



Low Light Image Enhancement Based on Two-Step Noise Suppression

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Low Light Image Enhancement (LLIE)

- **Low light condition:** Low SNR, much noise, low contrast, weak color;
- **LLIE:** Over-enhancement, noise amplification in HVS after CE;
- **Our approach:**
 - 1) Two-step noise suppression;
 - 2) Adopt NLF and JND for perceptual CE;

Proposed Method

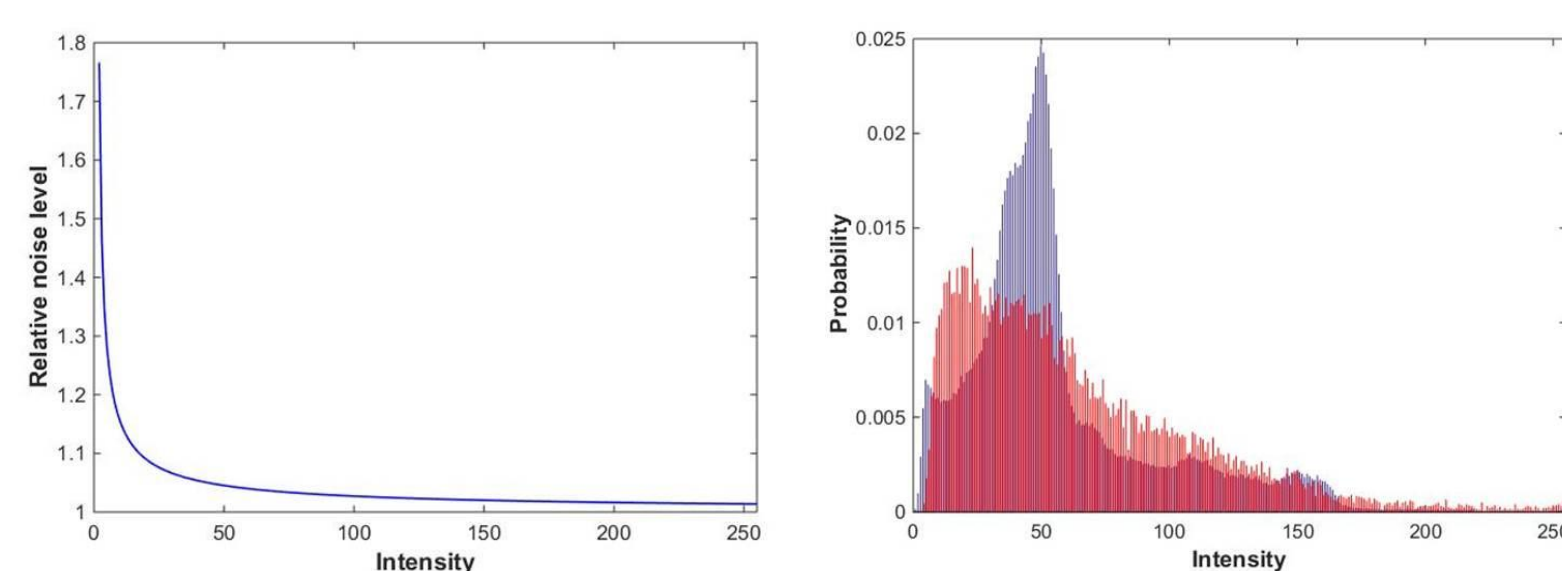
• Noise Aware CE

- Noise aware histogram: Adjusting histogram by **high contrast pixels** from NLF (not corrupted by noise) [1][2];

$$p(I) = \frac{\sum_{(x,y) \in B_I} l(x,y)}{\sum_{(x,y) \in S} l(x,y)}$$

where $S = \{(x,y) : c(x,y) > n(x,y)\}$

$$B_I = \{(x,y) \in S : I = 0, 1, \dots, 255\}$$



Noise level function (NLF)

Noise aware histogram
(Blue: original, Red: noise aware)

- Global CE by AGCWD [3]

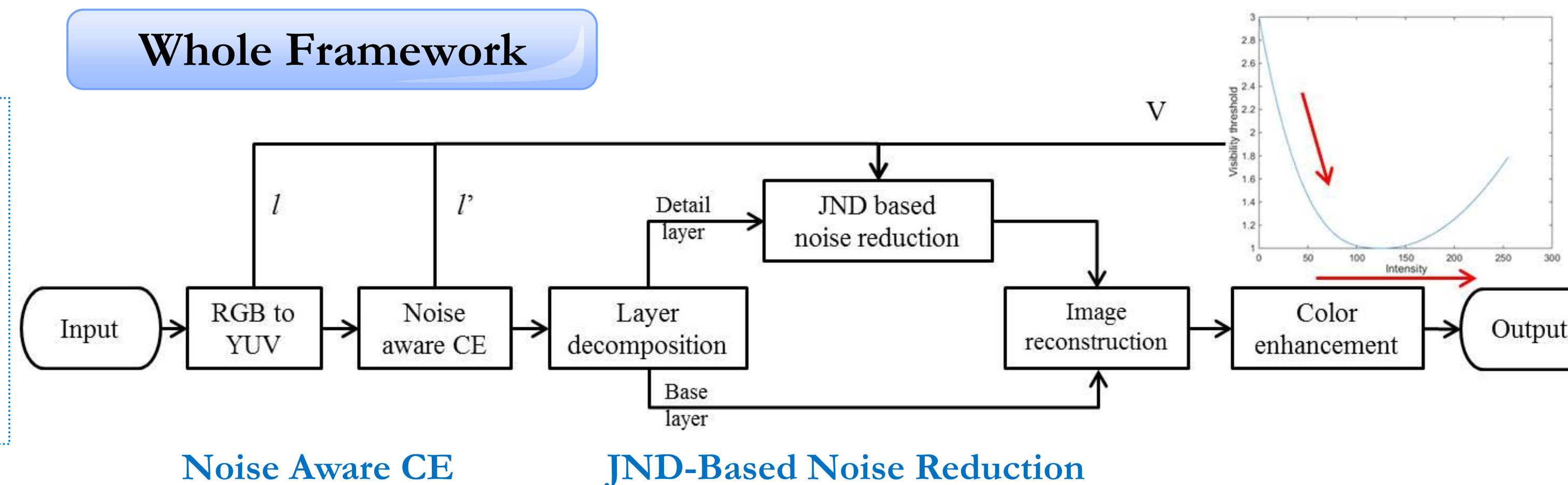
• JND-Based Noise Reduction

- 1) Noise becomes obvious after CE due to the decrease of JND thresholds (**luminance adaptation**);
- 2) Noise amplification is more severe in smooth regions than textural regions (**contrast masking**);

- We perform noise reduction in detail layer using JND model (**low contrast pixels**) as follows [4]:

$$d_{out}(x,y) = e \cdot \frac{V(l'_{(x,y) \in \bar{v}}(x,y))}{V(l_{(x,y) \in \bar{v}}(x,y))} d(x,y)$$

Whole Framework

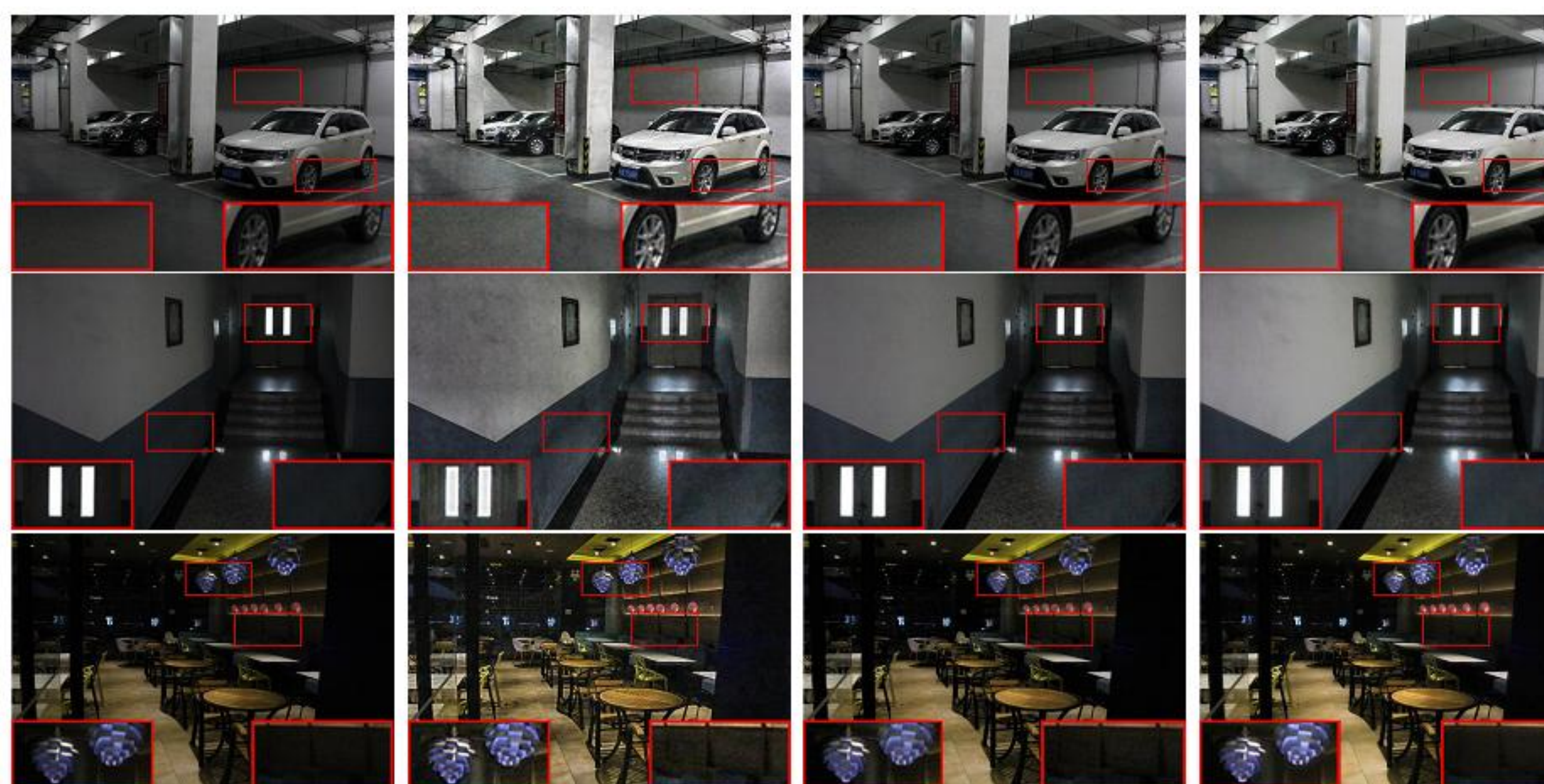


Noise Aware CE

JND-Based Noise Reduction

Experimental Results

• Visual Comparison



LL images

ACEWC[5]

CADIE[6]

Proposed

• Objective Evaluation

Method	Luminance	Contrast	Structure
Proposed	1.5873	1.4754	0.9833
ACEWC [5]	1.7088	1.2886	0.9164
CADIE [6]	1.3170	1.1679	0.9875

Conclusions

- **LLIE based on two-step noise suppression;**
- **Noise aware CE** for high contrast pixels based on noise aware histogram;
- **JND-based noise reduction** for low contrast pixels using JND model (JND from luminance adaptation; Detail layer)
- Experiment results demonstrate that the proposed method **successfully enhances contrast** in low light images **while minimizing noise amplification**.

References

- [1] G. Eilertsen, R. K. Mantiuk, and J. Unger, "Real-time noise-aware tone mapping," *ACM Trans. Graph*, vol. 34, no. 6, pp. 1–15, Nov. 2015.
- [2] X. Liu, M. Tanaka, and M. Okutomi, "Practical signal dependent noise parameter estimation from a single noisy image," *IEEE Transactions on Image Processing*, vol. 23, no. 10, pp. 4361–4371, Oct. 2014.
- [3] S.-C. Huang, F.-C. Cheng, and Y.-S. Chiu, "Efficient contrast enhancement using adaptive gamma correction with weighting distribution," *IEEE Transactions on Image Processing*, vol. 22, no. 3, pp. 1032–1041, Mar. 2013.
- [4] X. H. Zhang, W. S. Lin, and P. Xue, "Improved estimation for just-noticeable visual distortion," *Signal Processing*, vol. 85, no. 4, pp. 795–808, Oct. 2005.
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