

# Naturalness-Preserved Tone Mapping in Images Based on Perceptual Quantization

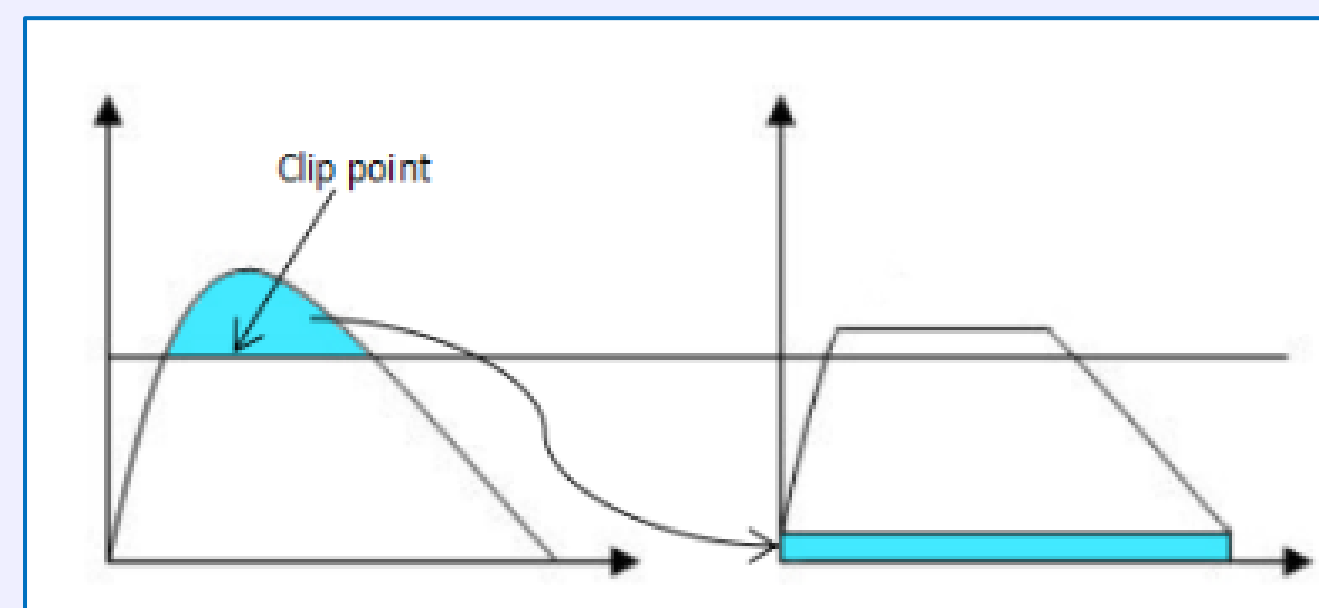
Cheolkon Jung and Kaiqiang Xu

School of Electronic Engineering, Xidian University, China



## CLAHE

- Contrast limited adaptive histogram equalization (CLAHE): Histogram redistribution based on a clip point
- Still causing over-enhancement in smooth regions without considering human visual perception in the clip point



Histogram redistribution



Over-enhancement

## References

- [1] G. W. Larson, H. Rushmeier, and C. Piatko, "Avisibility matching tone reproduction operator for high dynamic range scenes," *IEEE Transactions on Visualization and Computer Graphics*, 3(4): 291–306, 1997.
- [2] S. Miller, M. Nezamabadi, and S. Daly, "Perceptual signal coding for more efficient usage of bit codes," *SMPTE Motion Imaging Journal*, 122(4): 52–59, 2013.
- [3] T. Celik and T. Tjahjadi, "Contextual and variational contrast enhancement," *IEEE Transactions on Image Processing*, 20(12): 3431–3441, 2011.
- [4] Q. Wang and R. K. Ward, "Fast image/video contrast enhancement based on weighted thresholded histogram equalization," *IEEE Transactions on Consumer Electronics*, 53(2): 757–764, 2007.
- [5] A. R. Rivera, B. Ryu, and O. Chae, "Content-aware dark image enhancement through channel division," *IEEE Transactions on Image Processing*, 21(9): 3967–3980, 2012.
- [6] 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*, 22(3): 1032–1041, 2013.

## Proposed Method

- Histogram adjustment based on human contrast sensitivity (Population of local adaptation luminance in a scene)
- Contrast visibility thresholds:

$$\frac{dL_d}{dL_w} \leq \frac{\Delta L(L_d)}{\Delta L(L_w)} \quad \begin{array}{l} L_d: \text{Display luminance} \\ L_w: \text{Scene luminance} \\ \Delta L(L_d): \text{Just noticeable difference (JND)} \end{array}$$

- Constraint curve for histogram adjustment [1]:

$$f(b_i) \leq \frac{T}{N} \cdot \frac{\log(L_{wmax}) - \log(L_{wmin})}{\log(L_{dmax}) - \log(L_{dmin})} \cdot \frac{\Delta L(L_{di})/L_{di}}{\Delta L(L_{wi})/L_{wi}}$$

$f(b_i)$ : Frequency count for histogram bin  $b_i$ ,  $T$ : Sum of pixels

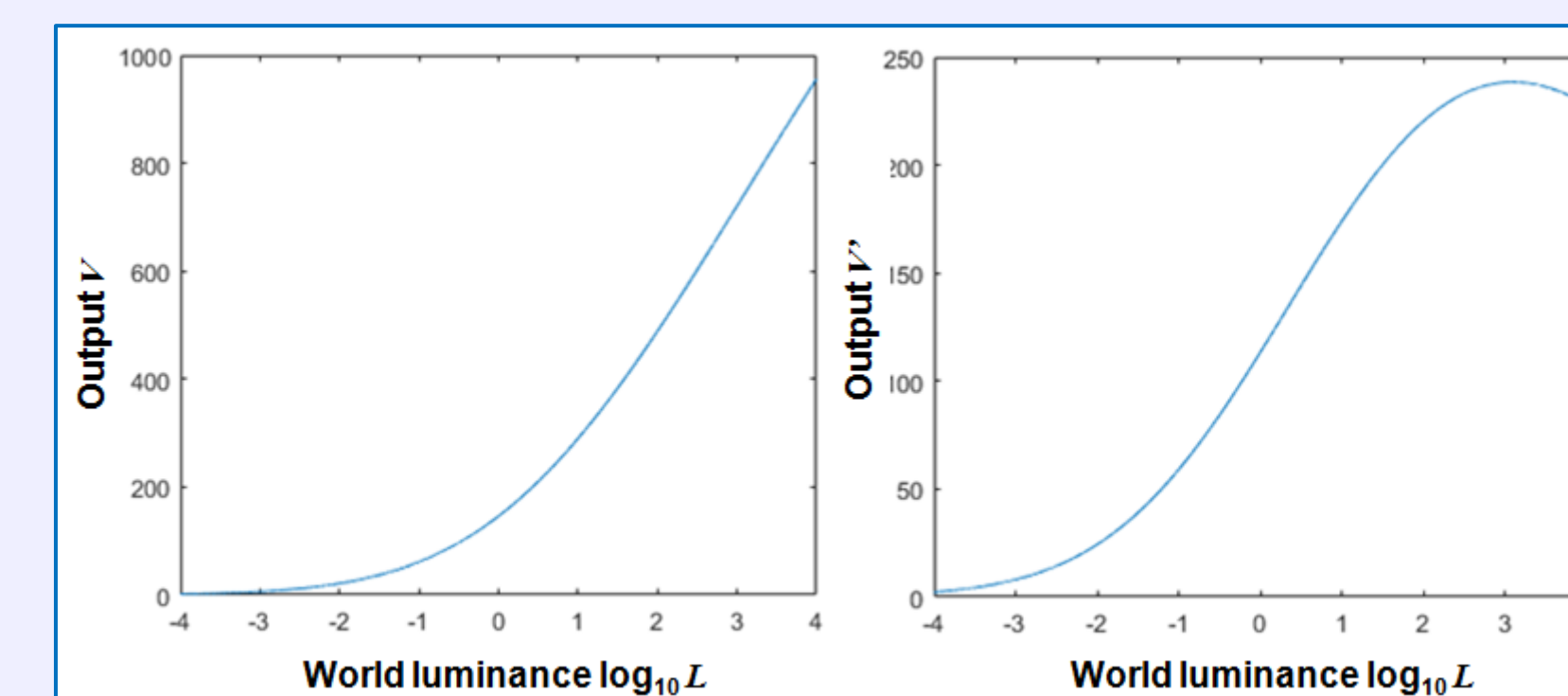
- Perceptual quantization (PQ) transfer function for 10bit videos [2]:

$$V(L) = v_{max} \cdot \left( \frac{c_1 + c_2(L_1^{10}/10000)^{m_1}}{1 + c_3(L_1^{10}/10000)^{m_1}} \right)^{m_2}$$

$L_1$ : Log10 luminance  
 $m_1, m_2, c_1, c_2, c_3$ : Constants

- Derivative of PQ transfer function:

$$V'(L_1) = \log(10) \cdot L / \Delta L$$



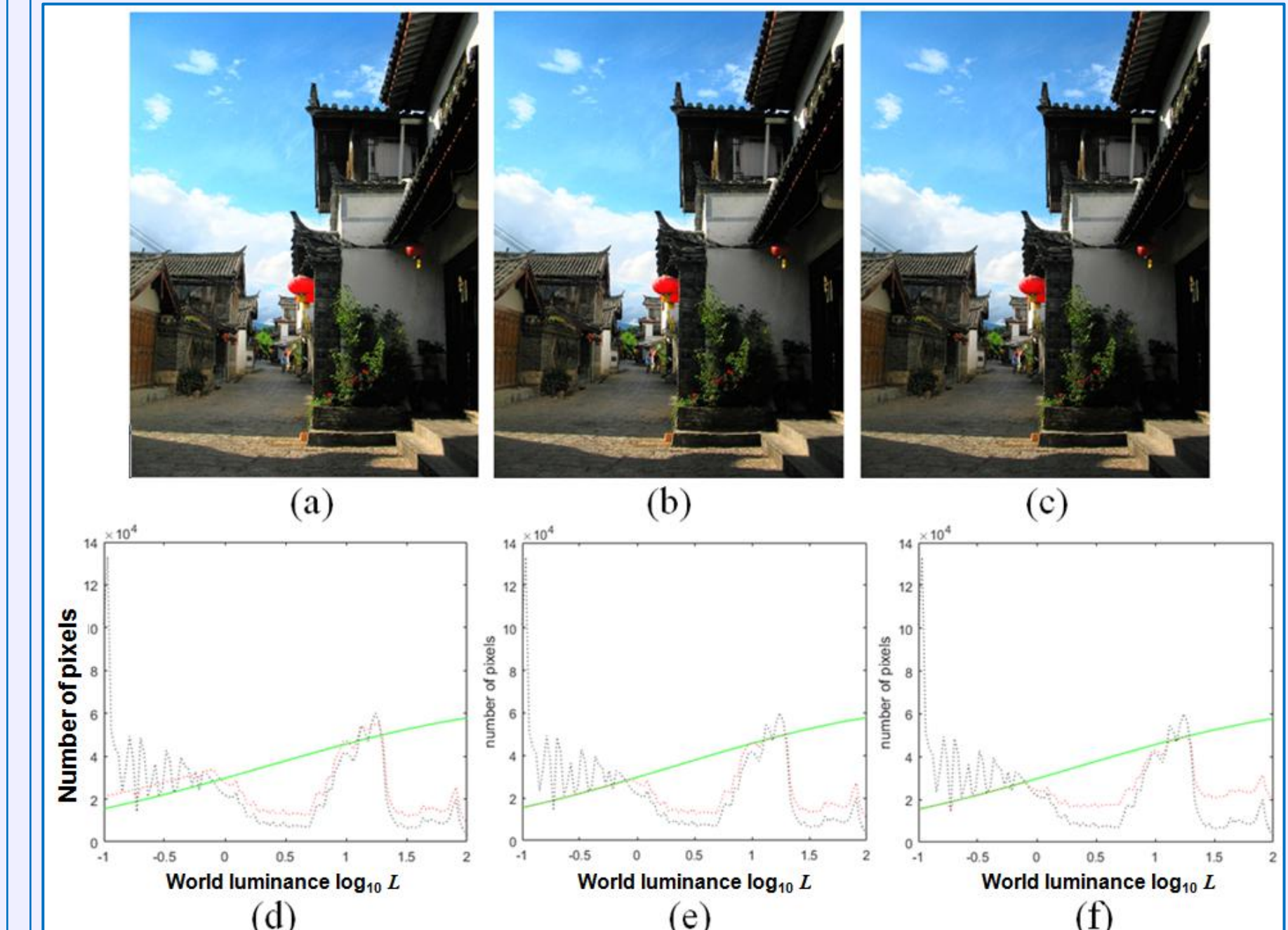
PQ transfer function and its derivative

- New constraint curve using relationship between the slopes of tone mapping and HVS model curves:

$$\frac{f(b_i)}{T} \leq k \cdot \frac{V'(L_{1i})}{\sum_{i=1}^n V'(L_{1i})}$$

$k$ : Constant to adjust tone mapping results

- Histogram redistribution based on the new constraint curve



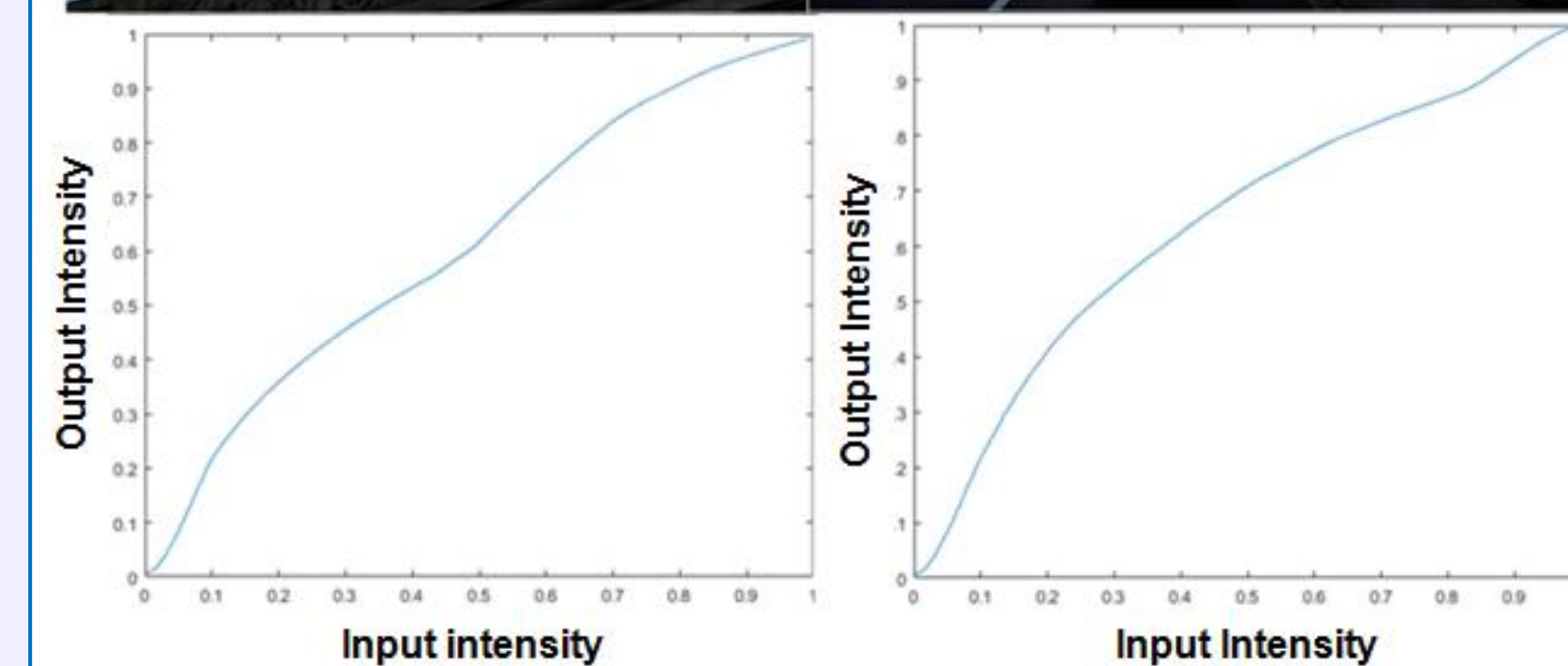
Contrast enhancement results and their histograms

(a) CLAHE. (b) [12]. (c) Proposed method. (d), (e), and (f) Processed histograms and their limit curves of (a), (b), and (c).  
Black: Untreated histogram.  
Green: Constraint curve.  
Red: Histogram after processing.

## Experimental Results



Input image (DSCN), CVC [3], WTHE [4], ChDiv [5], AGCWD [6], and proposed method.



Top: Original images of DSCN and Town.  
Middle: Results by the proposed method.  
Bottom: Mapping curves.

Method	Input	CVC	WTHE	ChDiv	AGCWD	Proposed
DE	6.9825	7.0162	7.0064	7.1996	7.270	7.2981
FSIM	1	0.8956	0.8611	0.8882	0.9325	0.9375

Discrete entropy (DE): Degree of details  
Feature similarity (FSIM): Overall feature preservation

## Conclusions

- We have proposed naturalness-preserved tone mapping based on PQ.
- We have generated a new constraint curve based on HVS model (PQ) to adjust the contrast enhancement degree.
- We have redistributed the histogram of images using the constraint curve.
- Experimental results demonstrate that the proposed method achieves a good performance in contrast enhancement and produces natural-looking results.