

## Challenges:

In low lighting condition,

- capturing an image via a *long exposure time* and a *small ISO value*  $\implies$  *clean but blurred*.
- capturing an image via a *short exposure time* and a *large ISO value*  $\implies$  *sharp but noisy*.

## Solution:

Capturing an image via a *small exposure time* and a *small ISO value*  $\implies$  *clean, sharp but dark*  
Applying a brightening algorithm to increase the brightness  $\implies$  *clean, sharp and bright*

## Single Image Brightening

- **Step 1:** Three *virtual differently exposed images* are generated from an image which is captured via a small exposure time and a small ISO value.
- **Step 2:** A simple algorithm is designed to fuse the three virtual differently exposed images in a new color space to produce the *brightened image*.

### Generation of Virtual Differently Exposed Images

Given an input image  $Z$ . The first virtual image  $\hat{Z}_1$  is generated by using a non-decreasing function to brighten the under-exposed regions of the image  $Z$  as well as a global factor to increase the brightness of the whole image with negligible increment on the brightness of the brightest areas. The image  $\hat{Z}_1$  is produced as

$$\hat{Z}_{1,c}(p) = Y(p)(1 + \exp^{-14Y^{1.6}(p)})Z_c(p)$$

- $c$ : the color channel
- $Y(p)$ : the luminance component of the pixel  $Z(p)$

The second and the third images are generated follows:

$$\hat{Z}_{2,c}(p) = \frac{5(256 - \bar{y})}{32} \hat{Z}_{1,c}(p)$$

$$\hat{Z}_{3,c}(p) = \frac{256 - \bar{y}}{4} \hat{Z}_{1,c}(p)$$

- $\bar{y}$ : the average value of the luminance components of all under-exposed and well-exposed pixels

## Fusion of Differently Exposed Images in a New Color Space

A simplified CIELAB color space is introduced as follows:

$$\begin{cases} \tilde{Z}_{i,1}(p) = \Psi(\tilde{Z}_{i,2}(p)) - 32 \\ \tilde{Z}_{i,2}(p) = 2(\Psi(\tilde{Z}_{i,1}(p)) - \Psi(\tilde{Z}_{i,2}(p))) \\ \tilde{Z}_{i,3}(p) = \Psi(\tilde{Z}_{i,2}(p)) - \Psi(\tilde{Z}_{i,3}(p)) \end{cases}$$

- $\tilde{Z}_{i,2}(p)$ ,  $\tilde{Z}_{i,1}(p)$  and  $\tilde{Z}_{i,3}(p)$ : 
$$\begin{cases} \tilde{Z}_{i,1}(p) = \frac{126\tilde{Z}_{i,1}(p) + 79\tilde{Z}_{i,2}(p) + 51\tilde{Z}_{i,3}(p)}{256} \\ \tilde{Z}_{i,2}(p) = \frac{45\tilde{Z}_{i,1}(p) + 208\tilde{Z}_{i,2}(p) + 3\tilde{Z}_{i,3}(p)}{256} \\ \tilde{Z}_{i,3}(p) = \frac{3\tilde{Z}_{i,2}(p) + 253\tilde{Z}_{i,3}(p)}{256} \end{cases}$$
- $\Psi(z)$ : 
$$\Psi(z) = \begin{cases} 16z^{0.5}, & \text{if } z \geq 64 \\ z + 64; & \text{otherwise} \end{cases}$$

One color component  $\tilde{Z}_{i,1}(p)$  is fused via the multi-scale algorithm:

$$L\{\tilde{Z}_1^{(f)}(p)\}^l = \sum_{i=1}^3 [L\{\tilde{Z}_{i,1}(p)\}^l G\{W_i(p)\}^l]$$

- $L\{\tilde{Z}_{i,1}(p)\}^l$ : Laplacian pyramid of image  $\tilde{Z}_{i,1}$
- $G\{W_i(p)\}^l$ : Gaussian pyramid of weight map  $W_i(p)$

Two color components are fused together via a single-scale method as follows:

$$\tilde{Z}_c^{(f)}(p) = \frac{\sum_{i=1}^3 W_i(p) \tilde{Z}_{i,c}(p)}{\sum_{i=1}^3 W_i(p)}; \quad c = 2, 3$$

The final image is computed as:

$$\begin{cases} Z_1^{(f)}(p) = \frac{601\Psi^{-1}(\tilde{Z}_1^{(f)}(p)) - 227\Psi^{-1}(\tilde{Z}_2^{(f)}(p)) - 118\Psi^{-1}(\tilde{Z}_3^{(f)}(p))}{256} \\ Z_2^{(f)}(p) = \frac{-130\Psi^{-1}(\tilde{Z}_1^{(f)}(p)) + 364\Psi^{-1}(\tilde{Z}_2^{(f)}(p)) + 22\Psi^{-1}(\tilde{Z}_3^{(f)}(p))}{256} \\ Z_3^{(f)}(p) = \frac{2\Psi^{-1}(\tilde{Z}_1^{(f)}(p)) - 4\Psi^{-1}(\tilde{Z}_2^{(f)}(p)) + 259\Psi^{-1}(\tilde{Z}_3^{(f)}(p))}{256} \end{cases}$$



Fig 1. An image captured at day time but with dark human subjects (Fig.1(a)) and its three virtual differently exposed images.

The details in the under-exposed regions of Fig. 1(a) are more visible in Fig. 1(d). With the three virtual differently exposed images, the brightest areas are well-exposed in the image Fig. 1(b), the darkest regions are well-exposed in Fig. 1(d), and other parts are well-exposed in Fig. 1(c). After three virtual differently exposed images are generated, they will be fused together to produce the final image.

## Brightening of Low-lighting Images

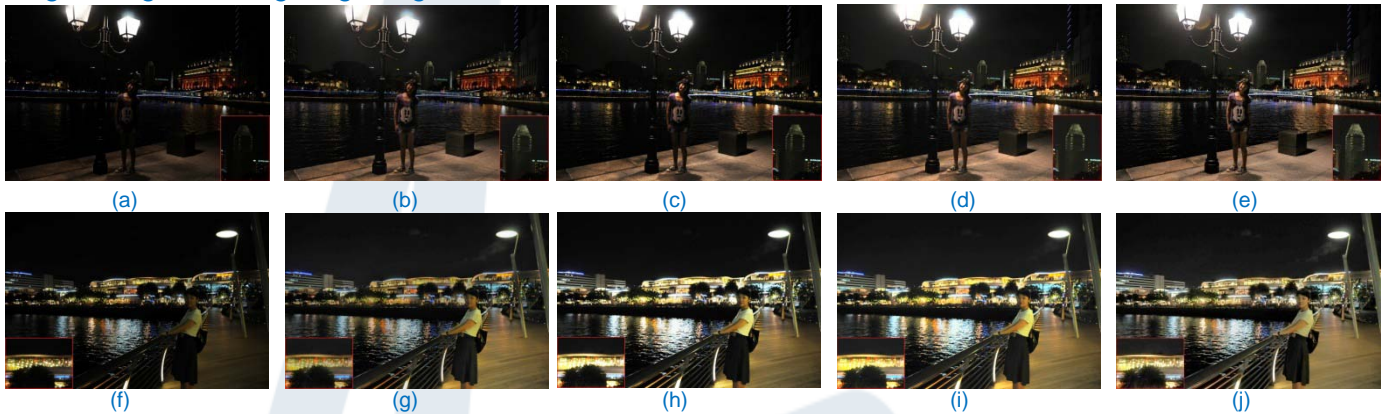


Fig. 2. Comparison of different image enhancement algorithms. (a, f) low-lighting images; (b, g) brightened images by the brightening algorithm [12]; (c, h) brightened images by the Photoshop CS5; (d, i) brightened images by the algorithm in [10]; (e, j) brightened images by the proposed algorithm.

## Brightening of Day-time Images with Dark Human Subjects

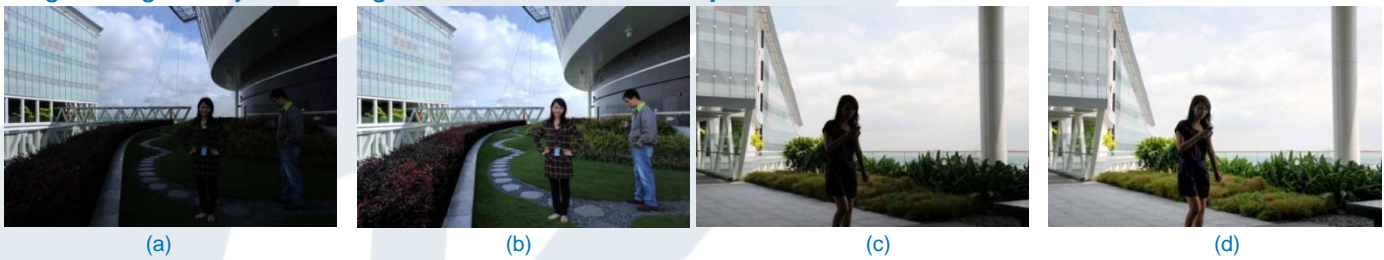


Fig. 3. Images with dark objects and the enhanced images. (a, c) images with dark objects; (b, d) brightened images by the proposed algorithm.

## Capturing of Images for HDR Scenes

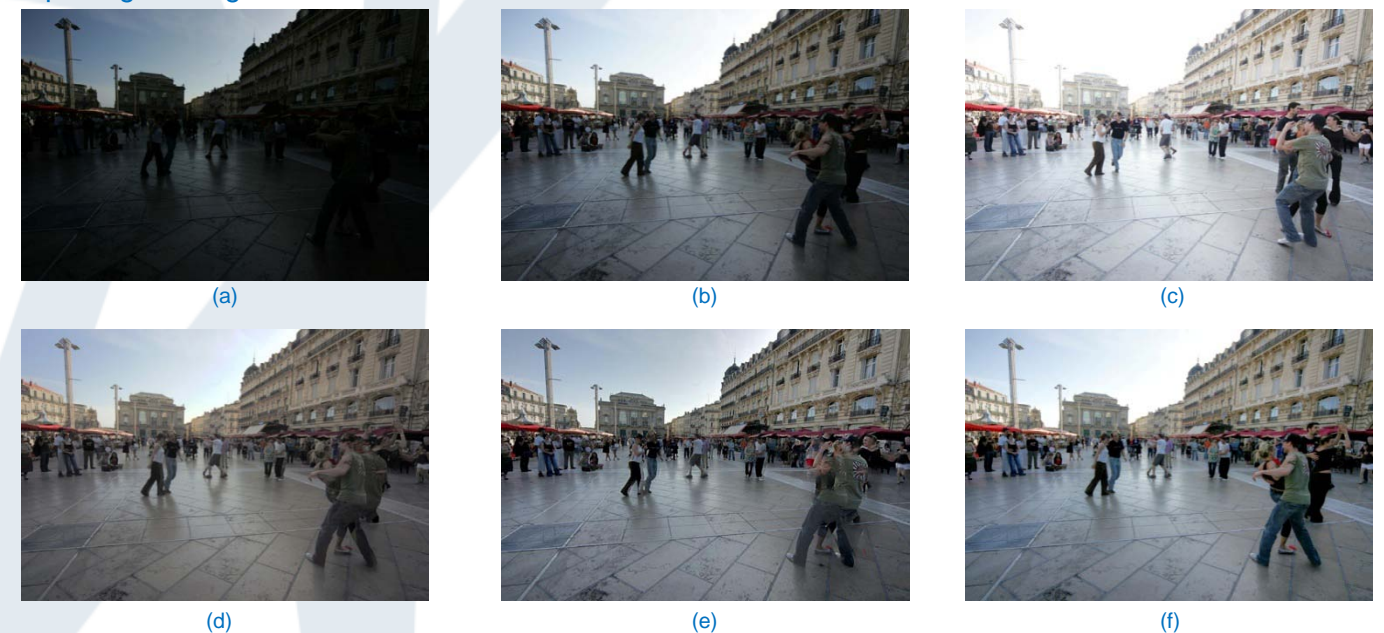


Fig. 4. Comparison of different HDR imaging methods. (a, b, c) three differently exposed images; (d) an image by the algorithm in [13]; (e) an image by the algorithm in [14]; (f) an image by the proposed brightening algorithm with the input image as in Fig.4(b).