

Perceptually Based Tone Mapping for Low-Light Conditions

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Purkinje Effect



Bright scene

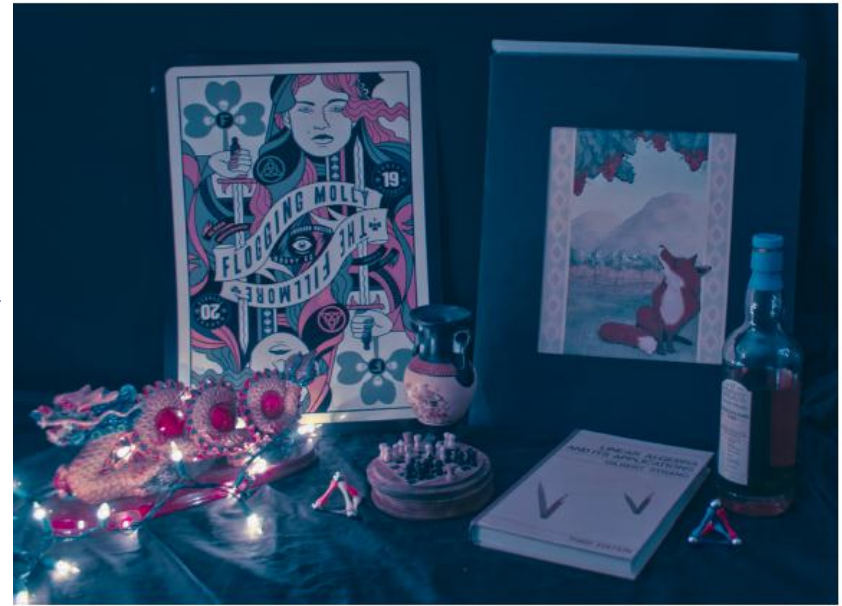
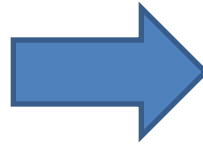


Low-light => bluish

Key idea



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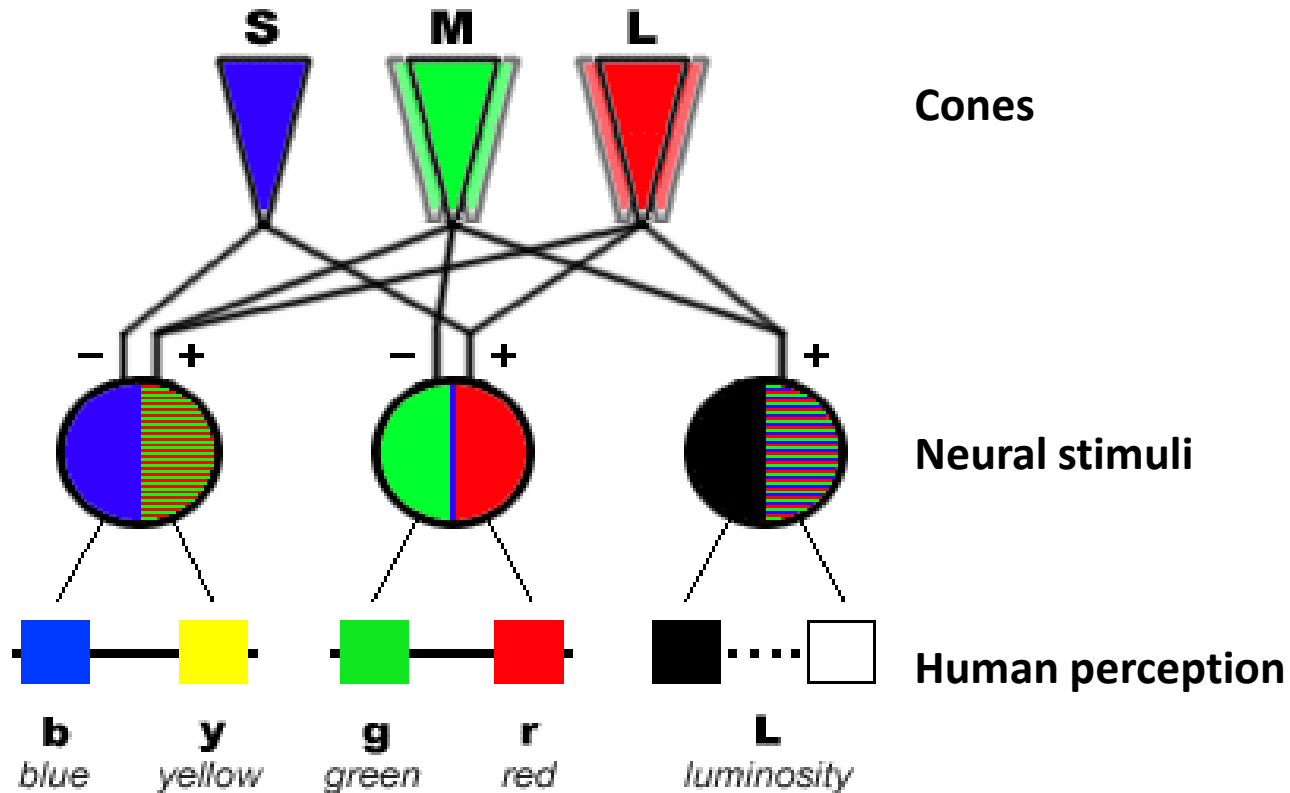


Match human vision in low-light conditions

Human vision

- Bright scene: dominated by cones (photopic vision)
- Dark scene: dominated by rod (scotopic vision)
- In between? Low-light vision (mesopic vision)
 - rod and cones all contributes (4D-> 3D)
 - This is why we perceived color change in low-light
 - Cameras do not have this mechanism!

Opponent color model in photopic vision

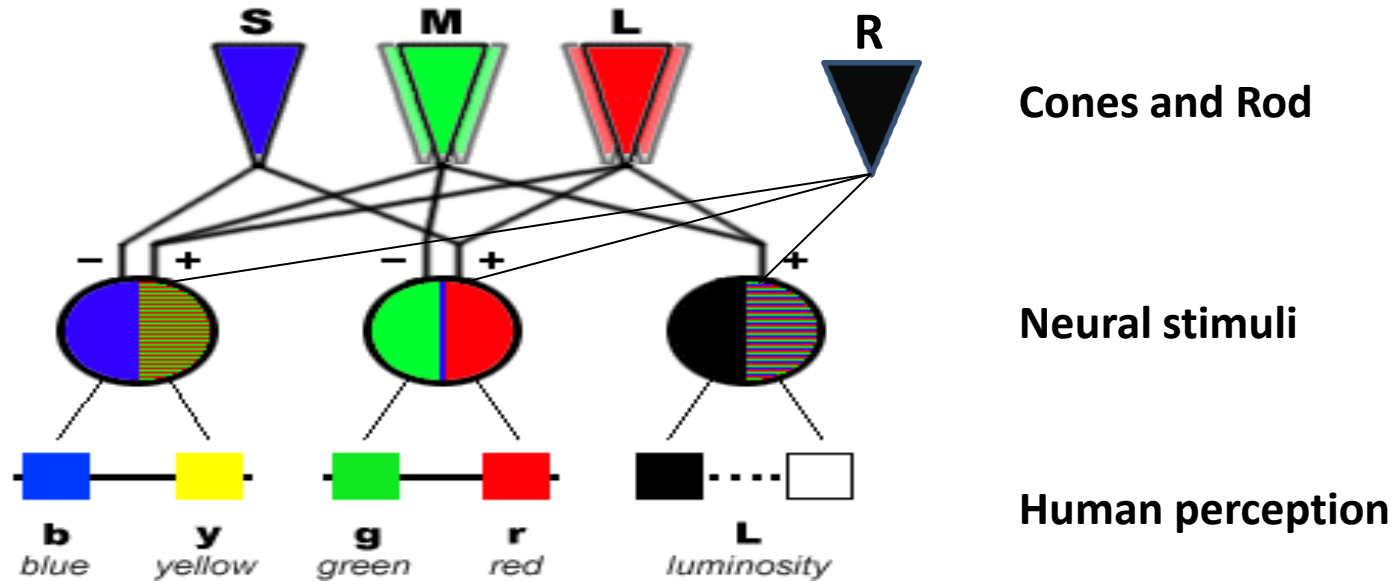


$$O_{\text{Red/Green}} = \hat{q}_{\text{Medium}} - \hat{q}_{\text{Long}}$$

$$O_{\text{Blue/Yellow}} = \hat{q}_{\text{Short}} - (\hat{q}_{\text{Long}} + \hat{q}_{\text{Medium}})$$

$$O_{\text{Luminance}} = \hat{q}_{\text{Long}} + \hat{q}_{\text{Medium}}$$

Low light vision



Neural stimuli diffs

$$\Delta O_{\text{Red/Green}} = x \kappa_1 \left(\rho_1 \frac{g_{\text{Medium}}}{m_{\text{max}}} - \rho_2 \frac{g_{\text{Long}}}{l_{\text{max}}} \right) q_{\text{Rod}}$$

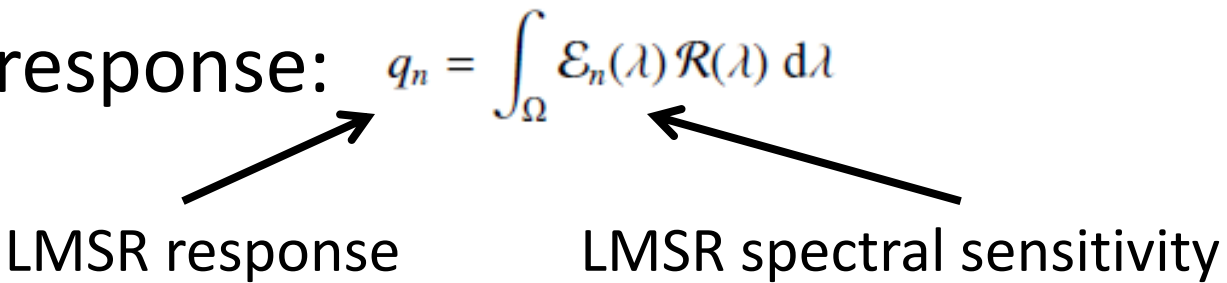
$$\Delta O_{\text{Blue/Yellow}} = y \left(\rho_3 \frac{g_{\text{Short}}}{s_{\text{max}}} - \rho_4 \left(\alpha \frac{g_{\text{Long}}}{l_{\text{max}}} + (1 - \alpha) \frac{g_{\text{Medium}}}{m_{\text{max}}} \right) \right) q_{\text{Rod}}$$

$$\Delta O_{\text{Luminance}} = z \left(\alpha \frac{g_{\text{Long}}}{l_{\text{max}}} + (1 - \alpha) \frac{g_{\text{Medium}}}{m_{\text{max}}} \right) q_{\text{Rod}}$$

Method Overview

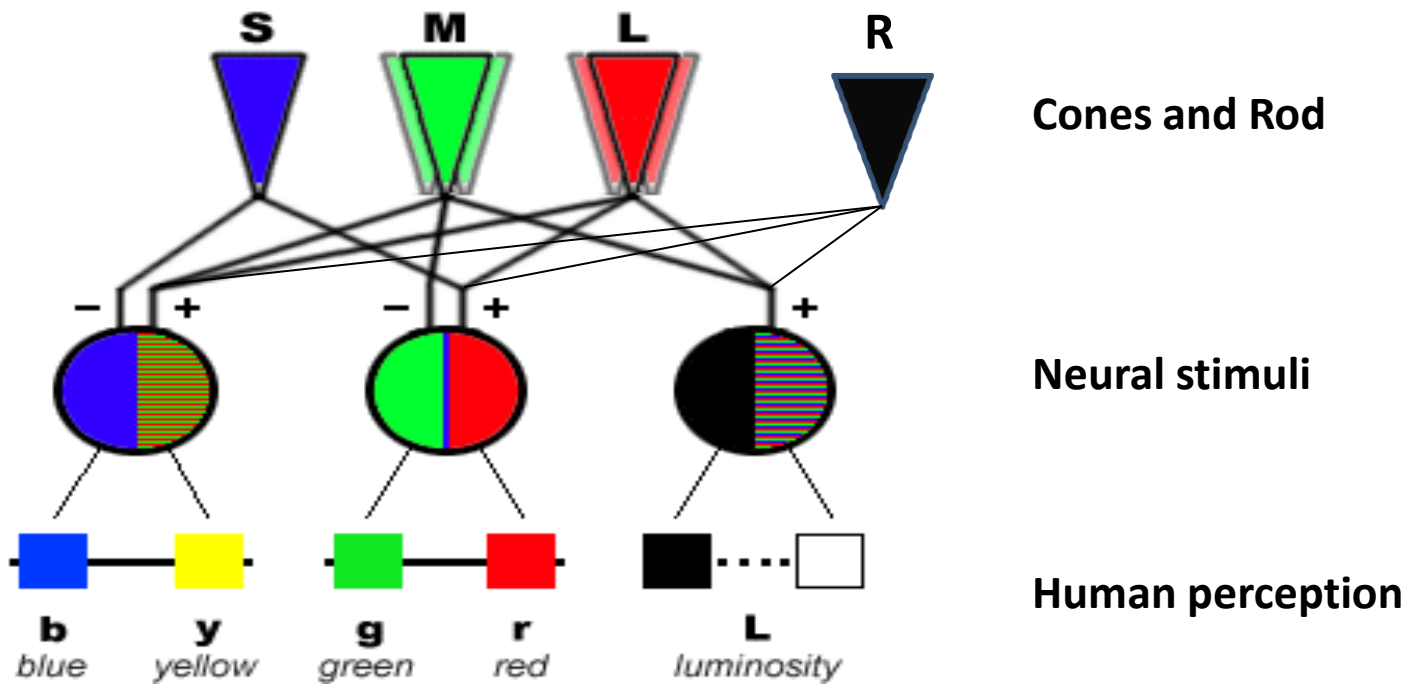
- The only work apply human vision model to deal with Purkinje effect in images
- Flow
 - Acquiring Spectral Images to estimate LMSR response
 - Compute neural stimuli difference due to rod
 - Convert neural stimuli back to RGB

Acquiring Spectral Images

- LMSR response: $q_n = \int_{\Omega} \mathcal{E}_n(\lambda) \mathcal{R}(\lambda) d\lambda$


LMSR response LMSR spectral sensitivity

- Each pixel is represented by a spectral function $R(\lambda)$
- Take snapshot of the same scene with 10 band pass filters
- Cubic B-spline curve fitting to get $R(\lambda)$



Neural stimuli diffs

$$\Delta o_{\text{Red/Green}} = x \kappa_1 \left(\rho_1 \frac{g_{\text{Medium}}}{m_{\text{max}}} - \rho_2 \frac{g_{\text{Long}}}{l_{\text{max}}} \right) q_{\text{Rod}}$$

$$\Delta o_{\text{Blue/Yellow}} = y \left(\rho_3 \frac{g_{\text{Short}}}{s_{\text{max}}} - \rho_4 \left(\alpha \frac{g_{\text{Long}}}{l_{\text{max}}} + (1 - \alpha) \frac{g_{\text{Medium}}}{m_{\text{max}}} \right) \right) q_{\text{Rod}}$$

$$\Delta o_{\text{Luminance}} = z \left(\alpha \frac{g_{\text{Long}}}{l_{\text{max}}} + (1 - \alpha) \frac{g_{\text{Medium}}}{m_{\text{max}}} \right) q_{\text{Rod}}$$

(12)

Convert back to RGB image

- Compute RGB values best represent the neural stimulus
- Apply standard HDR range compression first
- Looks weird (a low light image with full range)
- Suppress pixel value by mesopic factor w
 - $w=0$ -> fully photonic, $w>1$ -> fully scotopic

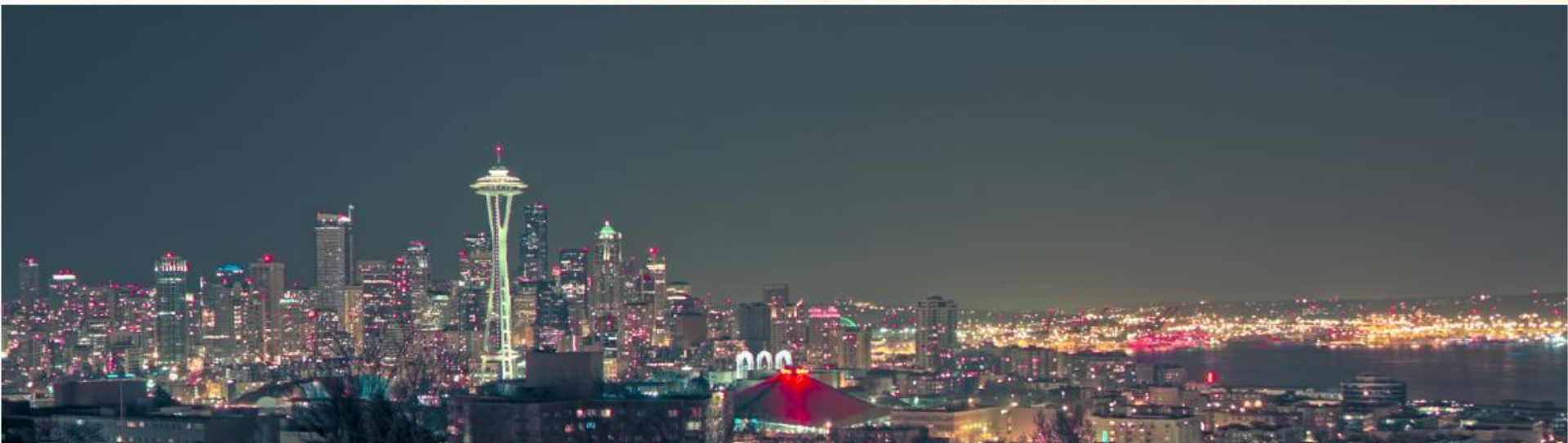
$$\hat{P} = P * \max(1 - w(1 - \gamma), \gamma), \quad \gamma \in [0.25, 0.5]$$

Result (Range Compression)

Exposure 



Results



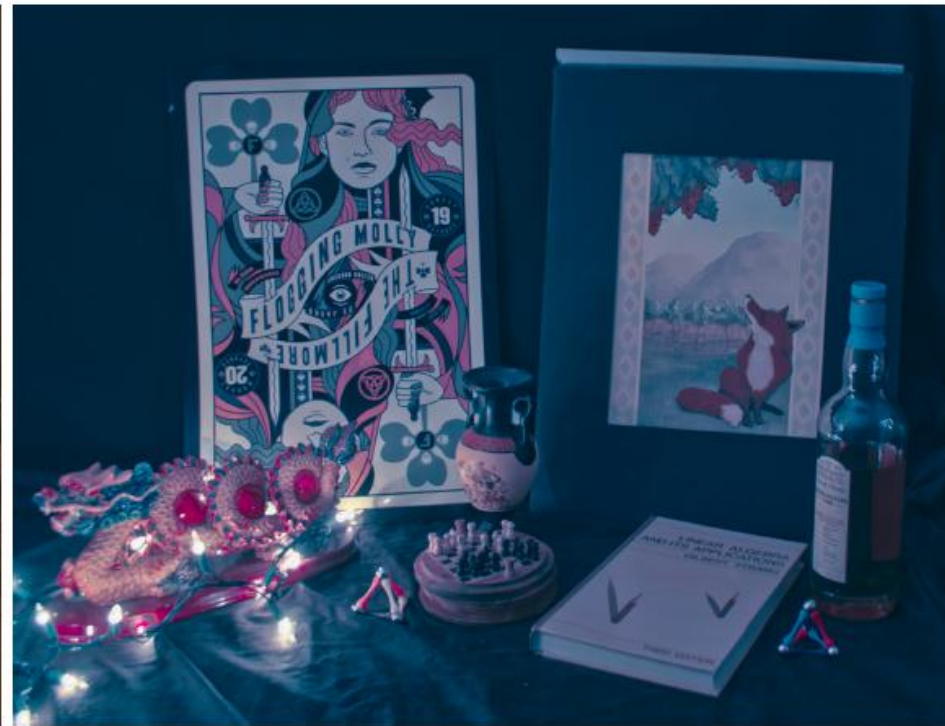
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Results



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Results



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Approximation of Non-Spectral Images

- Spectral images are hard to acquired
- Build a RGB->LMSR mapping matrix by data trained from spectral images
- Apply that mapping to RGB images to create approximated LMSR value

Results (Non-Spectral Image)



Original image "Foggy Night" copyright Jack Tumblin, Northwestern University.

Results (Non-Spectral Image)



Thanks



Discussion

- Differences/Alternatives

-What happens when using RGB input images instead of multiple spectral images?



Decrease in Exposure



Spectral image tone-mapped



Non-spectral HDR image tone-mapped

Discussion

- How do the two methods compare?
- Does the approximate work well?
Why or why not?
- Do the results fit your perception?
- Other techniques?

Discussion

- Limitations?
 - Focus only on interplay between rods and cones in early stage of vision
 - Other adaptive mechanisms not incorporated
 - Additional effects not modeled

Discussion

- Future works
 - Apply method to all sort of light intensities
 - Predict actual viewer experiences
 - Apply to videos