

# Color correction for tone mapping

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**R. Mantiuk, R. Mantiuk, A. Tomaszewska, and W. Heidrich**

Presented by Jung-Yul Choi

***School of Electrical Engineering and Computer Science  
Kyungpook National Univ.***



# Abstract

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- ◆ Tone mapping algorithms
  - Offer sophisticated methods for mapping HDR to LDR
  - Changes in color appearance
- ◆ Measurement of change after tone mapping
  - Indication of relation between contrast compression and color saturation correction
- ◆ Proposal of color correction formulas
  - Available existing tone mapping algorithms

# Introduction

## ◆ Tone mapping algorithms

- Often cause changes in color appearance
- Luminance compression
  - Darker tones to appear brighter
  - Distort contrast relationships

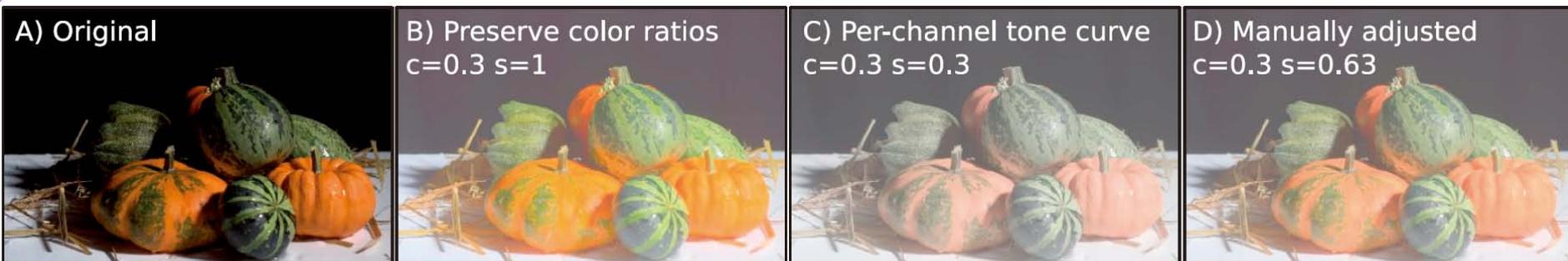


Fig. 1. An original image compared with three images after contrast compression.

## ◆ Object of this work

- Quantify and model correction in color saturation
- Distrust predictions of existing appearance models
  - Instead conduct subjective appearance matching
    - Measure necessary color correction
- Find new chrominance values
  - Tone mapped image closely matches appearance of image with no tone modification

# Related work

## ◆ Color reproduction

- Well studied in context of gamut mapping
- Gamut mapping
  - Modify both luminance and chrominance to preserve color appearance
  - Much smaller contrast compression than tone mapping
  - Operate on display-referred images
- Proposed method
  - Only modify chrominance
    - Tone mapping modify luminance
  - Operate on scene-referred images

## ◆ Color appearance studies

- Apparent colorfulness of uniform color patches
  - Vary with luminance, image size, and color of surround
  - Hunt effect
- Apparent lightness of color patches
  - Depend on chromacity
  - Helmholtz & Kohlrausch effect
- Apparent hue
  - Depend on luminance
  - Abney effect
- Perceived contrast of images
  - Decrease with reduced chroma
  - Sigmoidal relation

## ◆ Color reproduction in tone mapping

- Focus on preserving color appearance of real-world scene
- Pattanaik et al.
  - Introduce complex model of human color vision
  - Introduce opponent color processing
  - Gain control for both luminance and contrast signals
- Later work
  - Focus on aspects of temporal adaptation
    - Use photoreceptor model instead of luminance gain control
  - Employ simplified appearance model based on Hunt's model

## ◆ Color appearance model

### – iCAM color appearance model

- Achieve contrast compression
  - Applying spatially varying power function to three color channels in LMS color space

### – iCAM06 color appearance model

- Replace power function with photoreceptor response model
- Consider separately scotopic and photopic signals
- Account for perceived contrast change with adapting luminance level and with surround luminance
- Compensate for increased colorfulness with luminance

## – Akyuz and Reinhard

- Propose color processing framework
  - Adapt to any tone mapping that preserves ratios between color channels
- Use forward and then backward CIECAM02 model

## – Mentioned tone mapping operators

- Account for color differences
  - Result of different luminance and chromatic adaptation between real-world scene and display viewing conditions
- No considered change in color appearance

# Color correction in tone mapping

- ◆ Common approach to color treatment
  - Preserving color ratios

$$C_{out} = \frac{C_{in}}{L_{in}} L_{out} \quad (1)$$

where  $C$  is one of RGB color channels,  
 $L$  is pixel luminance, and  
 $in/out$  is pixels before and after tone mapping.

- Stronger contrast compression in tone mapping
  - Over-saturated result image

## ◆ Ad-hoc formula

$$C_{out} = \left( \frac{C_{in}}{L_{in}} \right)^s L_{out} \quad (2)$$

where  $s$  is color saturation control factor.

### – Drawback of equation

- Change resulting luminance for  $S \neq 1$  and for colors different from gray

$$k_R R_{out} + k_G G_{out} + k_B B_{out} \neq L_{out}$$

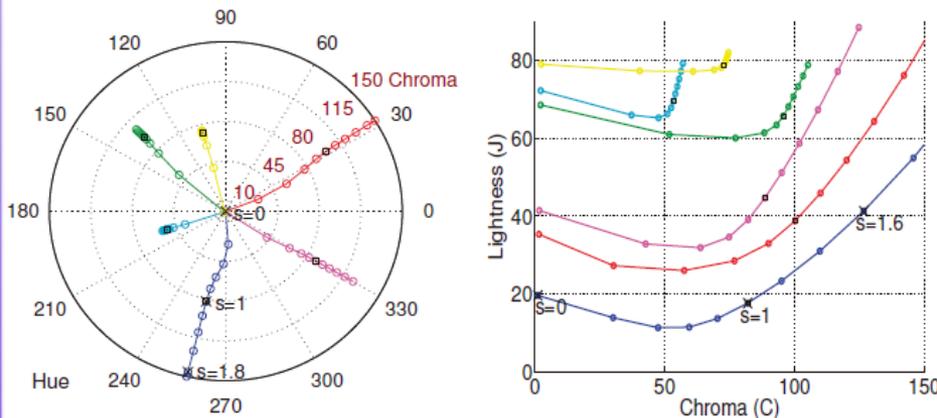
where  $k_{R,G,B}$  are linear factors to compute luminance for given color space.

# ◆ Introduction of another color correction

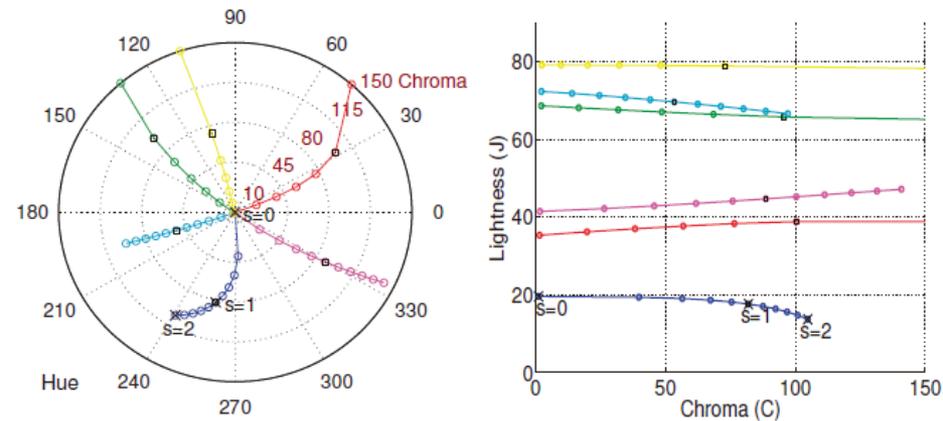
$$C_{out} = \left( \left( \frac{C_{in}}{L_{in}} - 1 \right) s + 1 \right) L_{out} \quad (3)$$

## – Difference between equation 2 and 3

- Change in  $S$  from Equation 2
  - Modification both chroma and lightness of colors
- Change in  $S$  from Equation 3
  - Prevent lightness, but lead to stronger hue shift



(a) Equation 2



(b) Equation 3

Fig. 2. CIECAM02 prediction of hue, chroma, and lightness for the non-linear (a) and luminance preserving (b) color correction formulas.

## ◆ Another approach to color treatment

- Apply same tone mapping curve to all color channels
  - Form of tone curve

$$L_{out} = (L_{in} b)^c \quad (4)$$

where  $b$  is brightness adjustment that normalizes for maximum display brightness.

- Another arbitrary tone-curve
  - Apply color correction factor  $s$  of Equation 2
    - » Not equivalent to  $s = c$
    - » Results are very close
- In case of local tone mapping operators
  - All channels usually cannot be modified simultaneously
  - Rely on color transfer formulas, such as Eq. 2 or 3

## ◆ Equations 2 and 3

- Convenient way of correcting colors in RGB
- Manual adjustment of parameter  $s$

## ◆ Object

- Estimation of color correction parameter  $s$  given luminance-specific tone-curve

# Experiment 1: color matching for tone mapping

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- ◆ Practice of subjective study
  - How much color correction is required to compensate for contrast compression?
- ◆ Participants of experiment
  - Split into two parts to test
    - Test group for non-linear Equation 2
    - Test group for luminance preserving Equation 3

# ◆ Stimuli

– 8 natural images in experiment



HDR: Pile of gourds



HDR: Ouchy



LDR: Violet



LDR: Grey, Gray and Blue



HDR: Memorial



HDR: Portrait



LDR: PDI



LDR: Half a face is better than a whole one

Fig. 3. HDR and LDR images used in the experiments.

- Image processing
  - Use Eq. 4 for contrast compression
    - Contrast factor  $c$  varied from 0.1 to 1.6
  - Use Eq. 2 and 3 for Color correction
    - Color saturation factor  $s$  were adjusted by participant
- Reduce luminance of input image
  - Use 33% of display peak luminance
  - Avoid out-of-gamut

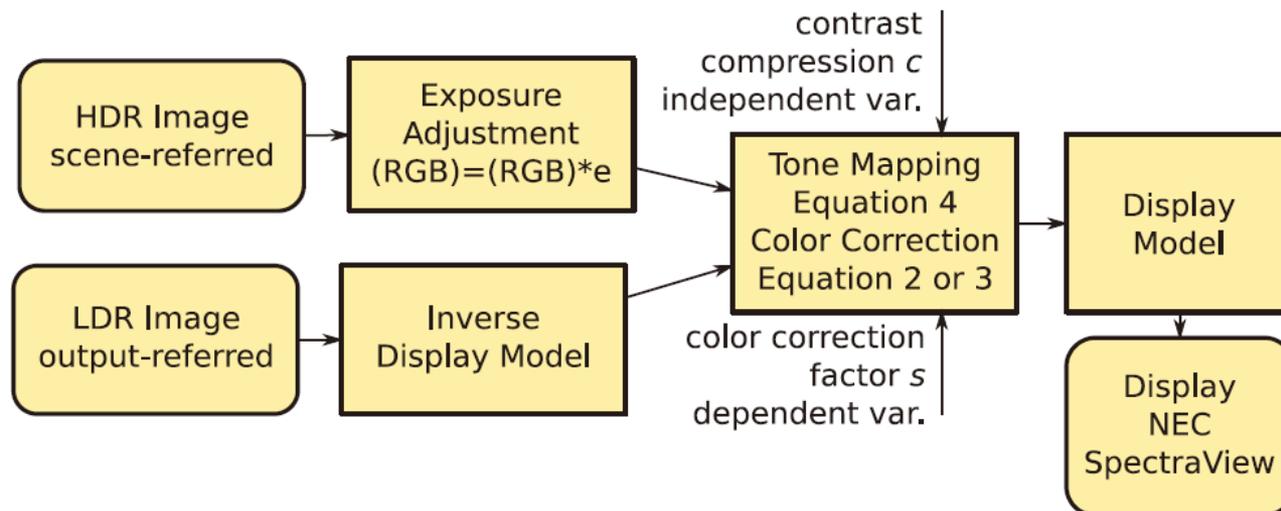


Fig. 4. Tone mapping and color correction used in the experiments.

## ◆ Experimental procedure

- Change color correction factor  $s$  by participants
- Matching colorfulness
  - Average of both left and right image

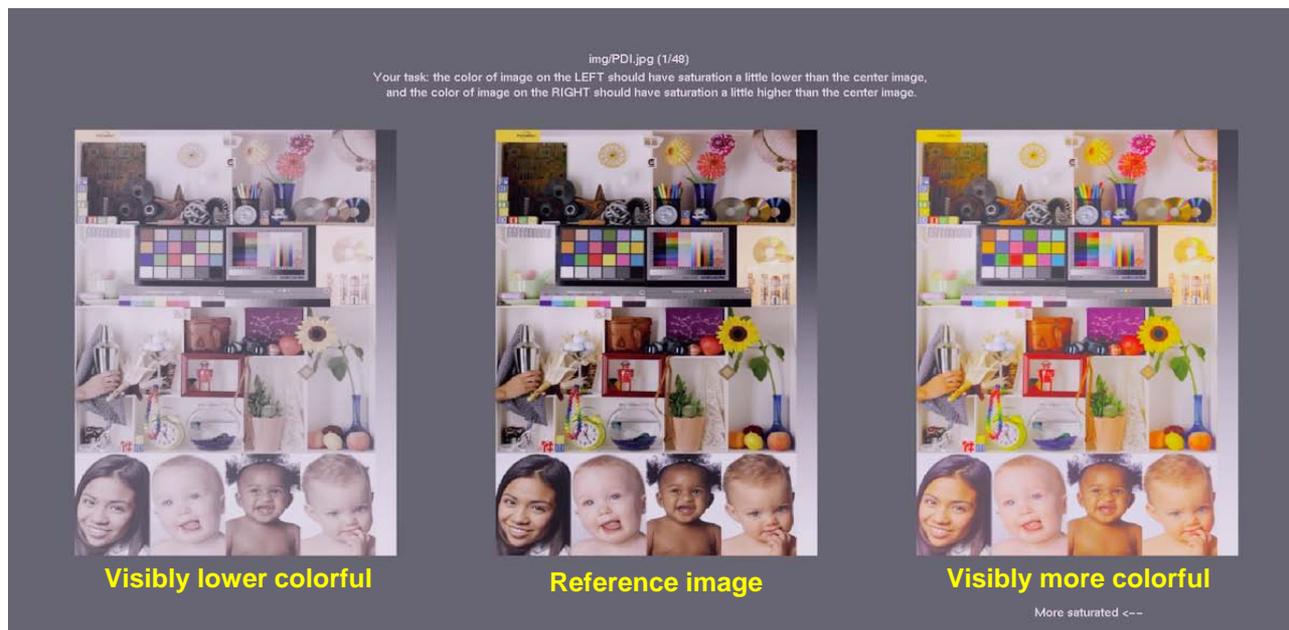


Fig. 6. Screenshot from the experiment.

# ◆ Results

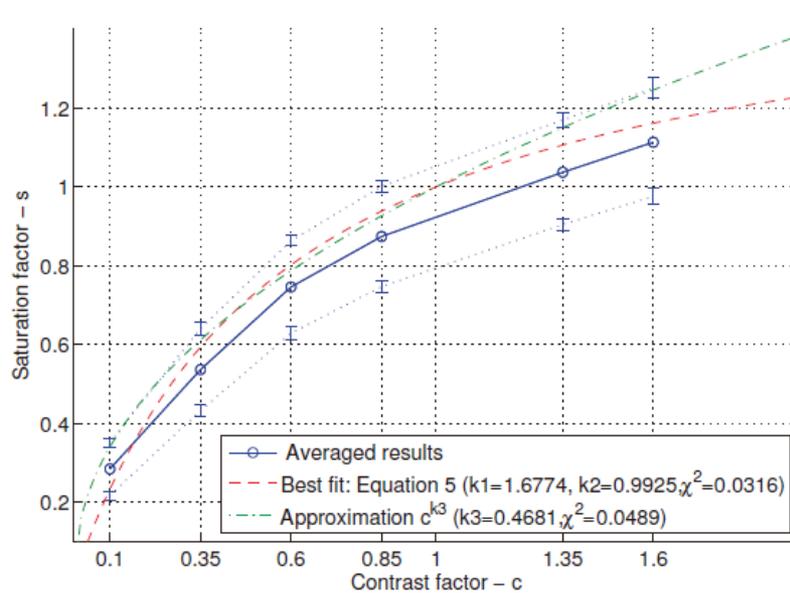
– Averaged results for both color correction formulas

- Moderate contrast correction for small contrast

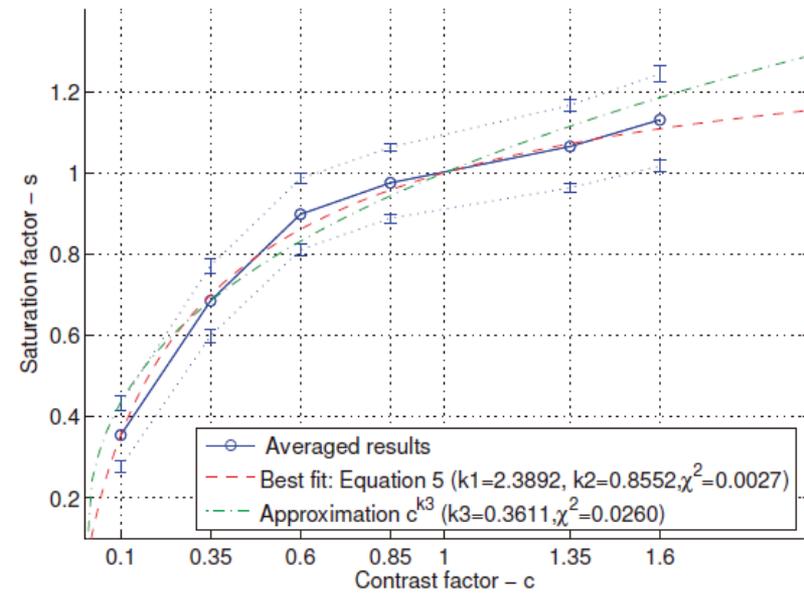
– Relation between  $c$  and  $s$

- Approximate with power function  $s(c) = c^{k_3}$

- Approximate with  $s(c) = \frac{(1+k_1)c^{k_2}}{1+k_1c^{k_2}}$  (5)



(a) Non-linear color correction



(b) Luminance preserving correction

Fig. 5. Result of matching colors between image with altered contrast and an original image.

# Color appearance models and color correction

## ◆ Color appearance models

- Predict non-linearity in visual system
- Provide set of perceptual attribute predictors
  - Colorfulness, chroma, and saturation

## ◆ Object of this experiment

- Find which perceptual attribute should be preserved after contrast compression
  - Six basic colors of different hue, saturation, and lightness
    - Compress contrast  $c \in [0, 2]$  with respect to reference white
    - Color correction factor  $s$  determined by Eq. 5
  - Result colors
    - Transform to space of perceptual attribute predictors

## – Result colors of CIECAM02 space

- CIECAM02 saturation
  - Most consistent across contrast variation
- Relation between the saturation and contrast compression
  - Non-linear relation

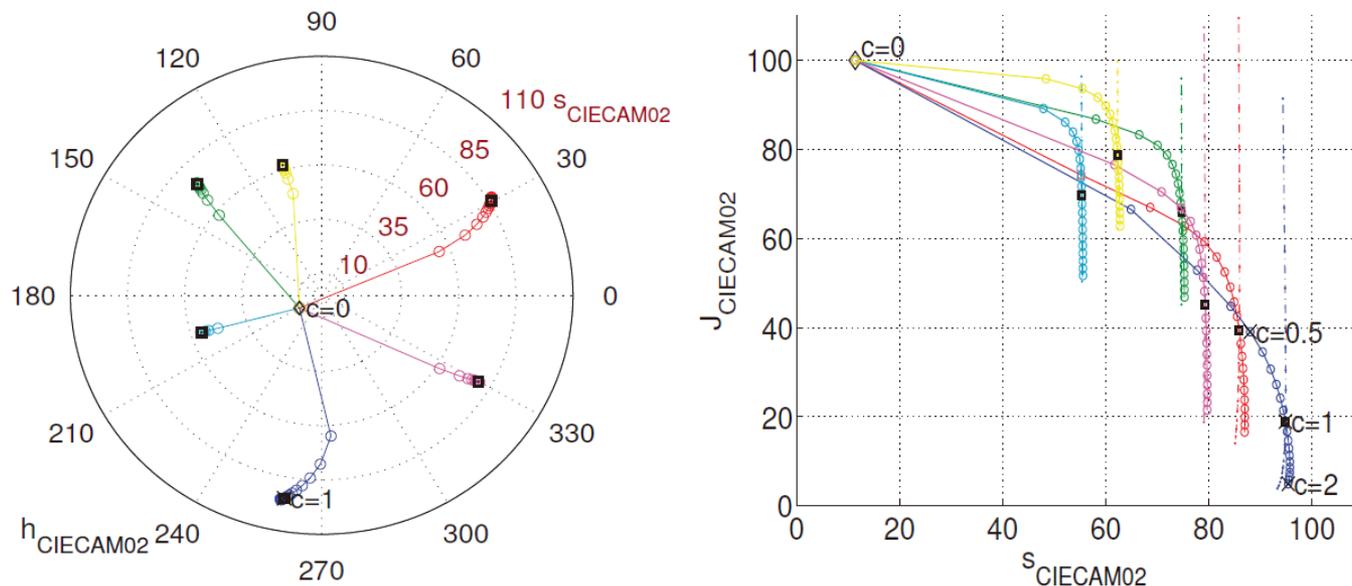


Fig. 7. CIECAM02 prediction (hue, saturation, and lightness) for color change.

# Experiment 2: Color correction in CIELAB

- ◆ Limitations of color correction in RGB space
  - Either preserve lightness but distort hue, or preserve hue but distort lightness
- ◆ Color correction in space of perceptual attributes
  - CIELAB or CIELUV color space
  - Simpler color correction
  - Resulting images
    - Better match to originals

# ◆ Framework for color correction in CIELAB

– Luminance of original image

- Tone mapping by Eq. (4)

– Chroma of original image

- Correct by factor  $s_{LAB}$

– Combine lightness and corrected chroma

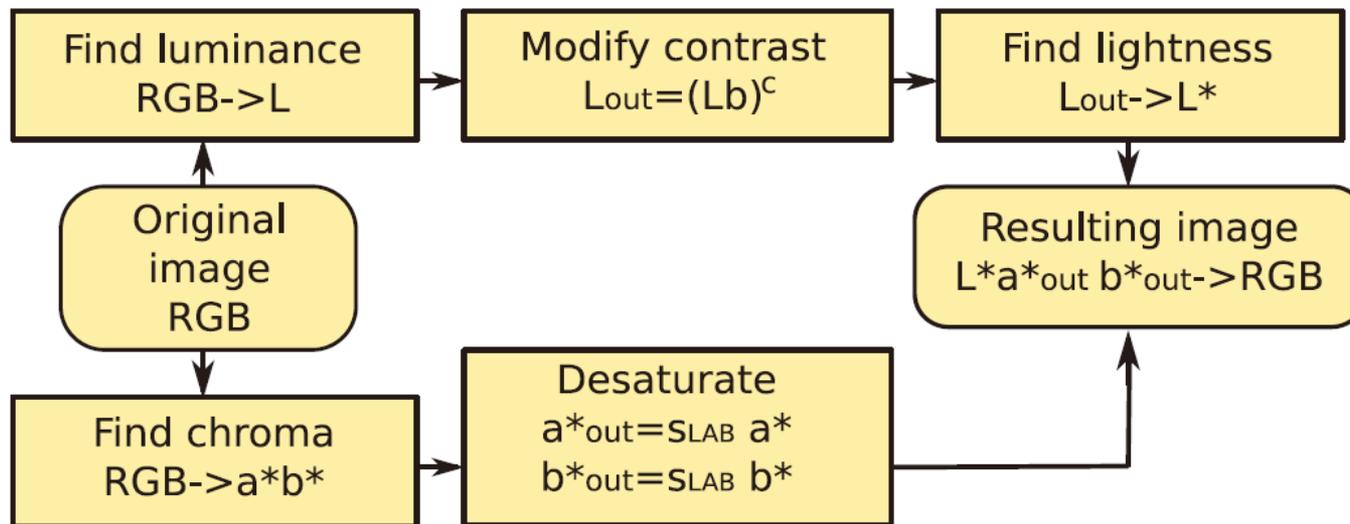


Fig. 8. Colors correction in the CIELAB color space.

## ◆ Result of experiment

– Small contrast modification ( $0.6 < c < 1.6$ )

- Color correction

- Almost unnecessary ( $s_{\text{LAB}} \approx 1$ )

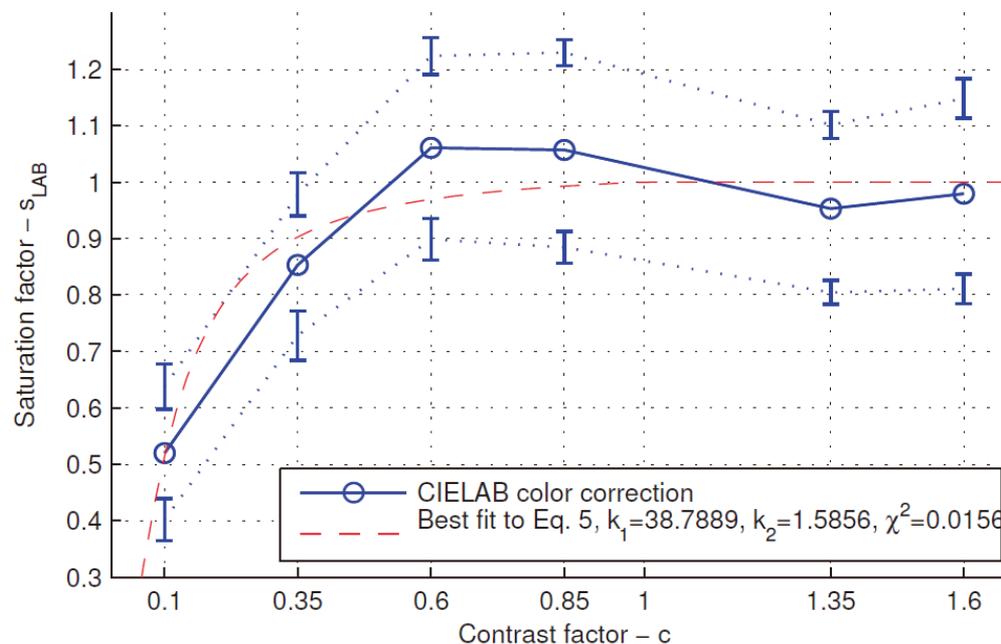


Fig. 9. Result of matching image colors using color correction in CIELAB color space.

- Illustration of  $s_{LAB}$  color correction in CIECAM02
  - Color correction in CIELAB
    - Better preserve hue and lightness

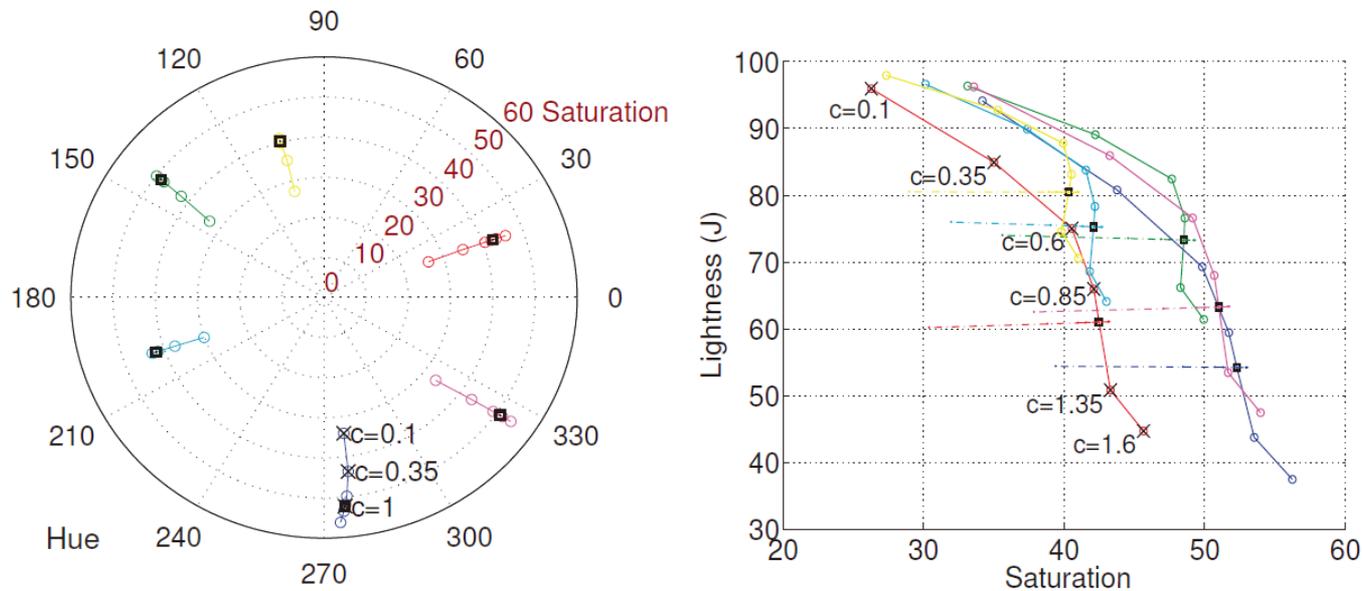


Fig. 10. CIECAM02 prediction for color correction in CIELAB space.

# Are color appearance models suitable for tone mapping?

## ◆ CIELAB chroma predictor

- Better preserve color appearance after contrast compression
  - Seem to be alternative to color correction in RGB color space
- Limitation for HDR scenes
  - Estimation problem of reference white color

## ◆ Different selection of reference white

- Lead to completely different colors
- Automatic estimation of reference white
  - Difficult problem
  - Some methods exist
    - Lead to unreliable estimation

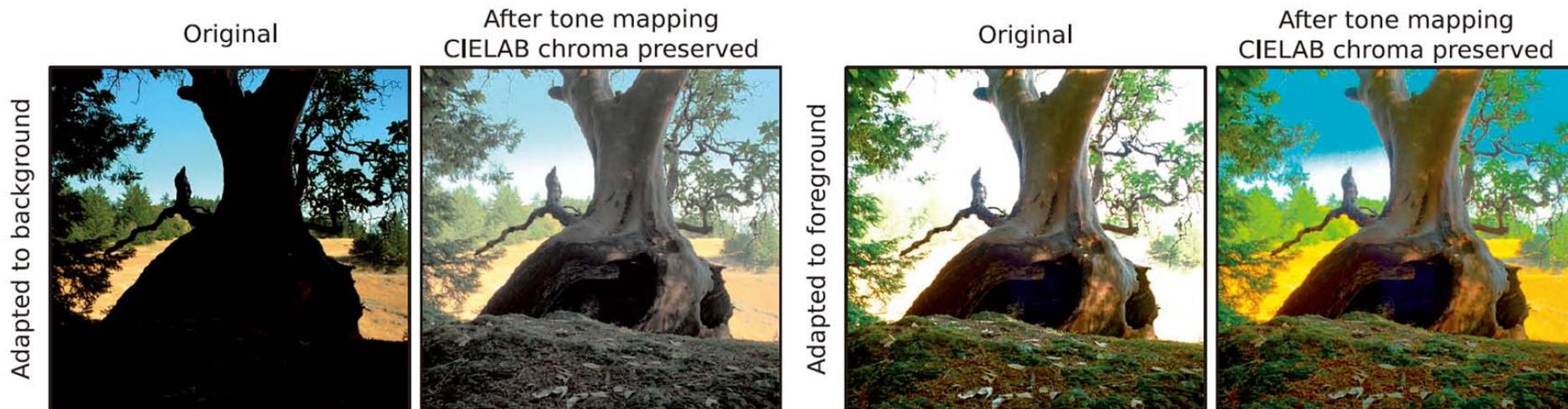


Fig. 11. High dynamic range image before and after tone mapping while preserving CIE LAB chroma.

# Application in tone mapping

- ◆ This subjective study
  - Demonstrate relation between contrast compression and color correction
  - Applicable to global and local tone mapping

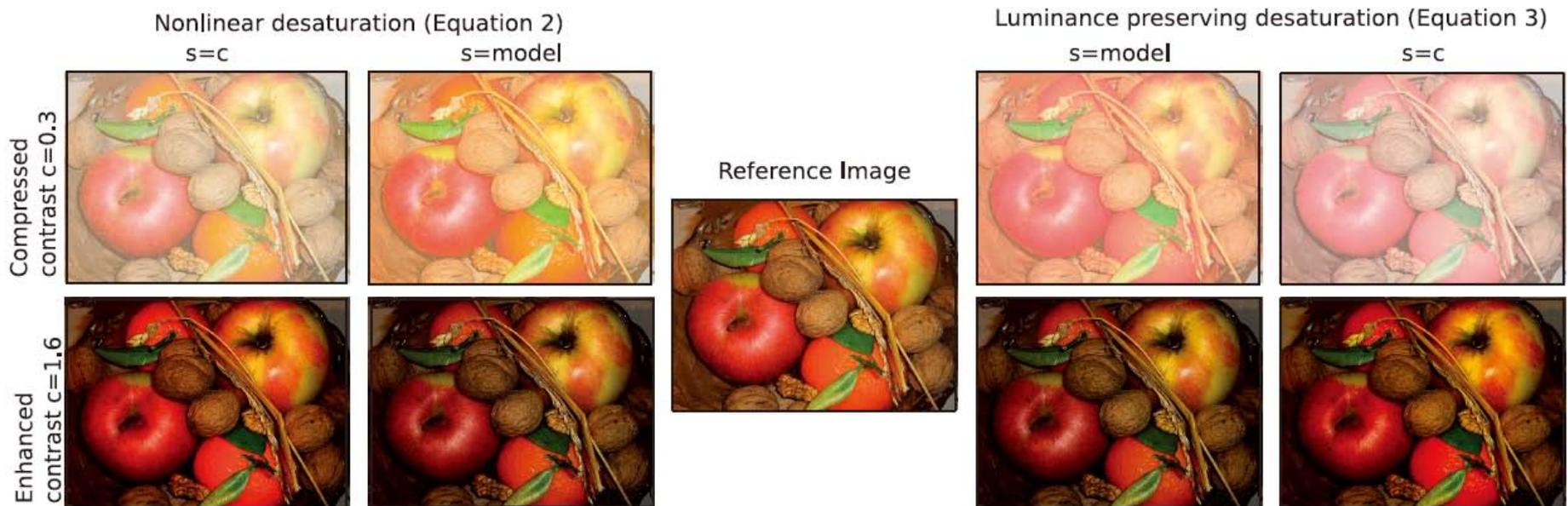


Fig. 12. Results of four color correction methods for contrast compression(top) and enhancement(bottom).

## ◆ Bilateral tone mapping

- Uniformly reduce contrast of base layer while detail preserving
- Produce good result, but over-saturated colors
- Using proposed method
  - Fix over-saturated colors

Original Algorithm



Reference Image



With Color Correction



Fig. 13. The result of the “bilateral” tone mapping with strong contrast compression, original algorithm compared to the algorithm with color correction.

## ◆ Proposed color correction formulas

- Apply to simplified operator with contrast factor  $c$
- Apply to any tone mapping function
  - Contrast factor
    - Approximate by slope of tone curve on log-log plot in logarithmic space

$$\hat{L}_{out} := tmo(L_{in})$$

$$c(L_{in}) = \frac{d}{d\hat{L}} tmo(\hat{L}_{in})$$

(6)

where  $\hat{L} = \log_{10}(L)$

# ◆ Display adaptive tone mapping

- Employ Eq.(2) to compensate for color difference
  - Manually adjust color correction factor  $s$
- Using proposed method
  - Automatically readjust  $s$

$$C_{out} = \left( \frac{C_{in}}{L_{in}} \right)^s L_{out}$$

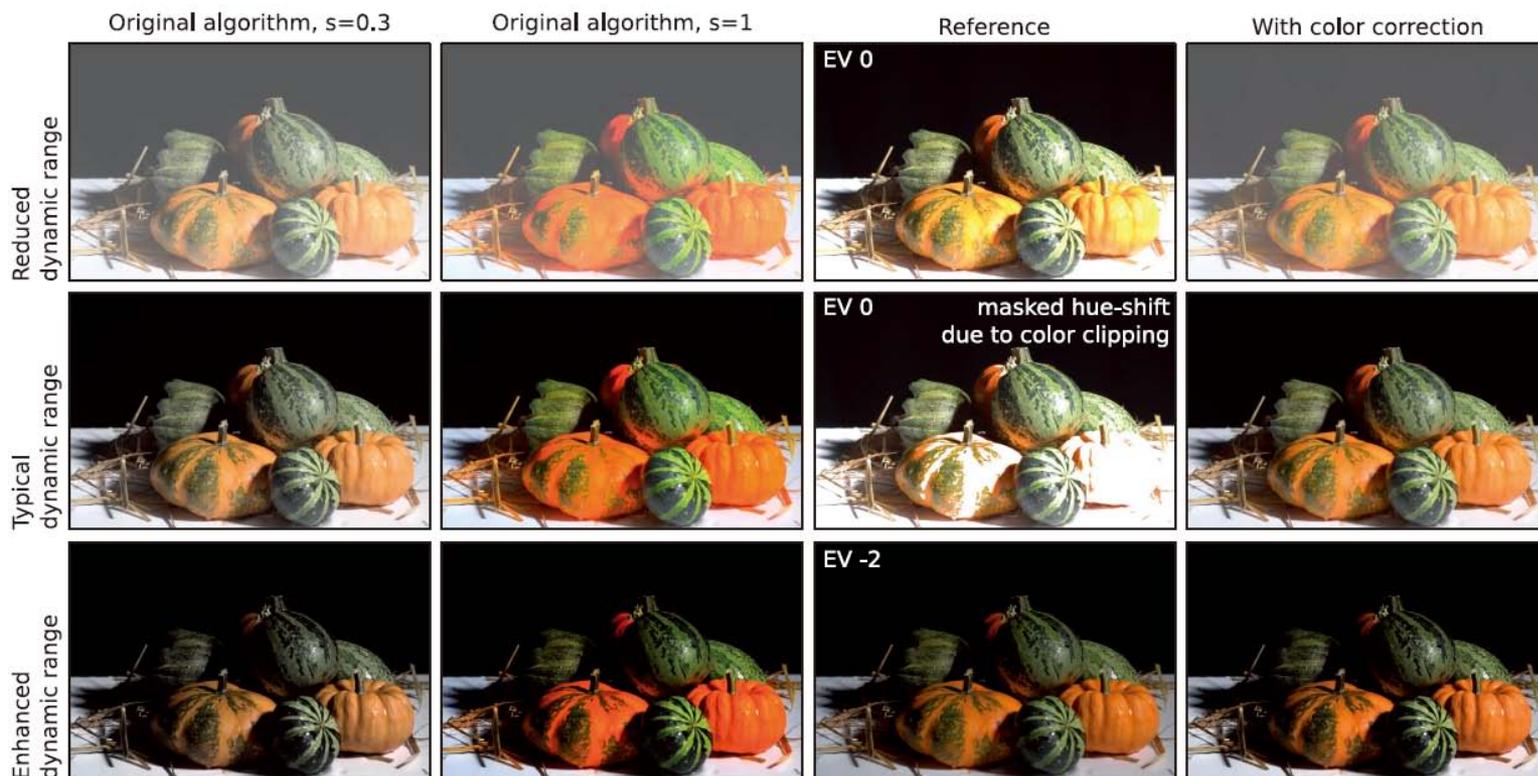


Fig. 14. The result of the “display adaptive” tone mapping.

# Discussion

## ◆ Proposed method

- Consideration of only global tone mapping
  - Affect only low frequencies
- Pilot study
  - Investigate effect of local operation, unsharp masking, and colorfulness images
  - Main component of local tone mapping operators
    - Sharpening
    - Proposed color correction
      - » Valid method for local tone mapping operators



Fig. 15. Enhancement and compression of details has little effect on colorfulness as compared to global contrast modification.

# Conclusions and future work

- ◆ Tone mapping operator
  - Distort image due to tone and color reproduction
- ◆ Proposal method
  - Predict desirable color correction
  - Simple and computationally inexpensive formulas
  - Applicable for global and local tone mapping
  - Exist problem of reference white estimation
- ◆ Future work
  - Isolate set of factors that influence colorfulness after local tone mapping operations