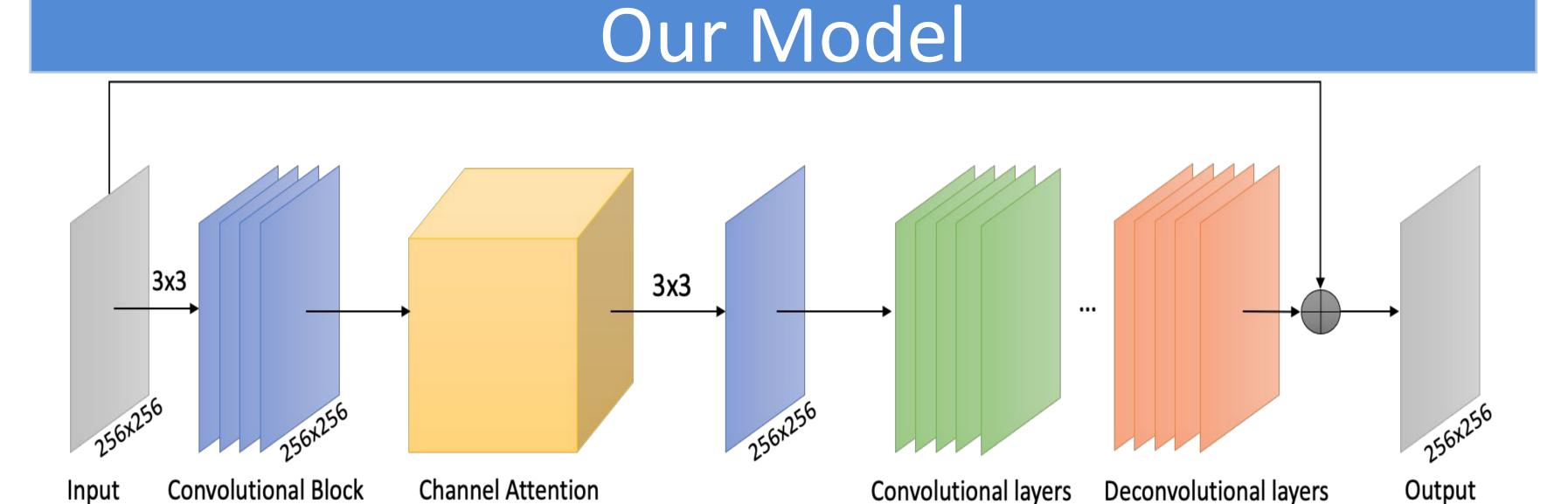


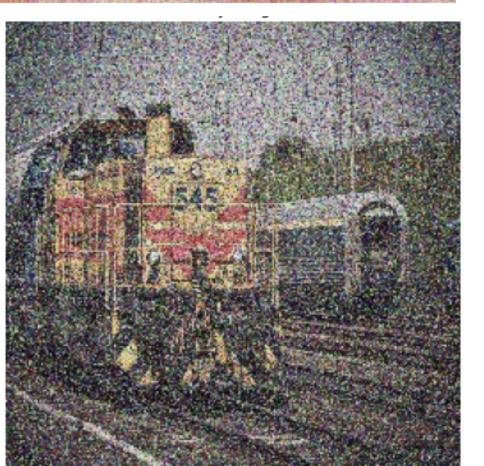
Figure 2. Architecture of the Model

- Build a new CNN-based image denoising model which contains channel attention and a REDNet (Residual Encoder-Decoder Networks).
- Compare our model with previous methods, REDNet^[3], and PRIDNet^[4].
- Vary convolution and deconvolution layers in our model and REDNet.

Experiments

We test our trained model on noisy images to visualize denoising performance. The eyecloseup and rail train image were from Online Dataset. We can see that noise in predicted images is much less than original images.







Predicted image



Figure 3. Test images

Results & Discussion

| Model | PSNR | SSIM | PSNR Improvement | SSIM improvement |
|----------------------------------|---------|--------|------------------|------------------|
| Original X-y pairs (No Model) | 26.3779 | 0.6000 | _ | - |
| REDNet_5layers | 32.1988 | 0.7725 | 5.8209 | 0.1725 |
| REDNet_9layers | 32.7721 | 0.7728 | 6.3942 | 0.1728 |
| REDNet 15layers | 33.1718 | 0.7738 | 6.7939 | 0.1738 |
| REDNet 5layers (using Attention) | 33.5744 | 0.7785 | 7.1965 | 0.1785 |
| PRIDNet (using Attention) | 33.3105 | 0.8049 | 6.9326 | 0.2049 |

Table 1. Result of different CNN based image denoising methods

- Our model (REDNet_5layers (using Attention)) has about 7.2 increase in PSNR and 0.18 increase in SSIM from original pairs, which means predicted image using our model can have a "closer" quality and structural similarity to the ground truth image.
- Adding layers will increase the quality of image by denoising

Conclusion & Further Work

- We proposed a new CNN-based image denoising model by combing channel attention and a REDNet.
- The new model demonstrated higher performance with its better metrics (PSNR, SSIM) and structural simplicity (compared to PRIDNet).
- Potential improvements/considerations include:
- Training on larger dataset (SIDD-Full Dataset)
- Using larger number of epochs
- Using K-Fold Cross Validation, if possible

References

[1] Abdelrahman Abdelhamed, Lin S., Brown M. S. "A High-Quality Denoising Dataset for Smartphone Cameras", IEEE Computer Vision and Pattern Recognition (CVPR), June 2018.

[2] Abdelrahman Abdelhamed, Timofte R., Brown M. S., et al. "NTIRE 2019 Challenge on Real Image Denoising: Methods and Results", IEEE Computer Vision and Pattern Recognition Workshops (CVPRW), June 2019.

[3] Mao, Xiao-Jiao, et al. Image Restoration Using Convolutional Auto-Encoders with Symmetric Skip Connections. 30 Aug. 2016, doi:10.48550/arXiv.1606.08921.

[4] Y. Zhao, Z. Jiang, A. Men and G. Ju, "Pyramid Real Image Denoising Network," 2019 IEEE Visual Communications and Image Processing (VCIP), 2019, pp. 1-4, doi: 10.1109/VCIP47243.2019.8965754.