

# Apparent Contrast and Brightness Enhancement

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MPI Informatik

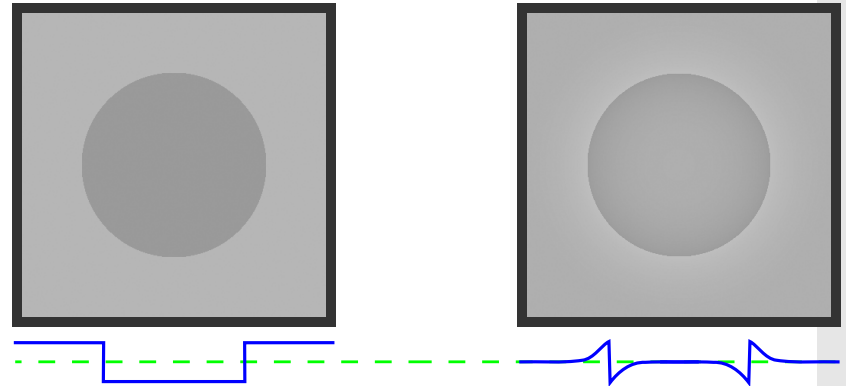


- Image display
  - Limited dynamic range of existing display technology
  - Cannot match to physical contrast and brightness of real world scenes
  - Physical match not really required for good reproduction of image appearance
- Modern tone mapping operators good at optimizing the physical contrast and luminance use
- Human preference
  - Enhanced contrast and brightness improve image appearance
- Can we still boost the contrast and brightness impression?

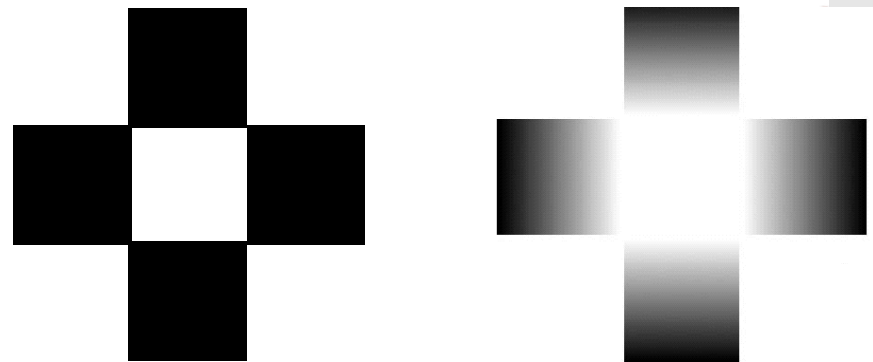


- Spatial vision
  - Image appearance can be strongly affected by skillful introduction of intensity gradients between neighboring pixels

- Cornsweet illusion
  - Apparent contrast boost



- Glare illusion
  - Apparent brightness boost





# Contrast Enhancement: Motivation



**HDR image  
(reference)**



restore missing  
contrast

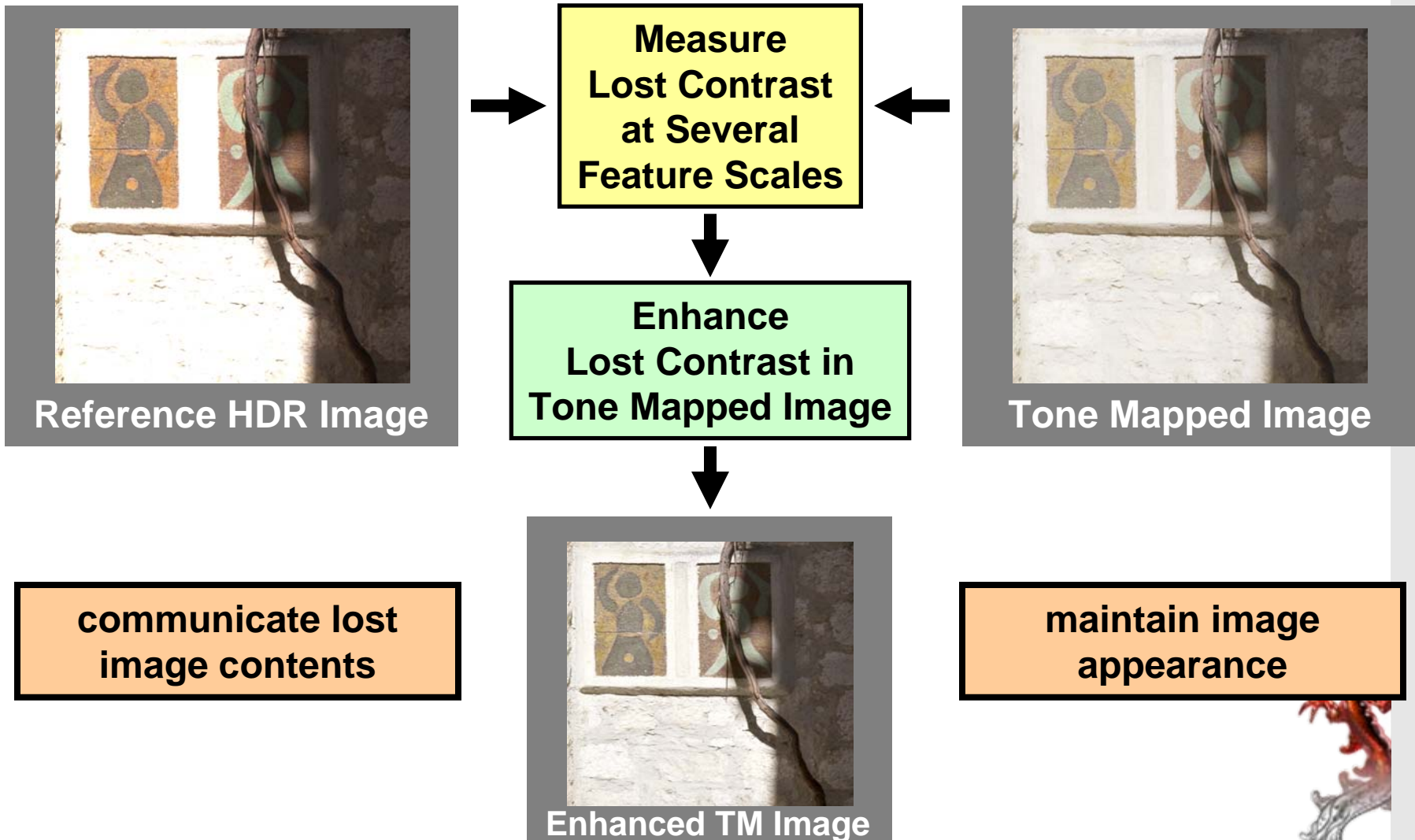


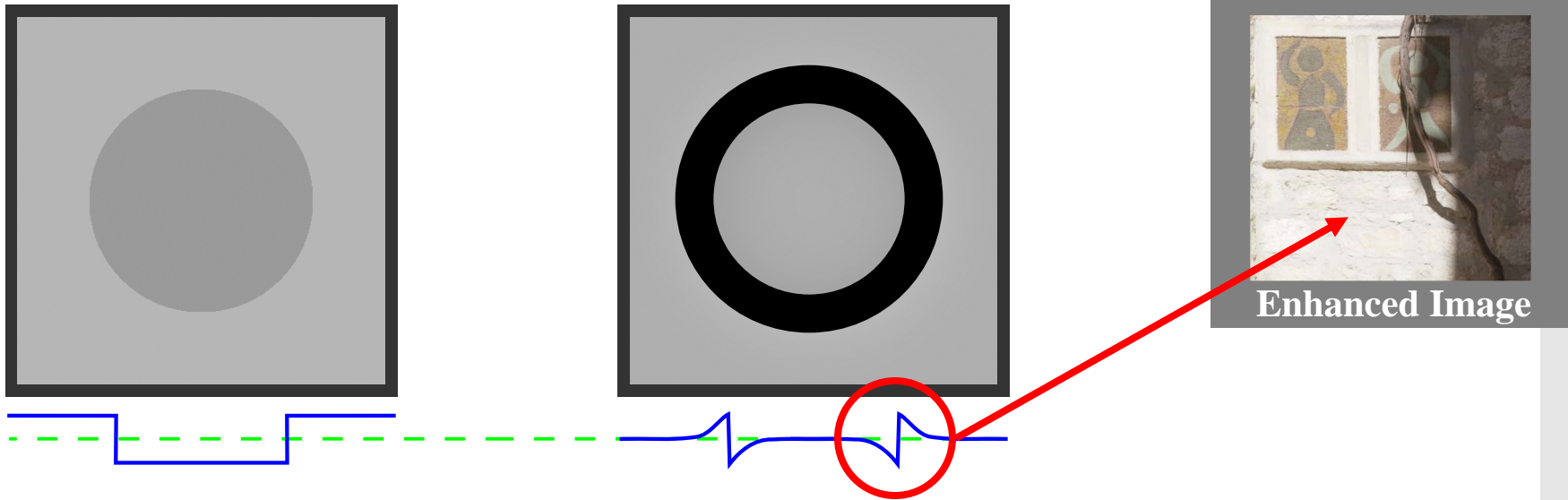
**tone mapping result**

- Usual contrast enhancement techniques
  - either enhance everything
  - or require manual intervention
  - change image appearance
- Tone mapping often gives numerically optimal solution
  - no dynamic range left for enhancement







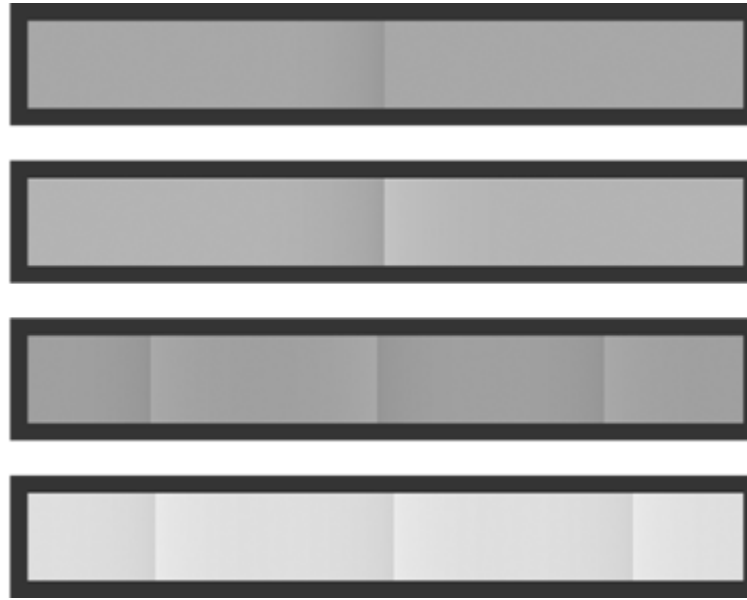
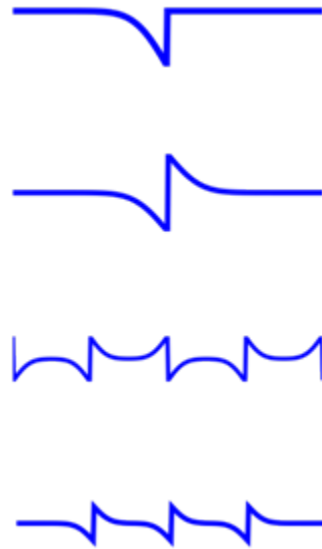


- Create apparent contrast based on Cornsweet illusion
- **Countershading**
  - gradual darkening / brightening towards a contrasting edge
  - contrast appears with ‘economic’ use of dynamic range

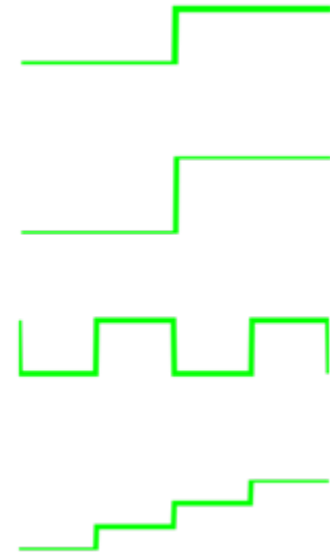


# Details of Contrast Illusion

ACTUAL SIGNAL



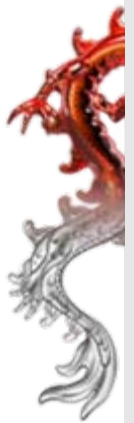
WHAT YOU SEE



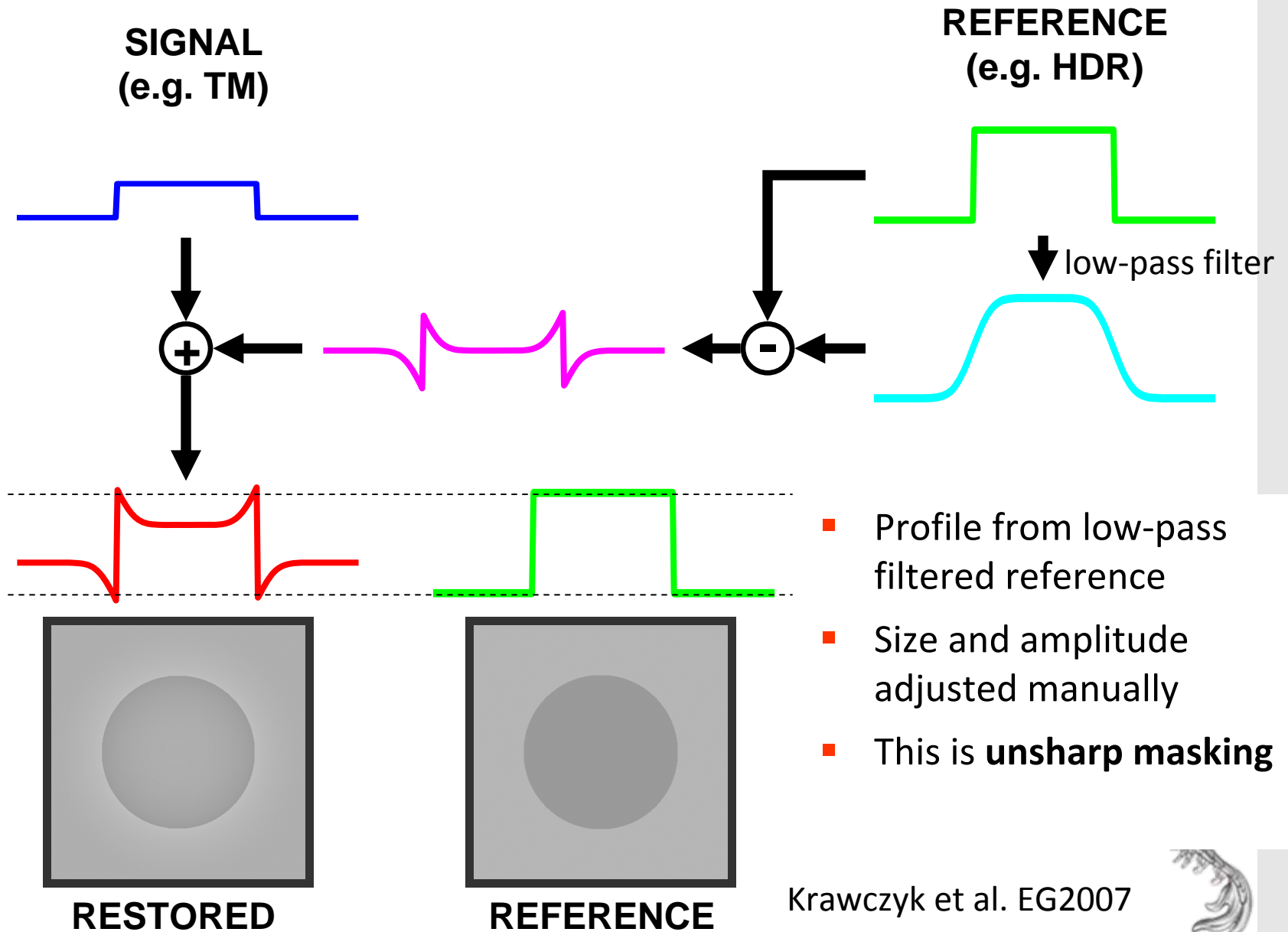
1. Contrast between areas caused by luminance profiles

2. Properties:

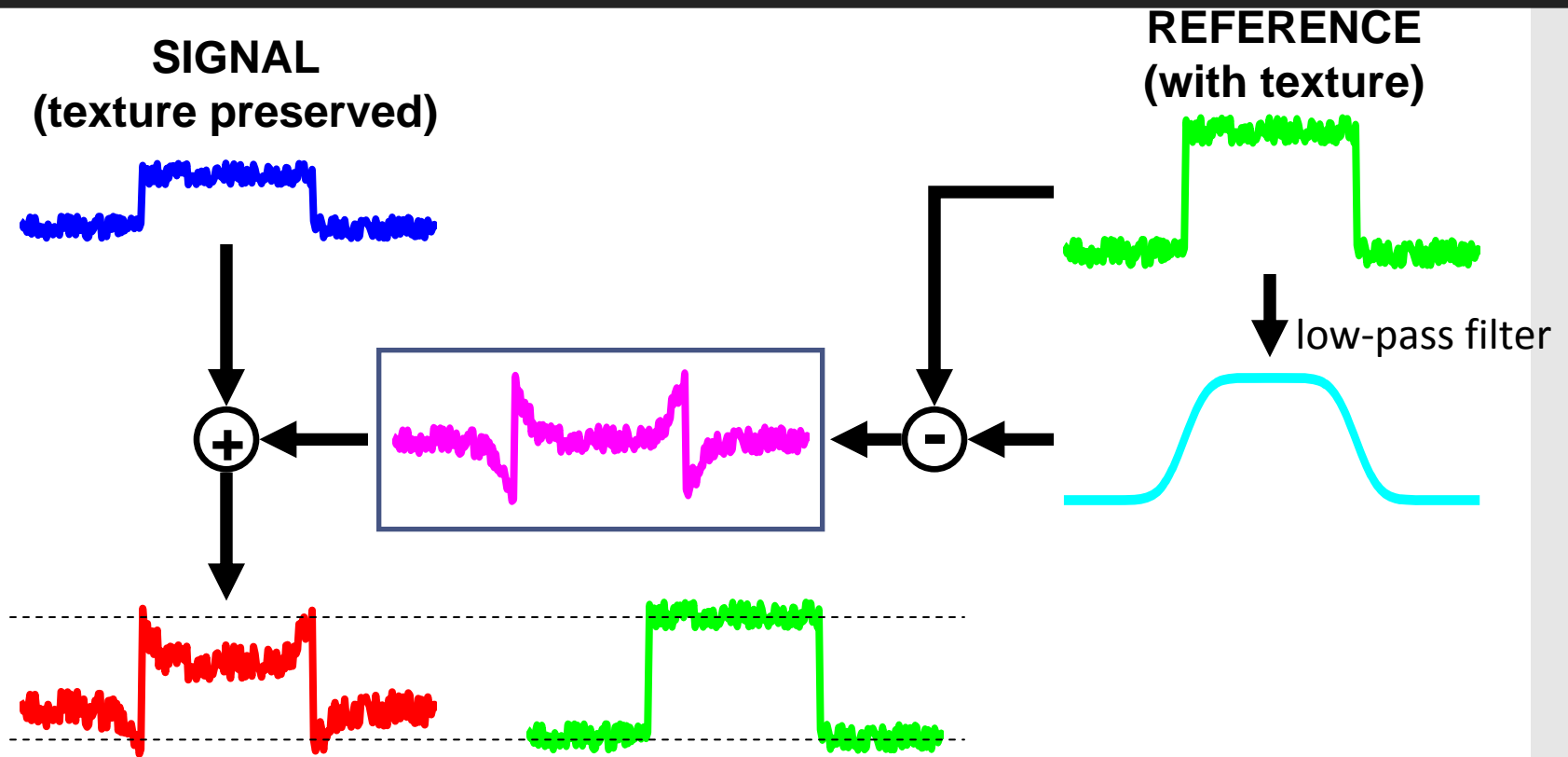
- shape of the profile matches the shape of the enhanced feature
- amplitude of the profile defines the perceived contrast
- noise (texture) does not cancel the illusion
- profiles should not be discernible



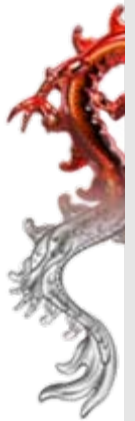
# Construction of Simple Profile (1/2)



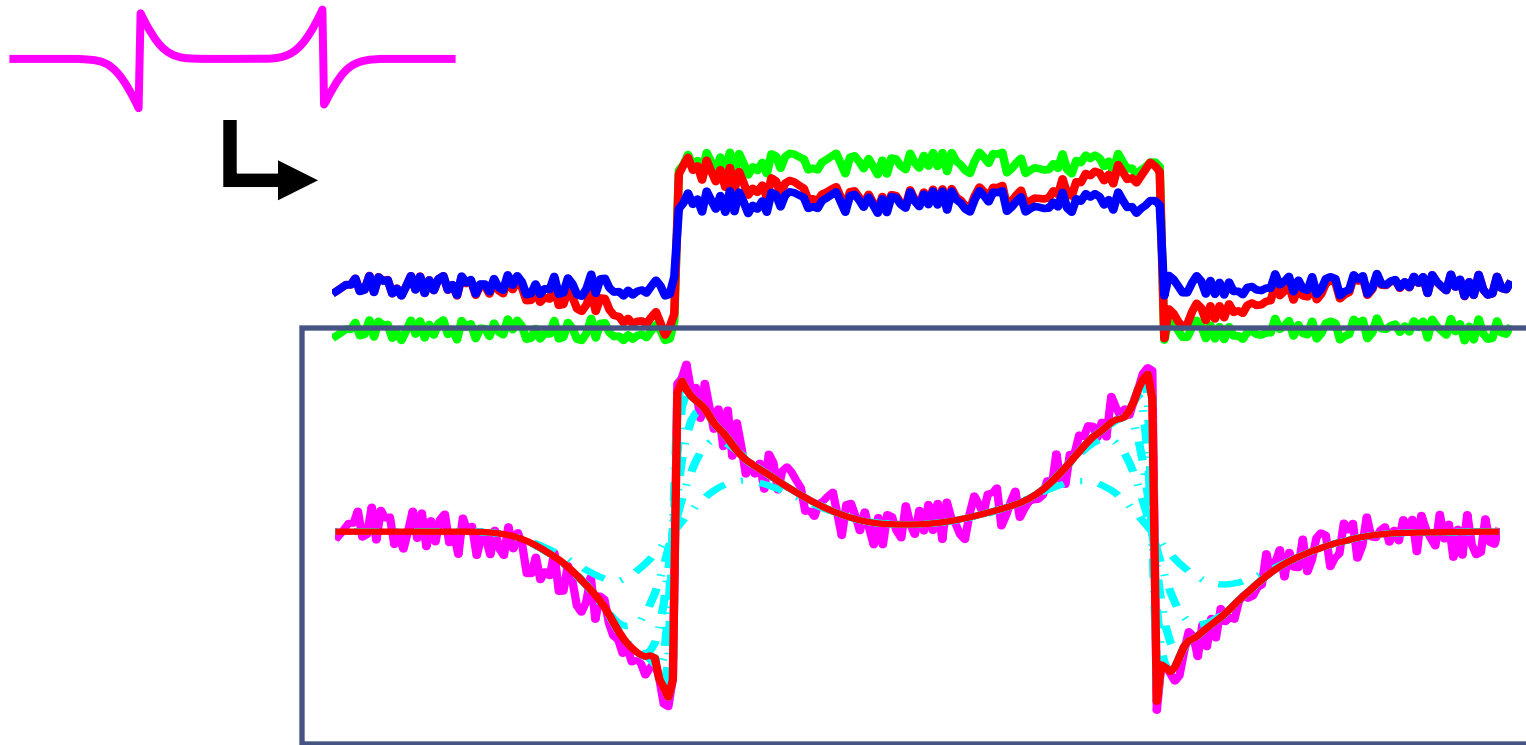
# Construction of Simple Profile (2/2)



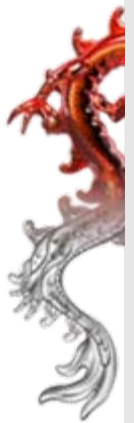
Well preserved signal is exaggerated by **unsharp masking**



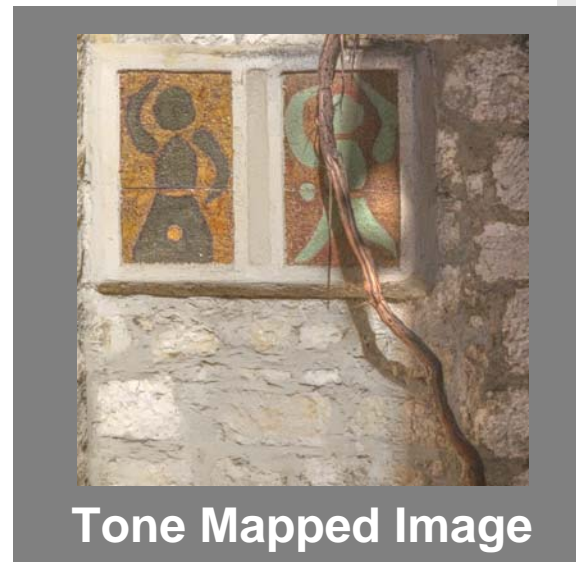
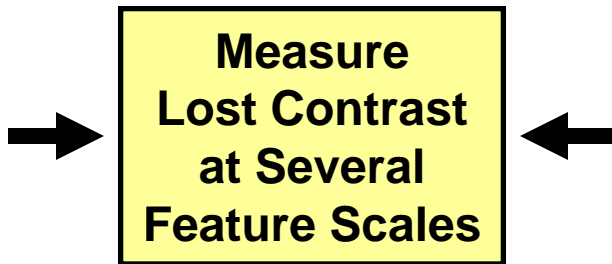
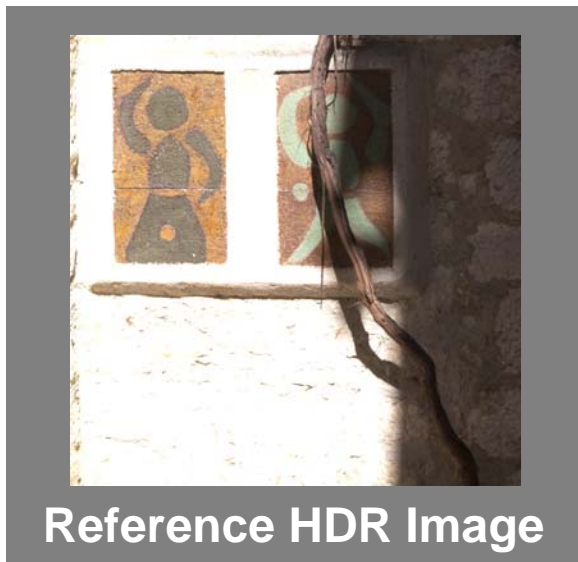
# Correct Profile for Textured Area



- Profile constructed directly from the reference image contains high frequency features which exaggerate texture
- **Sub-band components allow to select features**
  - high frequency component present only at high contrast edge



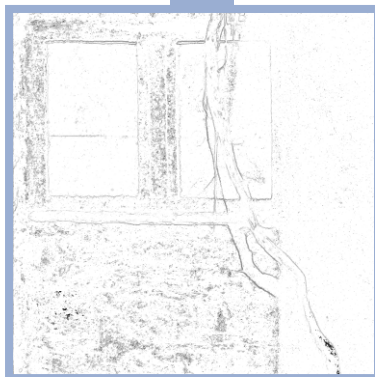
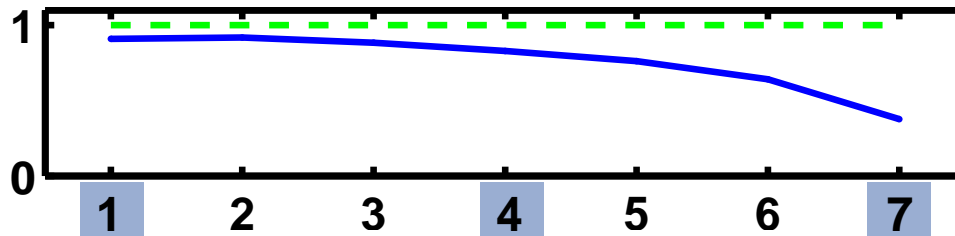
# Multi-resolution Contrast Metric



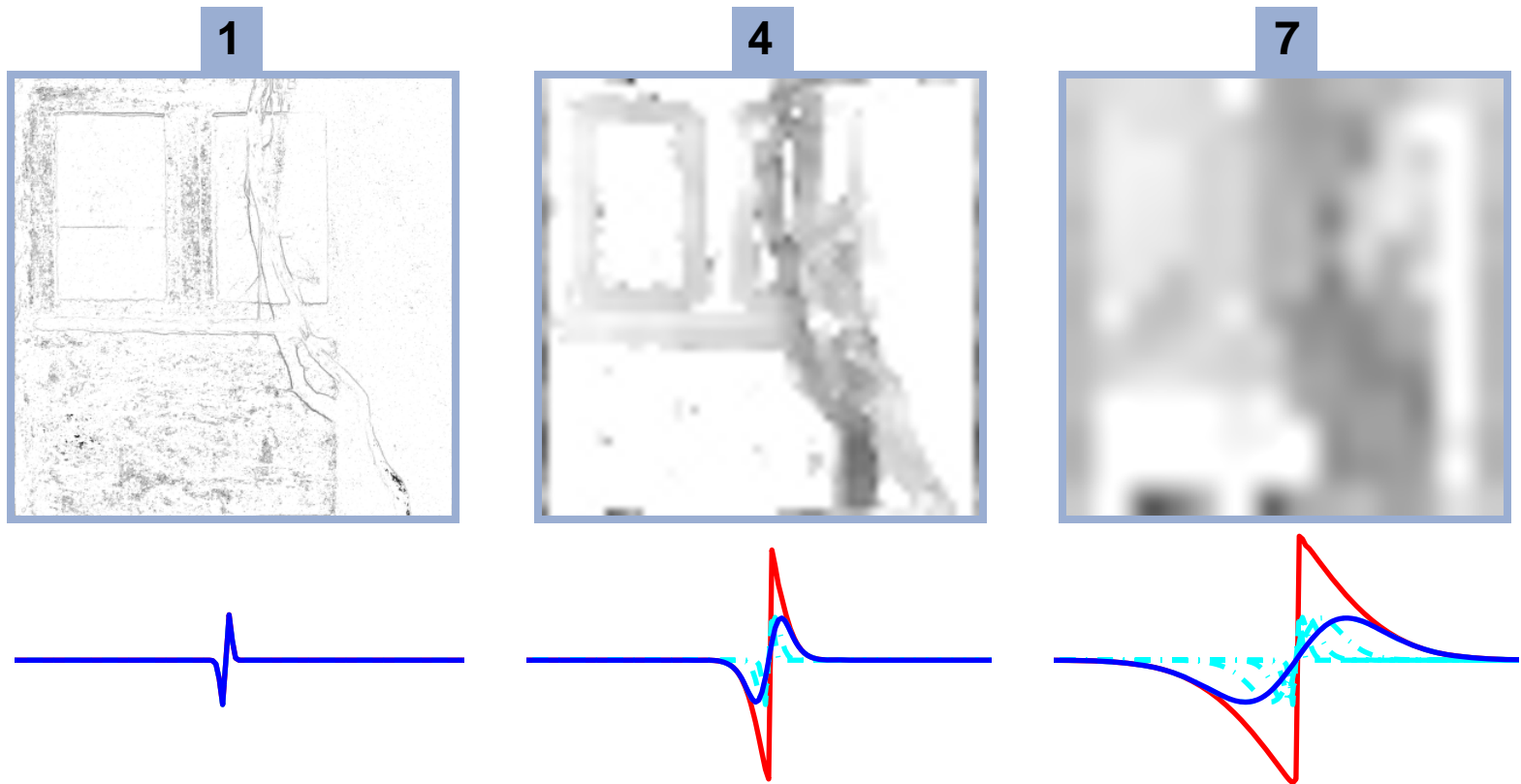
$$C_l = \frac{|Y - Y_{mean}|}{Y_{mean}}$$

$$R_l = \frac{C_l^{inp}}{C_l^{ref}}$$

Contrast ratios  
at several scales



# Link: Contrast Metric & Profiles

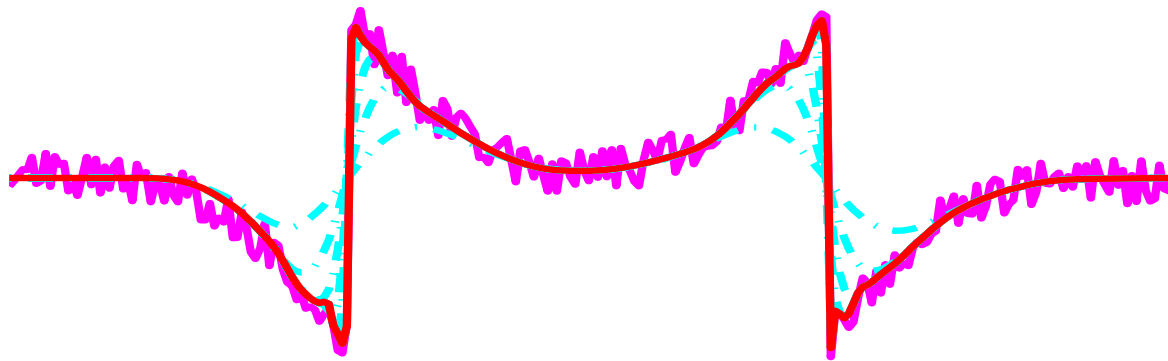


1. Contrast ratio at each scale defines the sub-band amplitude (blue)
2. Contrast for larger scales appears also on smaller scales
  - the full profile is always reconstructed (red)
3. Scale of contrast measure defines the profile size





# Formula: Countershading Profile



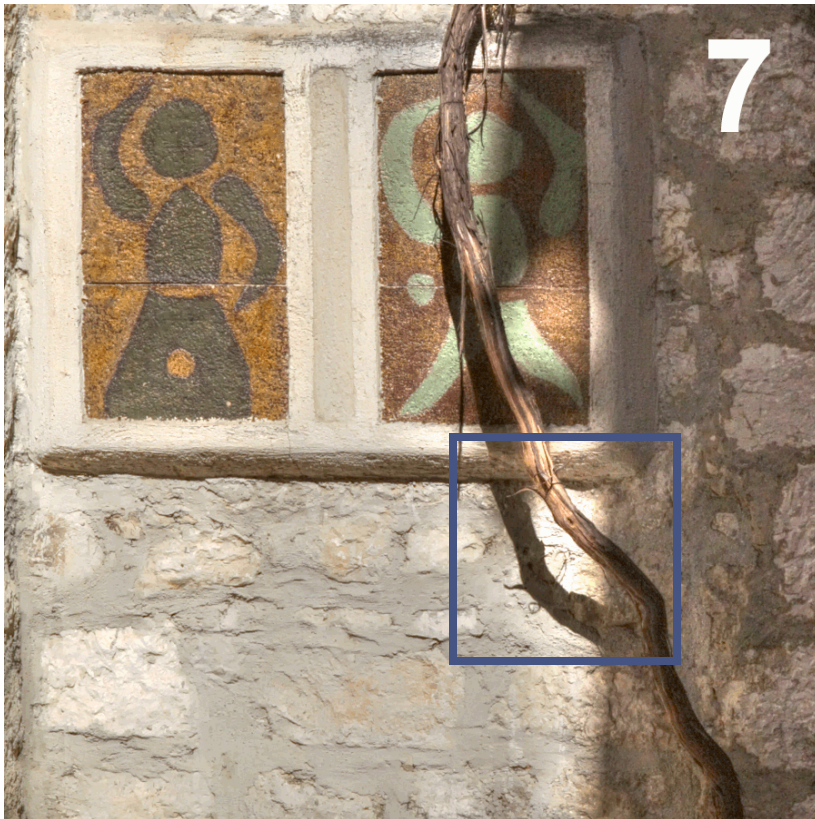
$$P = \sum_{l=1}^N (1 - \uparrow R_l) \times (\log Y_{\sigma(l-1)}^{ref} - \log Y_{\sigma(l)}^{ref})$$

amplitude of profile
sub-band component of profile

1. Contrast ratio  $R_l$  on scale  $l$  drives the amplitude of sub-band component of profile at size  $l$
2. Sum of  $N$  sub-band components gives the countershading profiles  $P$  that match the contrasts in the reference image



# Adaptive Countershading



final contrast restoration



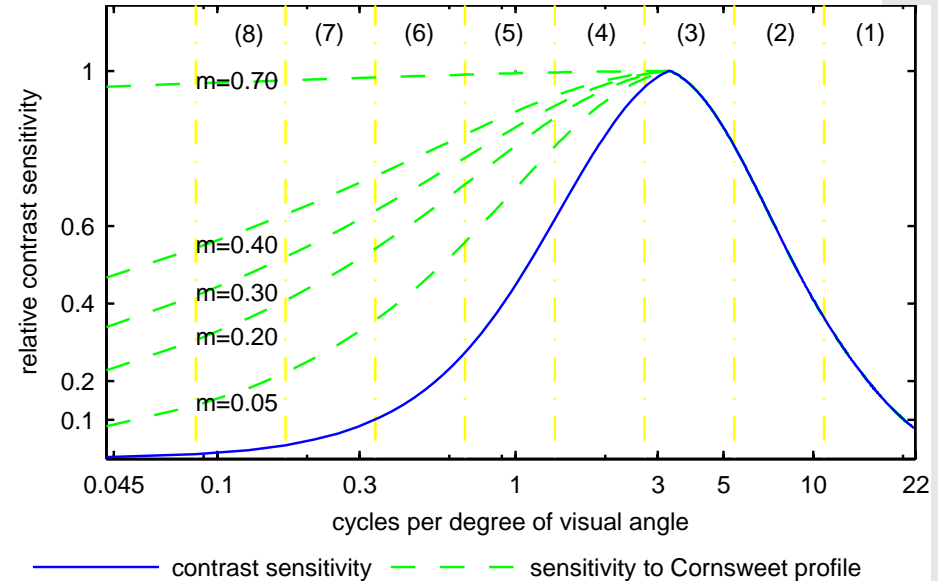
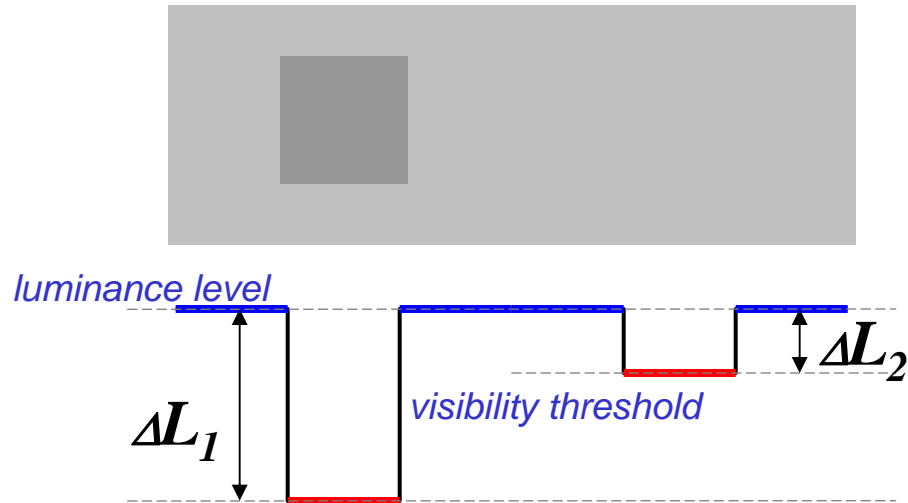
progress of restoration

- **Objectionable visibility of countershading profiles**



# Visual Detection Model

[Dooley and Greenfield, 1977]



## ■ Luminance masking

- absolute luminance level  $L$  defines minimum perceivable luminance difference  $\Delta L$
- defined by t.v.i. functions

## ■ Spatial contrast sensitivity

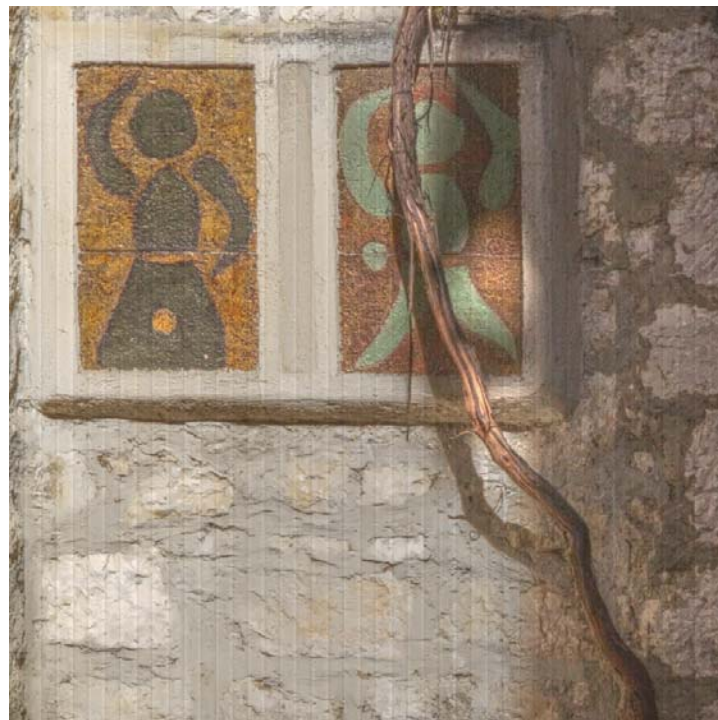
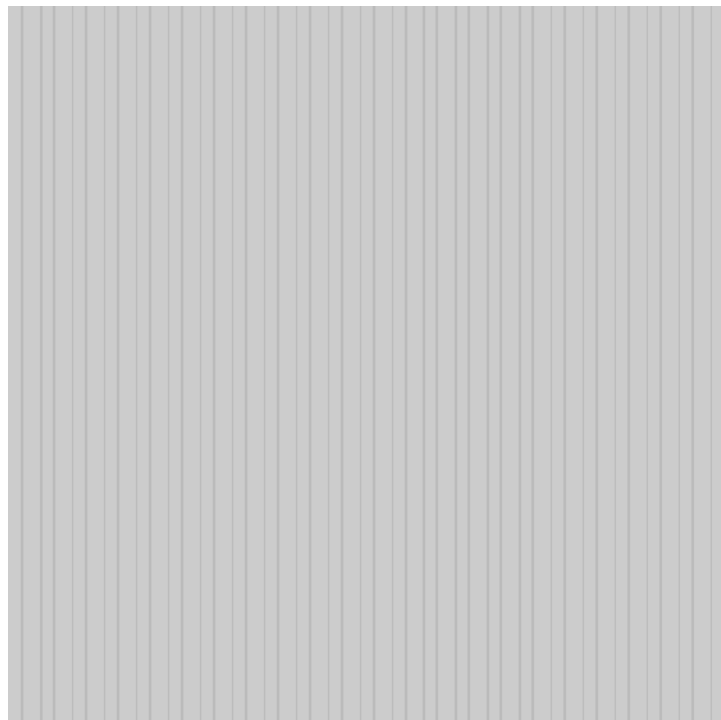
- reduced sensitivity to low frequencies
- defined by CSF functions
- improved by supra-threshold measurements of Cornsweet profile







# Hiding Countershading Profiles

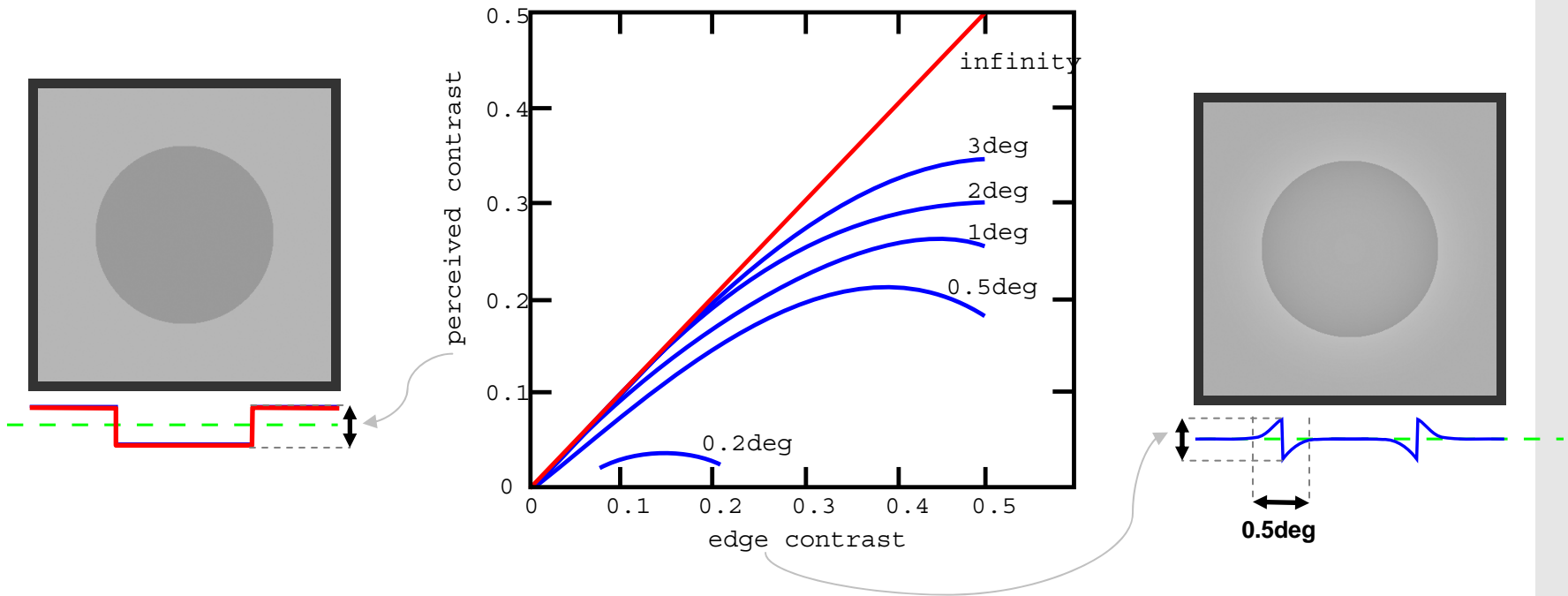


- Contrast masking
  - existing contrast masks new signals of similar orientation and frequency
  - defined by a power function of contrast present in an area
- Essential improvement
  - previous models allow for rather small amplitudes of profiles

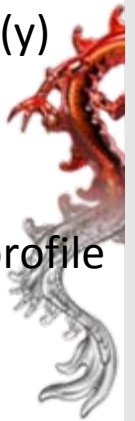




# Limits of Countershading Profiles



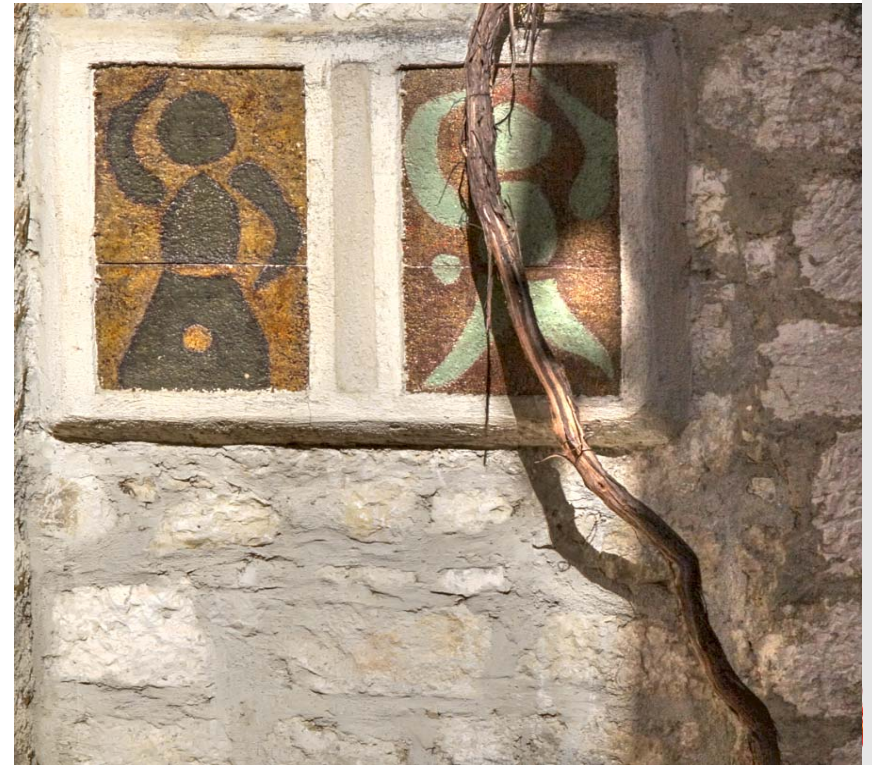
- Measurements plot for the Cornsweet effect
  - contrast at the profile edge (x) and the matching contrast at the step edge (y)
- Masking allows for stronger enhancement
- Maximum correction depends on profile size
  - natural images unlikely require correction of a large contrast with a small profile



# Adaptive Countershading



without visual model



with visual model





# Restoration of TM Images (1/3)



tone mapped image

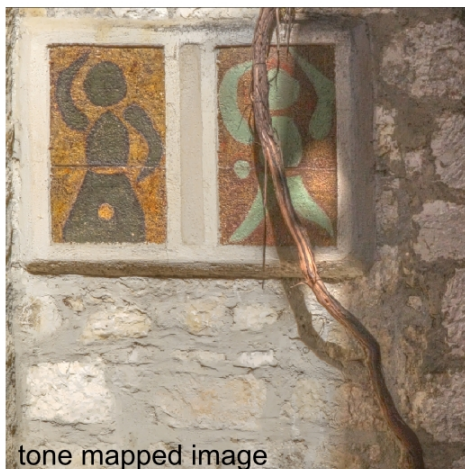


countershading result



countershading profiles

(a) global tone mapping



tone mapped image



countershading result



countershading profiles

(b) contrast equalization tone mapping



# Restoration of TM Images (2/3)

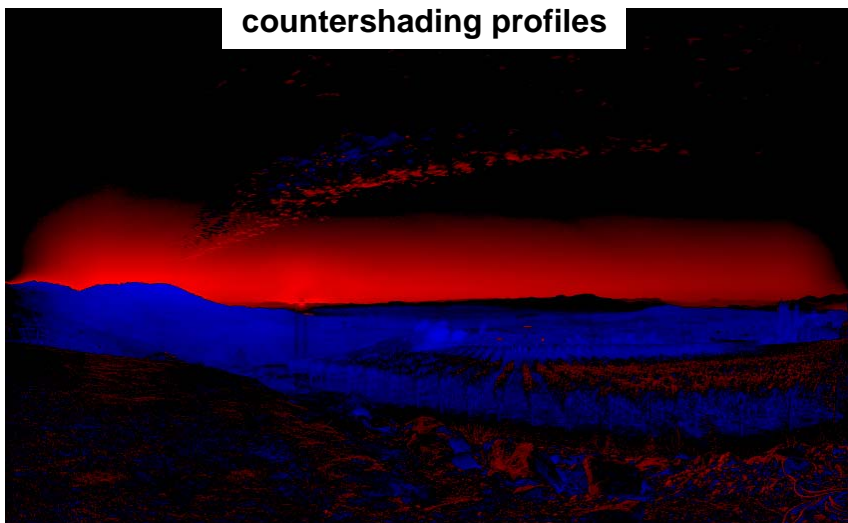
reference HDR image (clipped)



countershading of tone mapping



countershading profiles



tone mapping



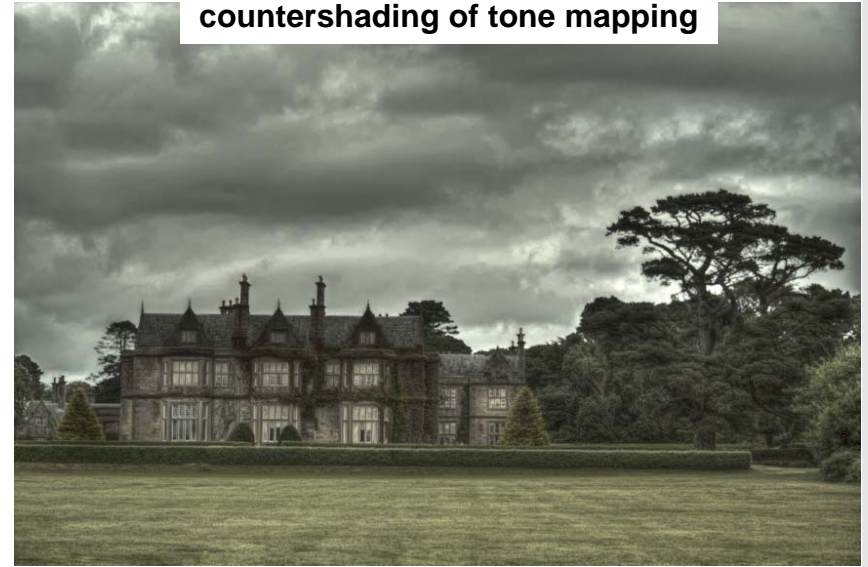


# Restoration of TM Images (3/3)

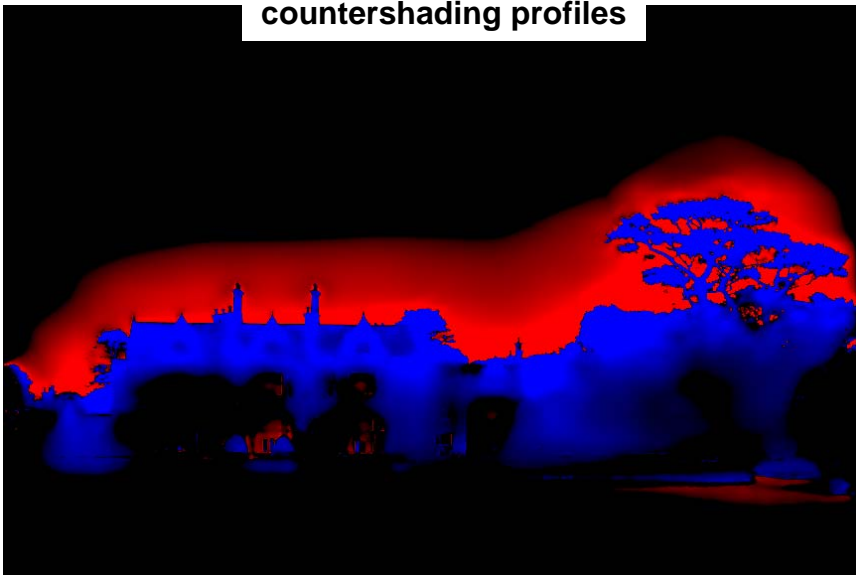
reference HDR image (clipped)



countershading of tone mapping



countershading profiles



tone mapping



# C-shading vs. Unsharp Mask

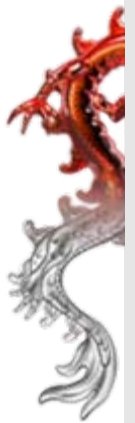
**adaptive countershading**



**unsharp masking**



**tone mapping**



# Countershading Variants

- Traditional countershading

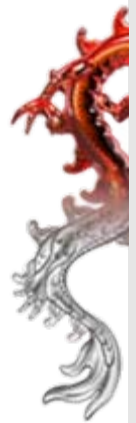
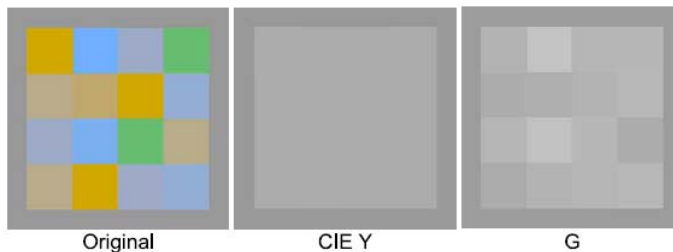
- performed in the achromatic channel to enhance perceived luminance contrast

Cross-modal approach

- Use depth signal to derive countershading profile
- Countershading over chromatic channels enhances the overall image contrast

Color2Grey:

- dimensionality reduction 3->1: may lead to information loss
- countershading in the achromatic channel used to reproduce lost chromatic contrast



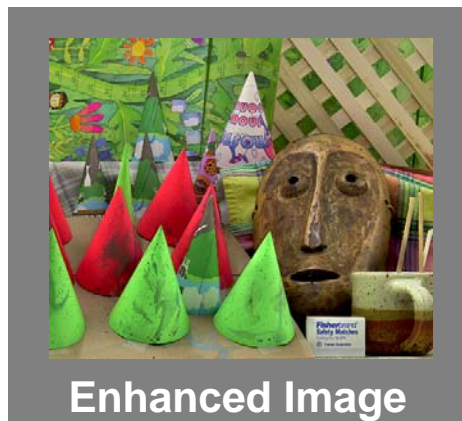
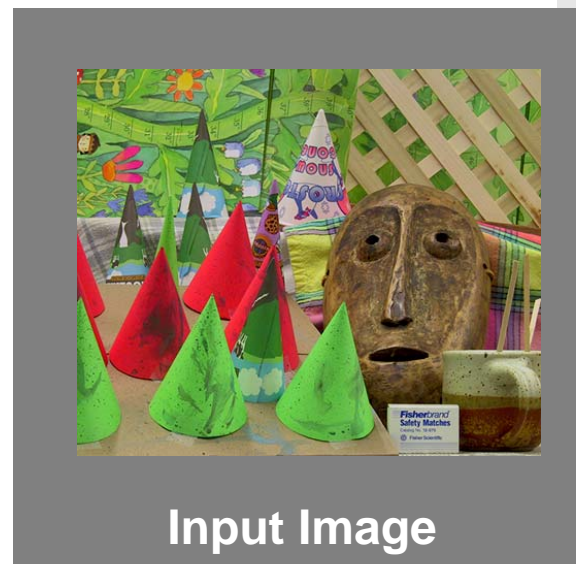


# Purpose: Contrast Restoration



Measure  
Missing Contrast  
at Several  
Feature Scales

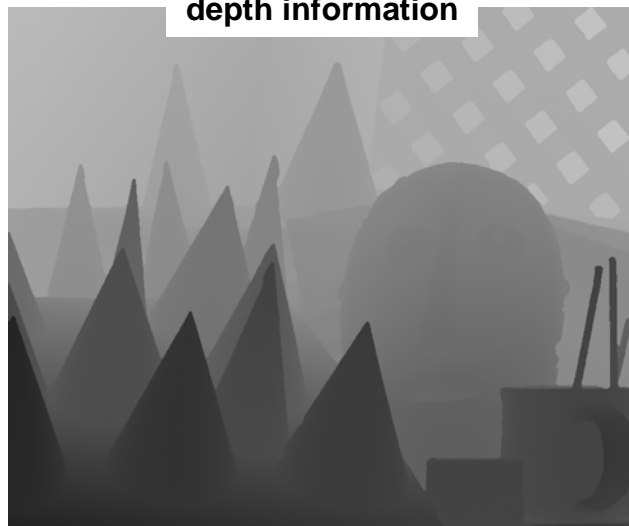
Enhance  
Missing Contrast in  
The Input Image





# Depth Map as Contrast Reference

depth information



original image



adaptive countershading



depth darkening [Luft2006]



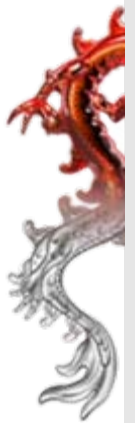
Luft et al. SIG2008



# Colourfulness Countershading



- “Strasbourg”: Gradient method tone mapping, strong global contrast loss so strong restoration effect.
- Colourfulness contrast at border between sky and buildings
  - promotes FG/BG separation
  - creates impression of greater dynamic range
  - increases impression of depth





# Countershading Results (original)





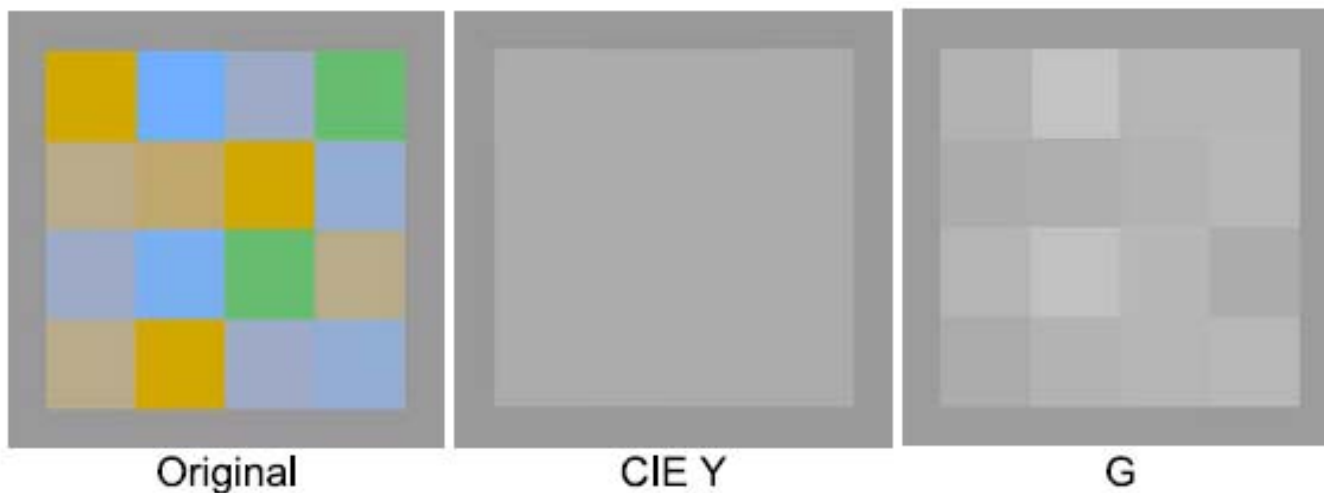
# Countershading Results (chroma enhancement)



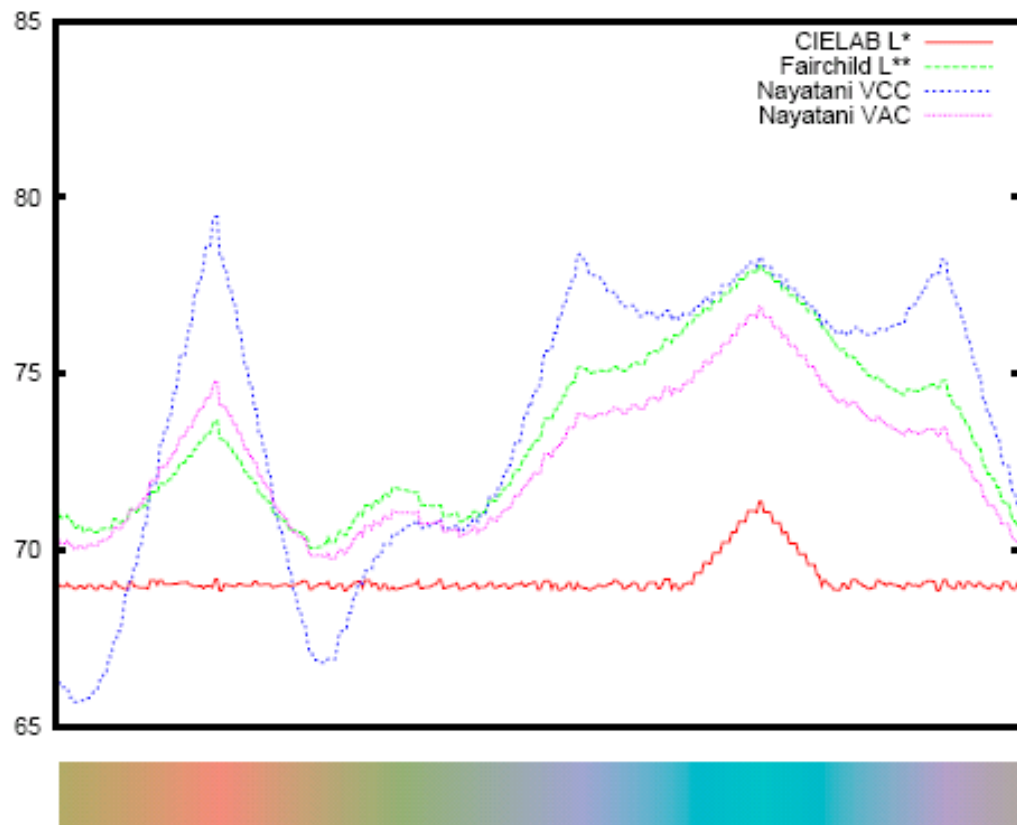


# Color2Grey Application

- Isoluminant color pattern transformed to grey G using Helmholtz-Kohlrausch effect, which takes into account the contribution of chromatic component into brightness



# Color2Grey Application



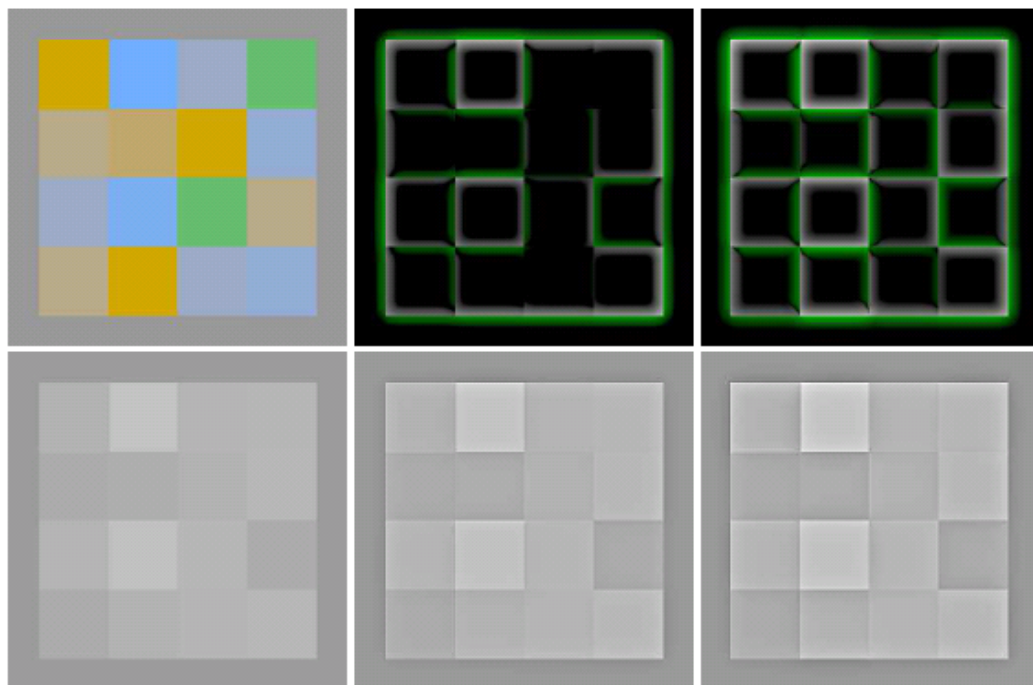
**Figure 1:** *Lightness values from various H-K effect predictors applied to a spectrum of isoluminant colours, compared to CIE L\*.*



# Color2Grey Application

- $G'_{L^*}$ : The effect of adding multi-resolution countershading correction  $h_i(G_{L^*})$  (upper-left) to the greyscale image  $G_{L^*}$  (lower-left)

$$G'_{L^*} = G_{L^*} + \sum_{i=0}^{n-1} k_i \lambda_i h_i(G_{L^*})$$



Original I and G

Basic Unsharp

$G'$

The correction is driven by contrast in chroma channels of the original image  $I$  (upper-left)

$$\lambda_i = \left( \frac{\Delta E(h_i(I))}{|h_i(G_{L^*})|} \right)^p$$



# Color2Grey Application

Original Video Frame



Gimp greyscale



Frame from our G



Frame from our G'  $p=0.8, k=\{0.2, 0.8, 0, 0\}$





# Color2Grey Application

Original



GIMP greyscale



Our G



Gooch Color2Gray



Neumann et al.

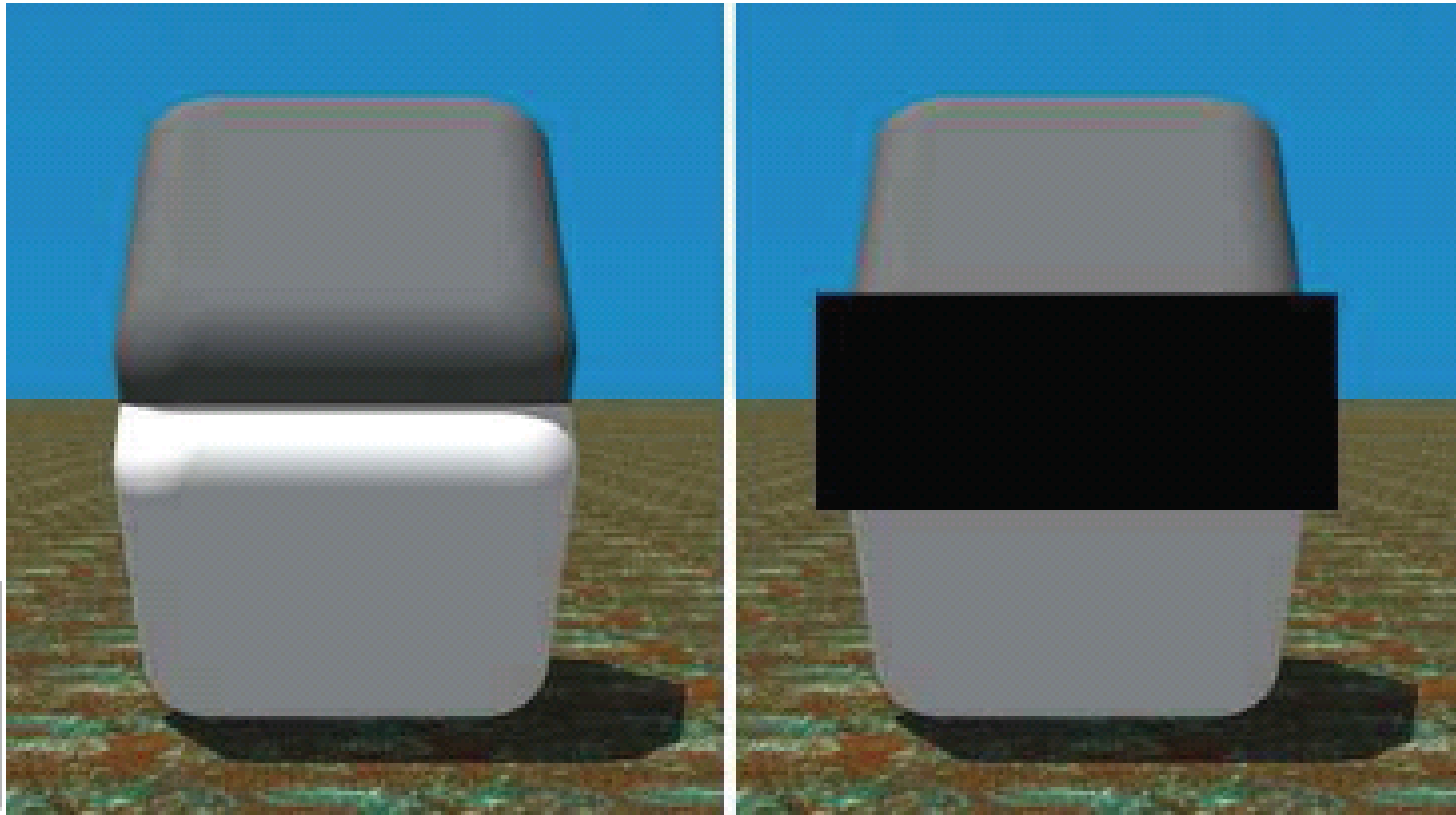


Our G'  $p=0.75$   $k=[0.2,0.6,0.4,0.4]$

Smith et al. EG2008



# Countershading in 3D?

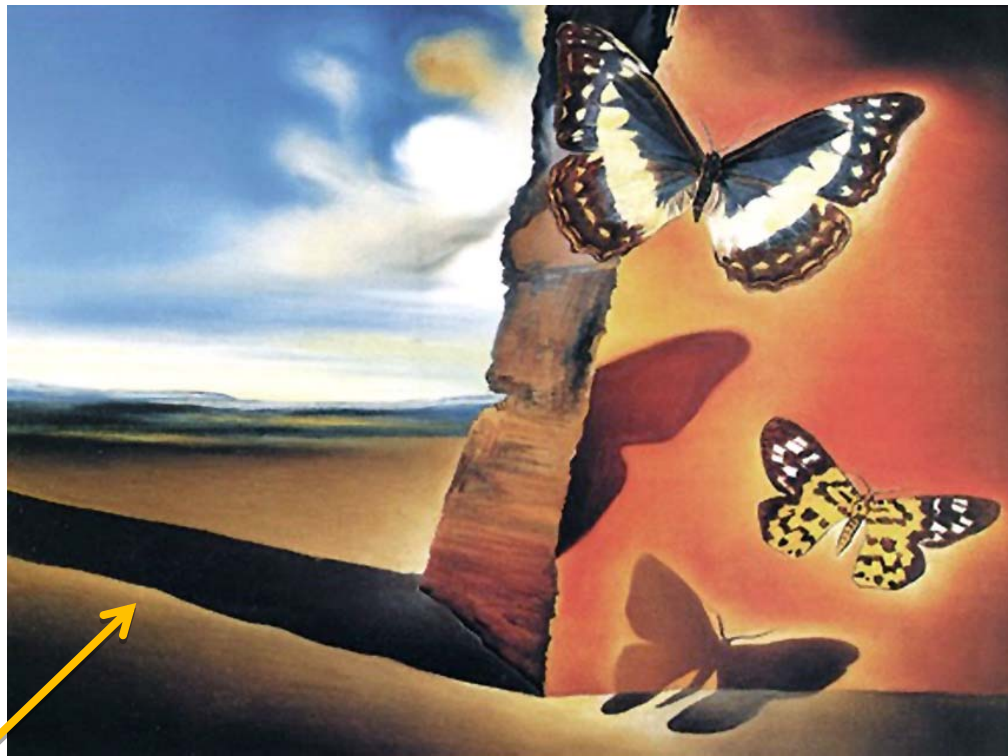


3D Cornsweet Illusion

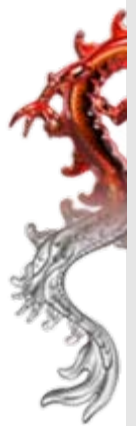
Purves-Lotto illusion: much stronger effect in 3D



# Scene-aligned Countershading

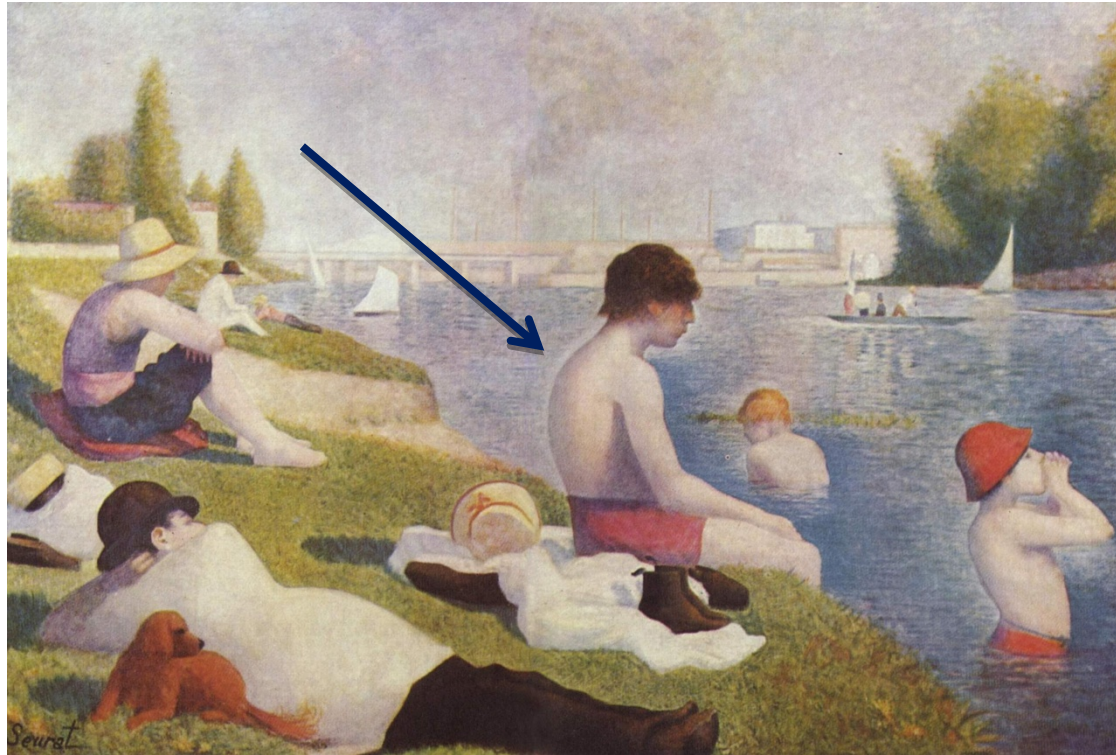


S. Dalí, *Landscape with butterflies*

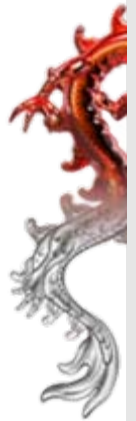




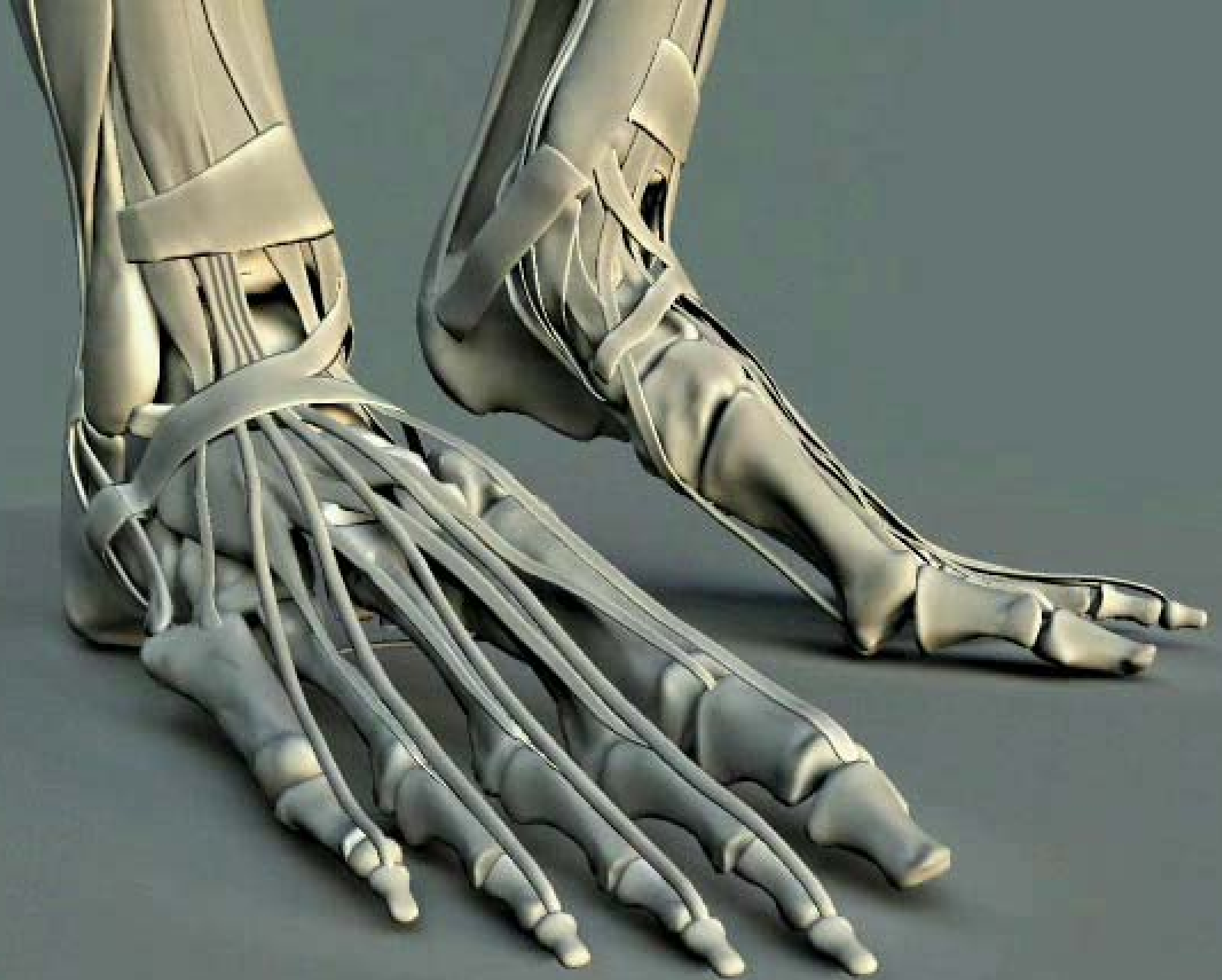
# Scene-aligned Countershading



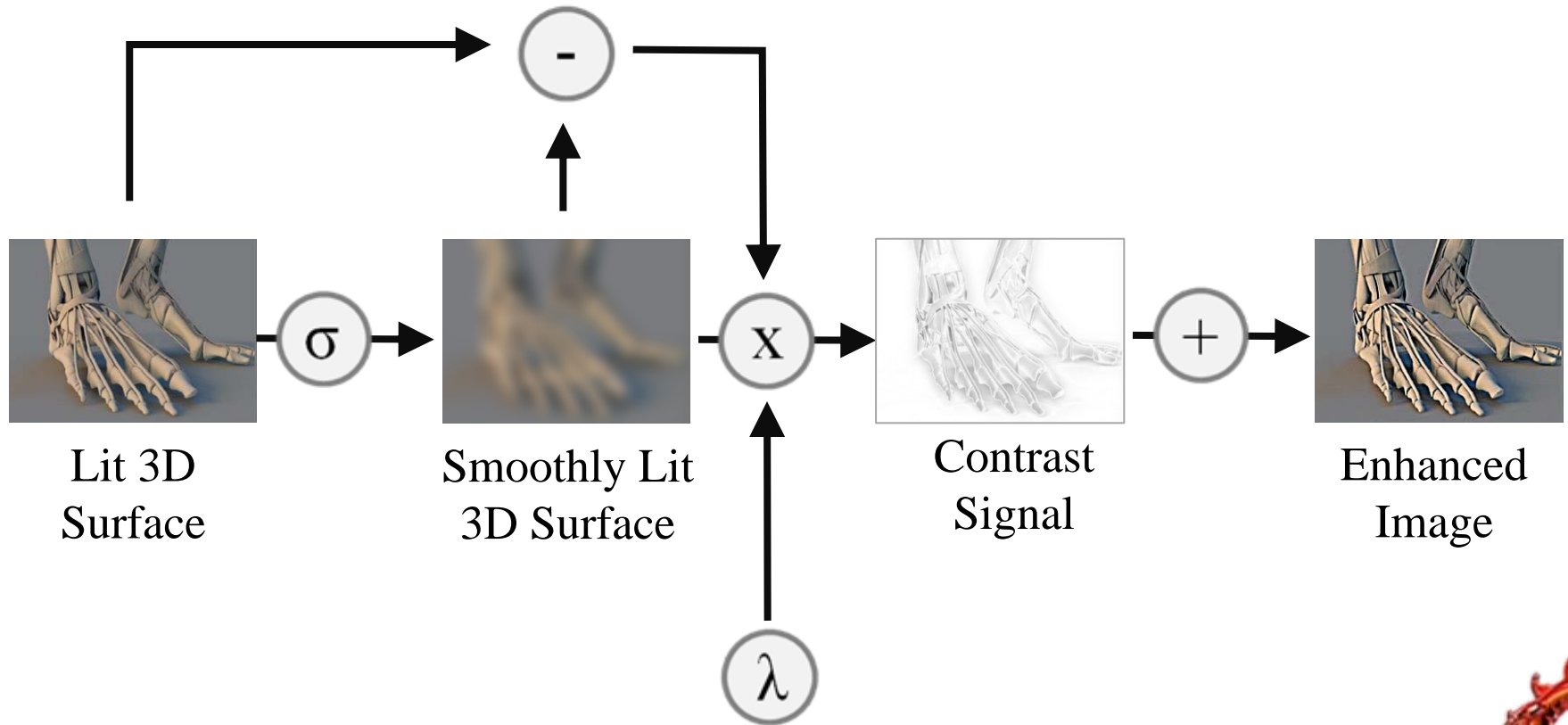
G. Seurat, *Bathers at Asnières*







# 3D Unsharp Masking



$$U(S) = S + \lambda(S - S_{\sigma})$$



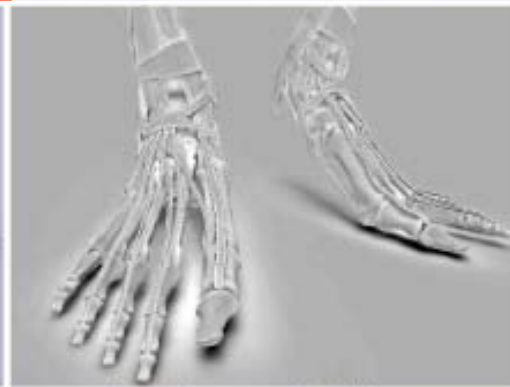
# 3D Unsharp Masking

3D unsharp masking



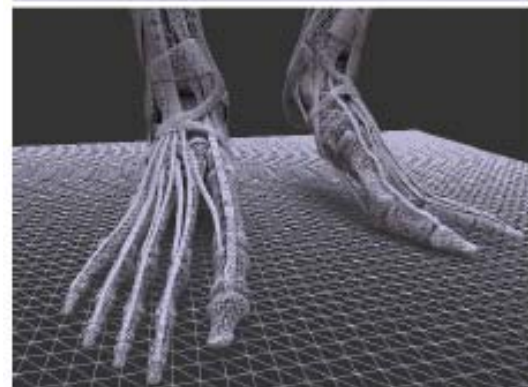
Original image

3D blurred signal



Enhancement signal

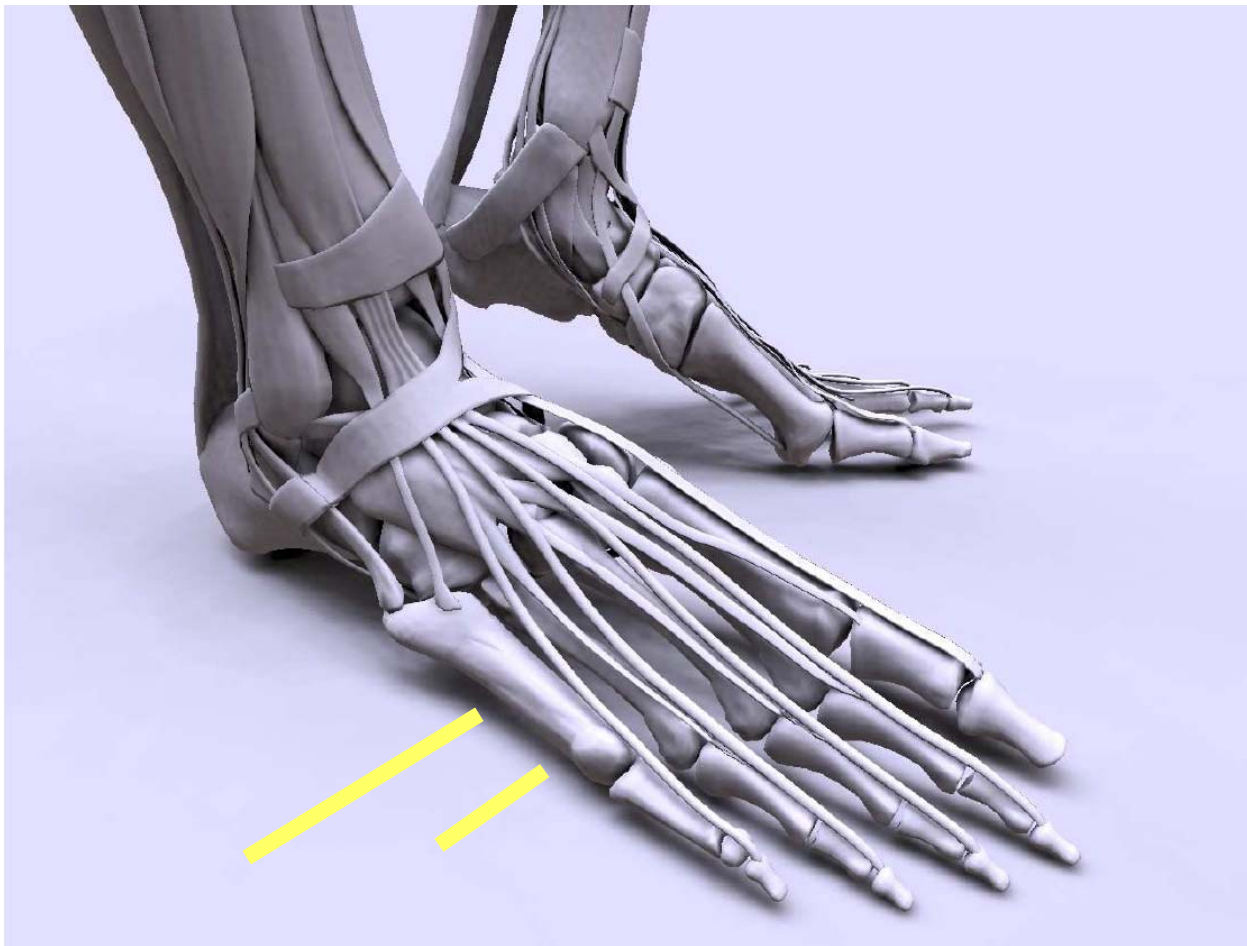
Mesh



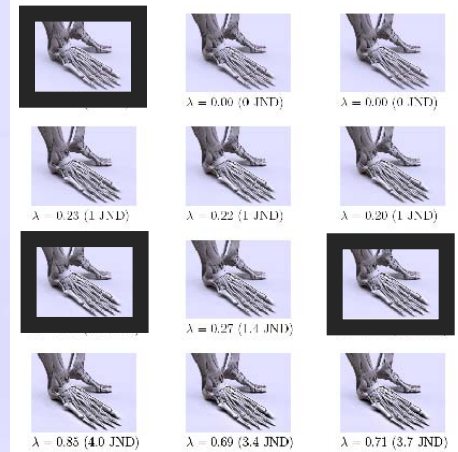
2D unsharp masking



# Adjustable Effect



Width  $\sigma$



Strength  $\lambda$

$$U(S) = S + \lambda(S - S_{\sigma})$$





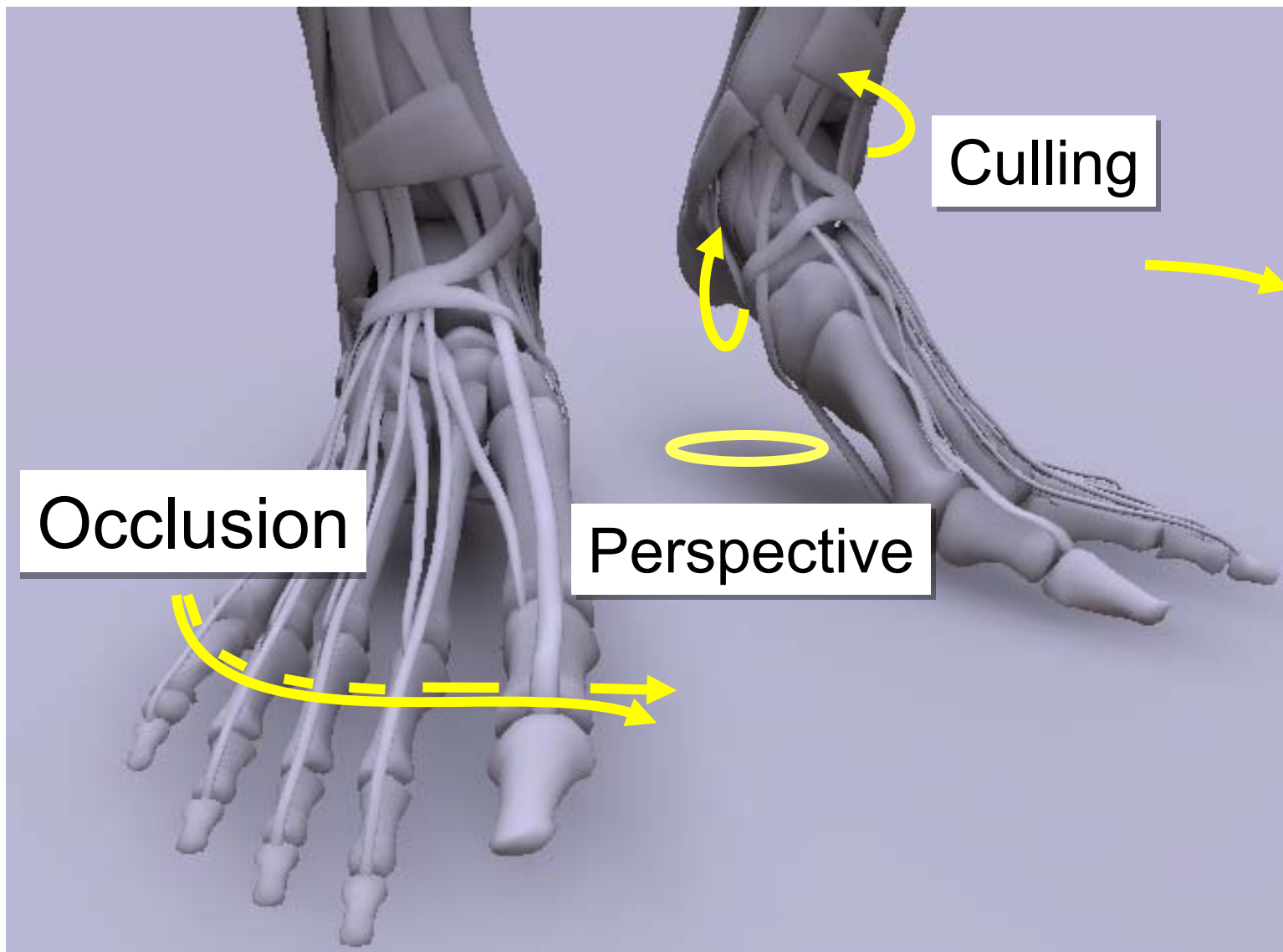


# 2D vs. 3D Unsharp Masking Comparison

|                     | 2D                    | 3D                      |
|---------------------|-----------------------|-------------------------|
| Signal              | Image                 | Lit Surface             |
| Smoothing           | (Gaussian) Image Blur | Laplacian Surface Blur  |
| Representation      | Pixels                | Lit vertices and pixels |
| Smoothness $\sigma$ | Image distance        | Geodesic world distance |
| Strength $\lambda$  | Factor                | Factor                  |



# 3D Unsharp Masking: Scene Coherence





3D unsharp  
masked rendering



Original  
rendering

Ritschel et al. SIG2008



# Enhanced Text Contrast in the Shadow

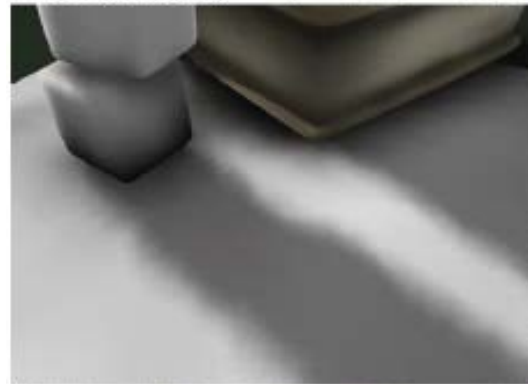
3D unsharp masking



Original image



3D blurred signal



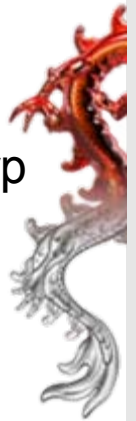
Enhancement signal



Mesh



2D unsharp masking



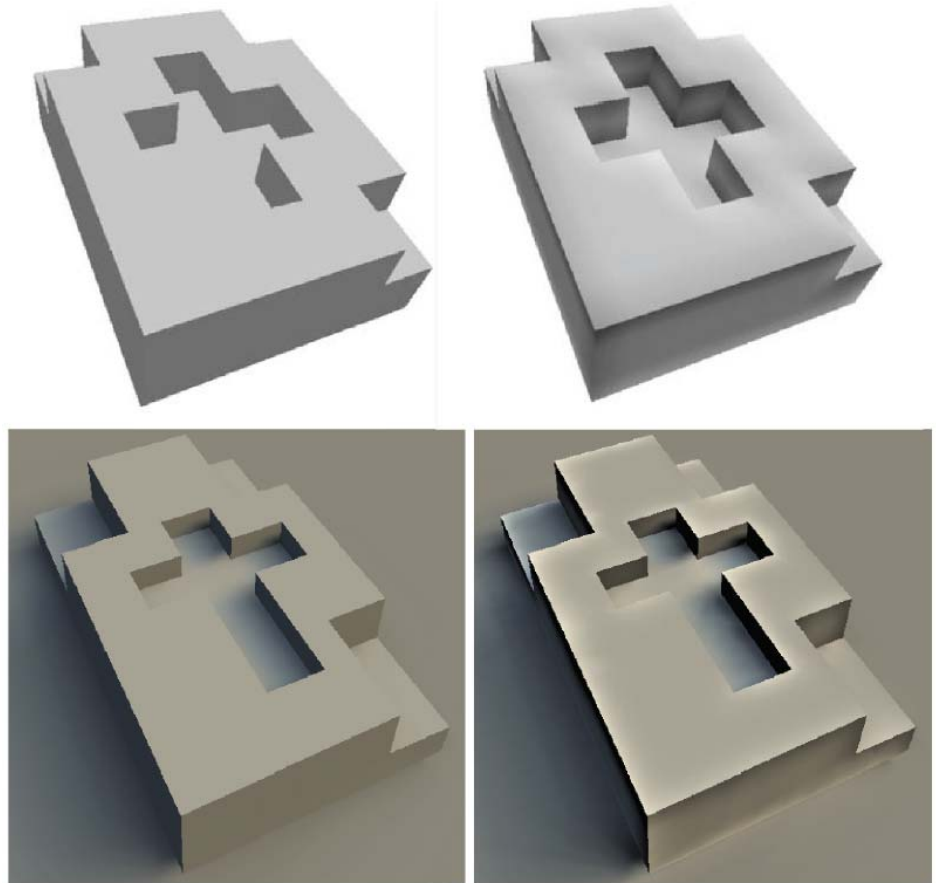


# Results – Legibility



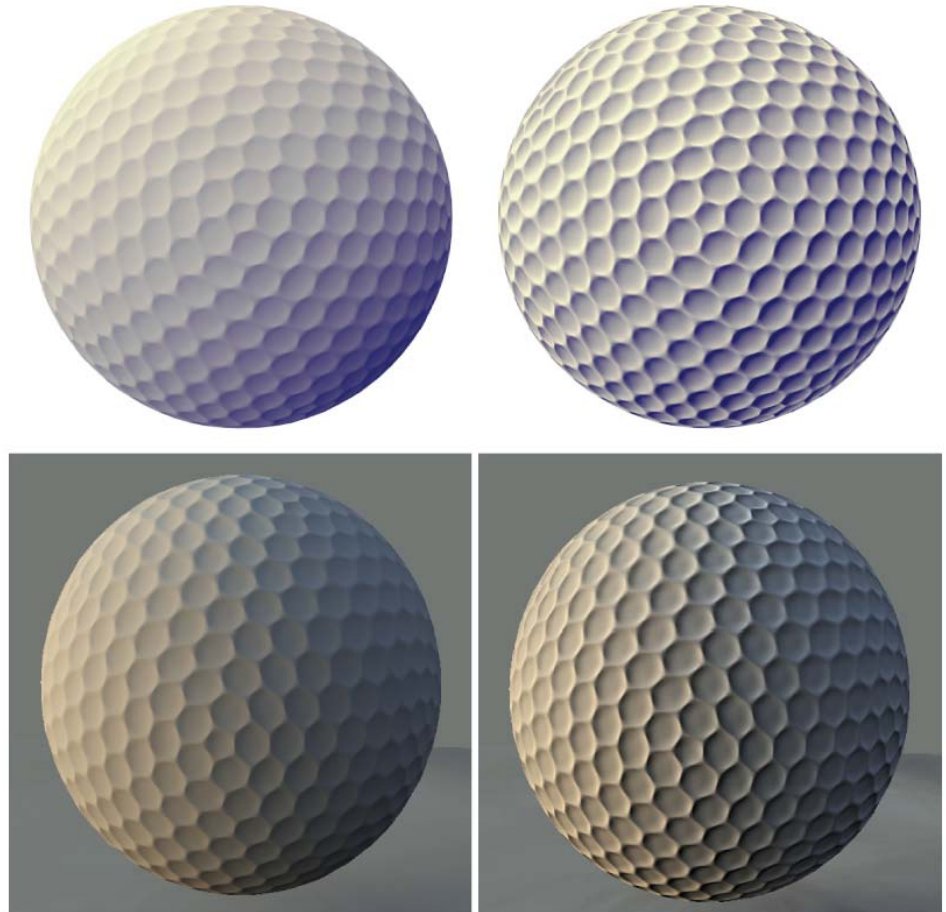
- Only **geometric** term
  - Shadows ?
  - Highlights ?
  - Reflectance ?
- Vertex resolution
- 3D unsharp masking:  
Pixel resolution

Cignoni et al. '05, C & G Vol. 29

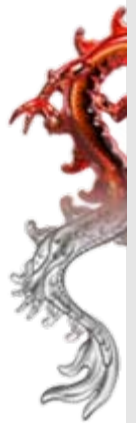


- Object enhancement
  - Illuminate each vertex at grazing angle
  - Improves geometry understanding
  - Highlights?
  - Shadows?
- Scene enhancement
  - Change everything
- Both have applications

Rusinkiewicz et al., SIGGRAPH'06

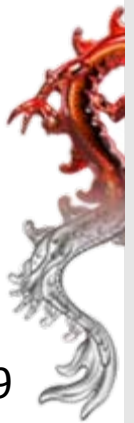


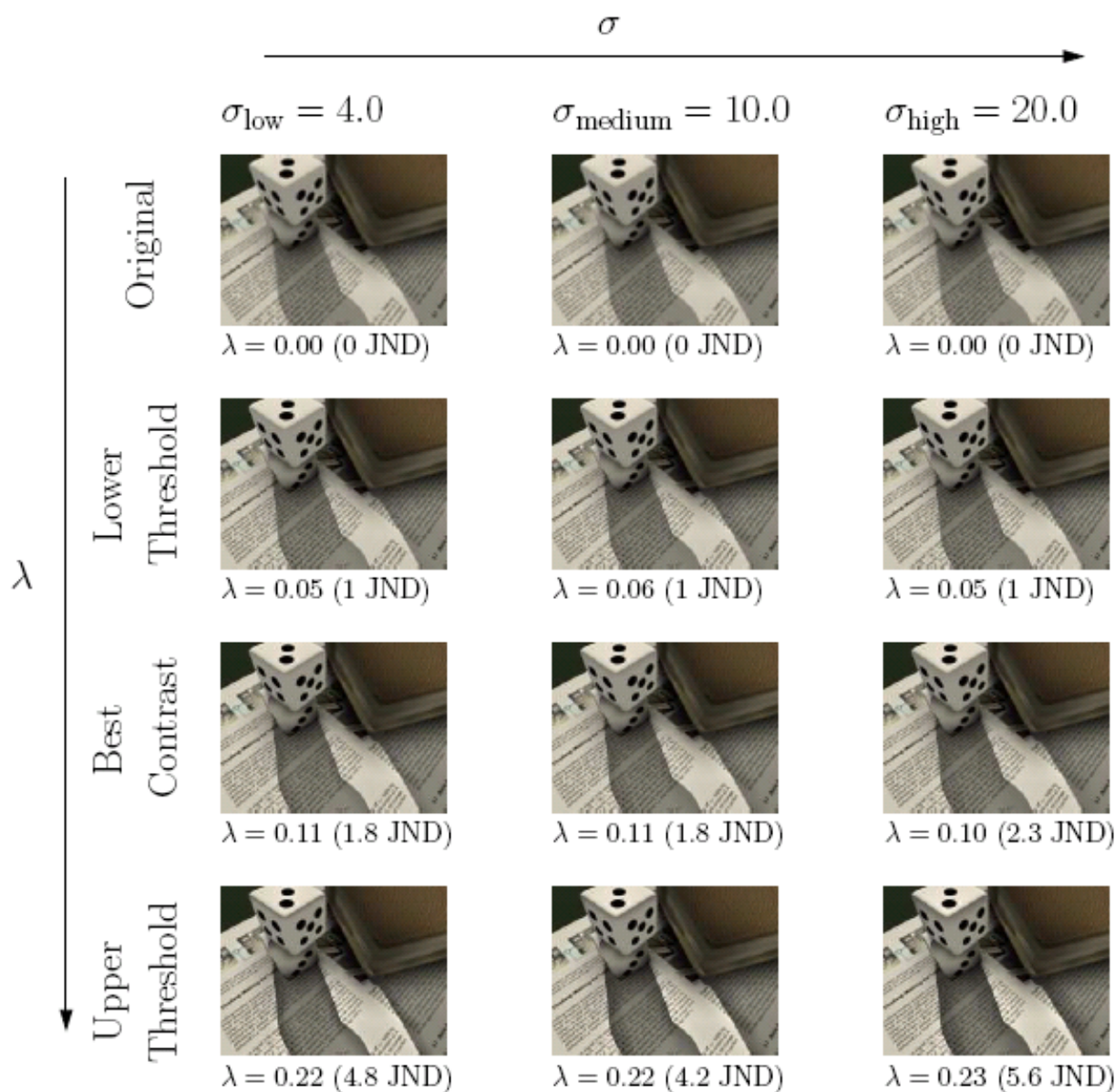
# Specular Shading

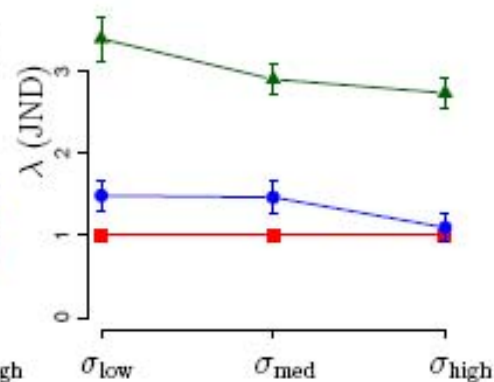
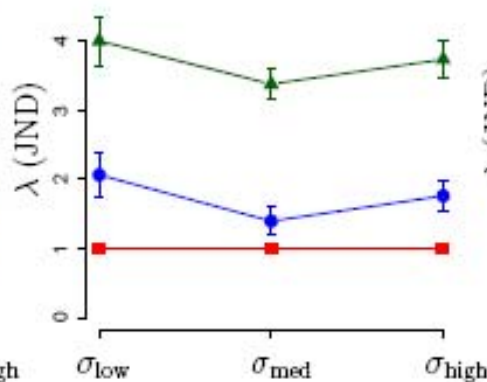
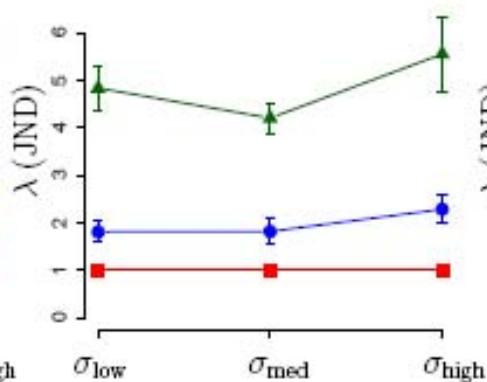
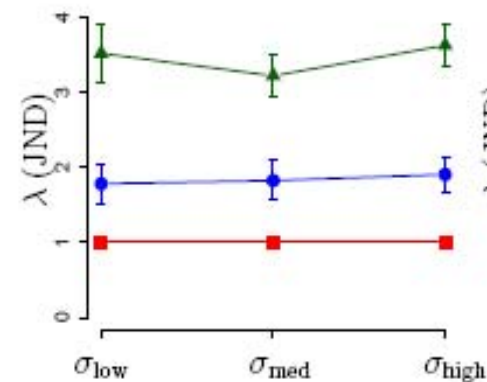




- Goals
  - Find suitable settings
  - See limitations
  - Rank preference
- Method of adjustments
  - Strength  $\lambda$ : adjustable
  - Fixed width  $\sigma$ : low, medium, high
  - 4 scenes, 15 participants
  - Task: Find such  $\lambda$  that:
    1. Added enhancement is *just noticeable*
    2. Added enhancement becomes *objectionable*
    3. Image appearance is *preferred*







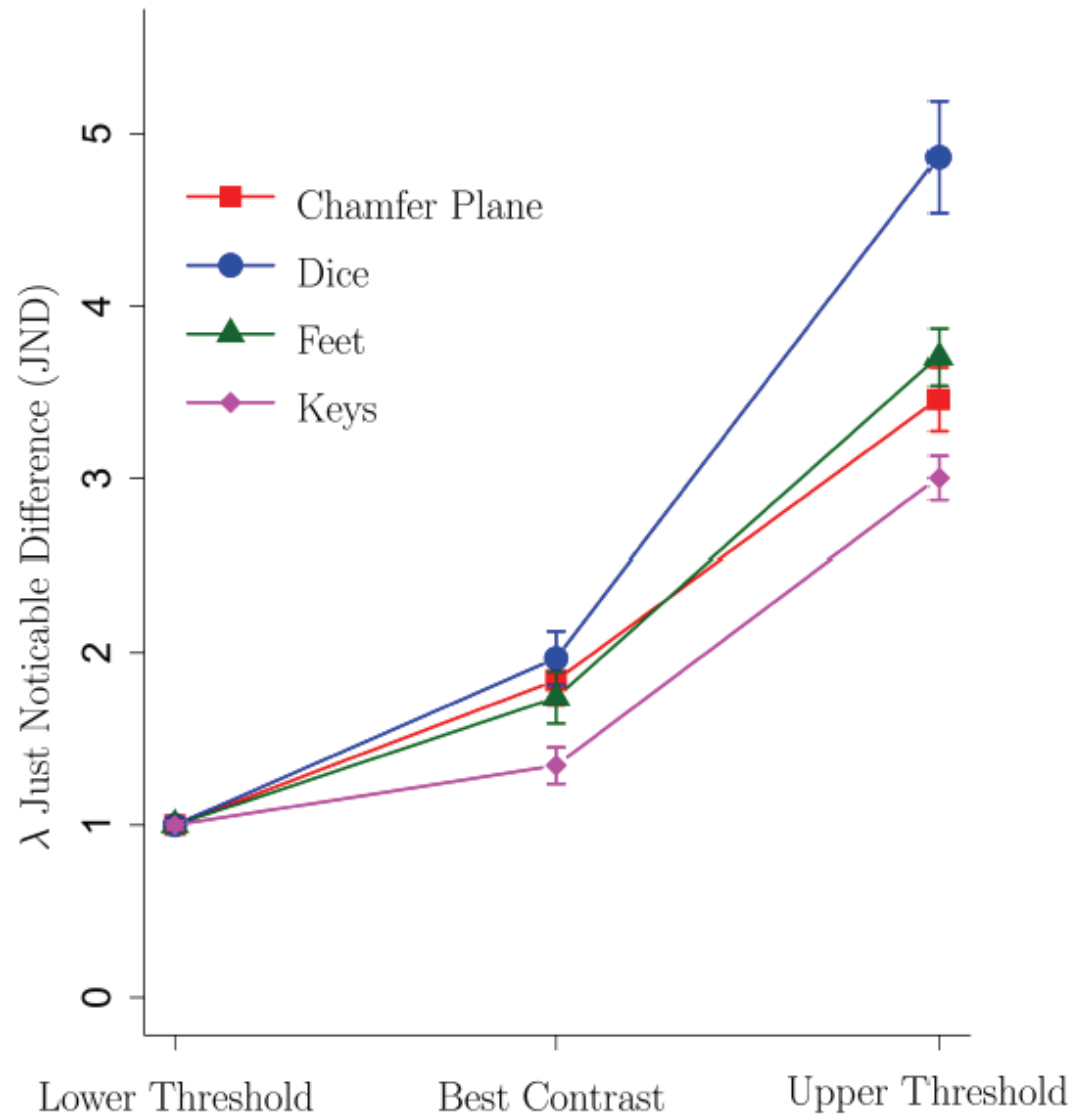
— just visible

— best contrast

— objectionable



- 2 JND
  - preferred
- 4 JND
  - objectionable



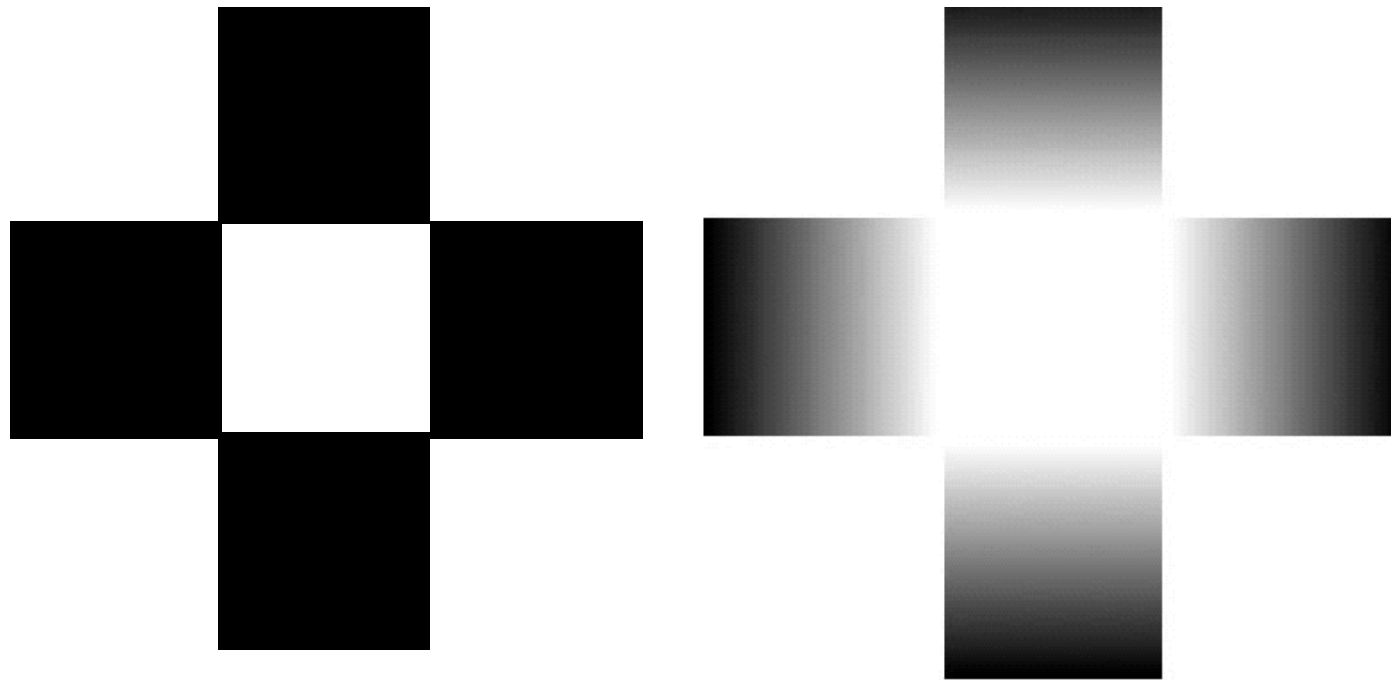


## Better communicate image contents with a minimal change to image appearance

- Application of Cornsweet illusion to image enhancement
  - Generalization of unsharp masking
  - Automatic enhancement given the reference data:
    - HDR image
    - depth information
    - shading in 3D scene
  - Scene consistent 3D unsharp masking leads to even stronger effects



- Glowing effect [Zavagno and Caputo 2001]



# Glare Illusion





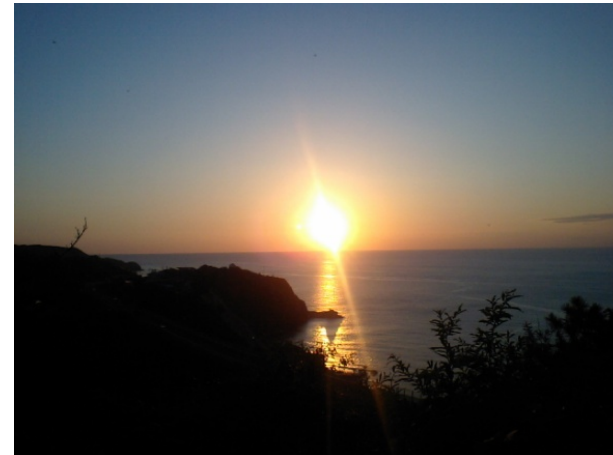
# Glare Illusion in Different Media



Arts



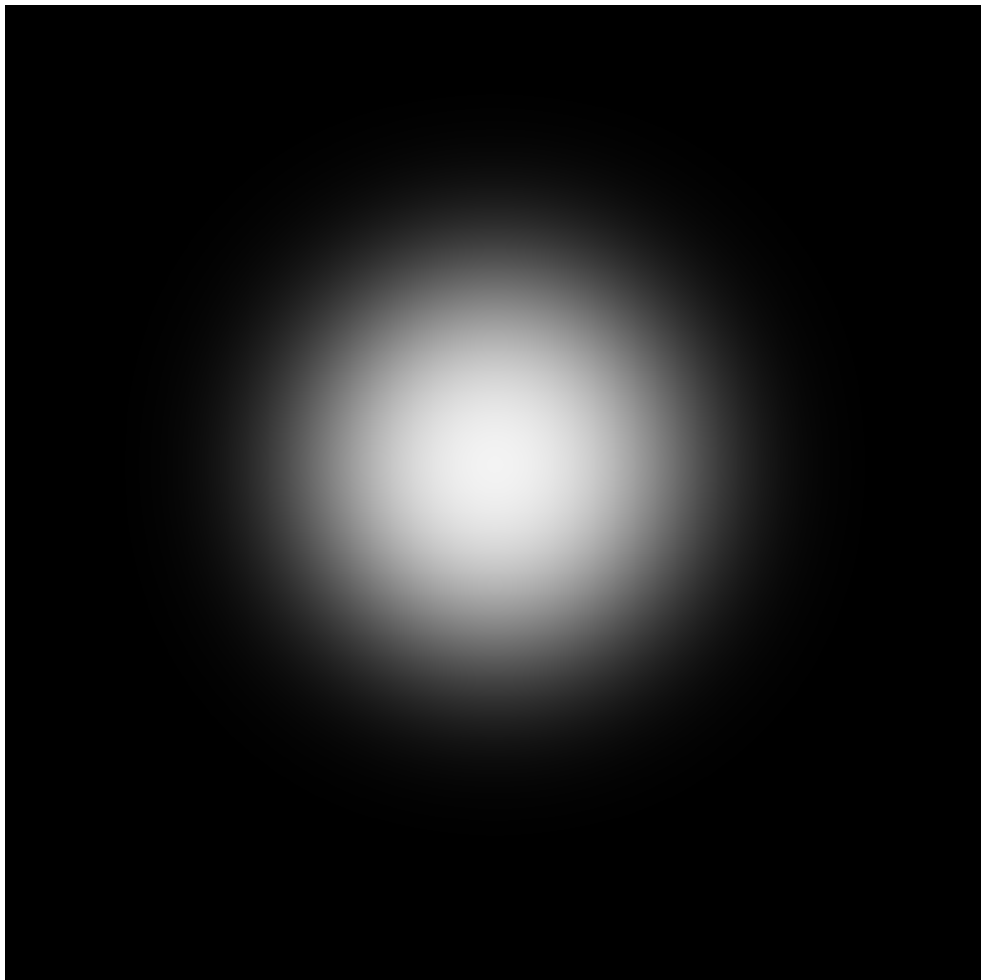
Computer Games



Photography





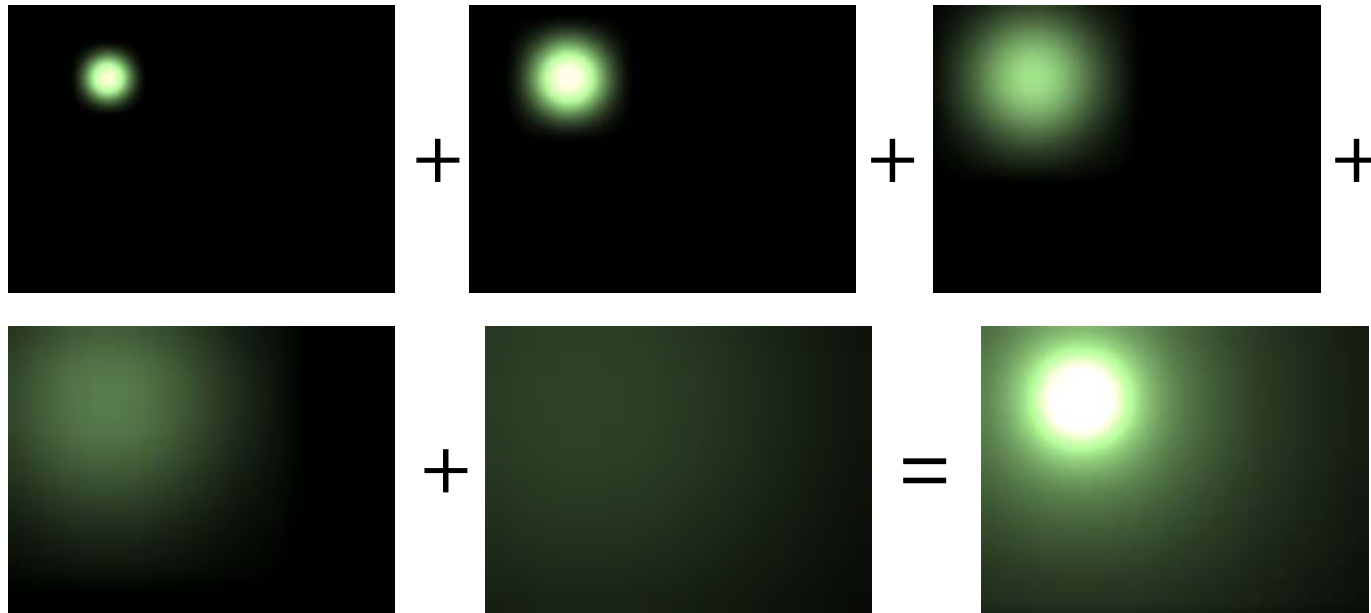


- Simple approximation: convolution with Gaussian
- Already does a good job in conveying brightness

Yoshida *et al.* (2008)



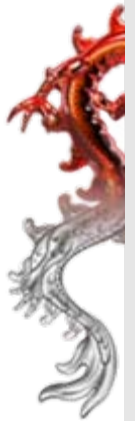
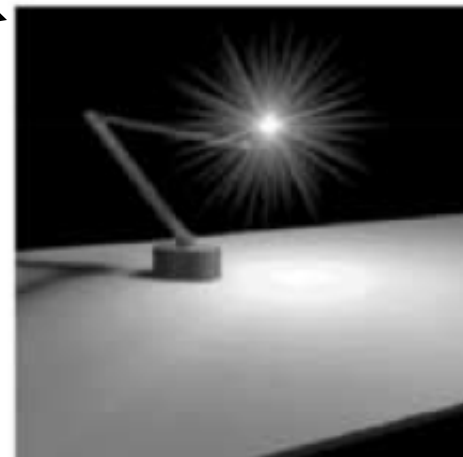
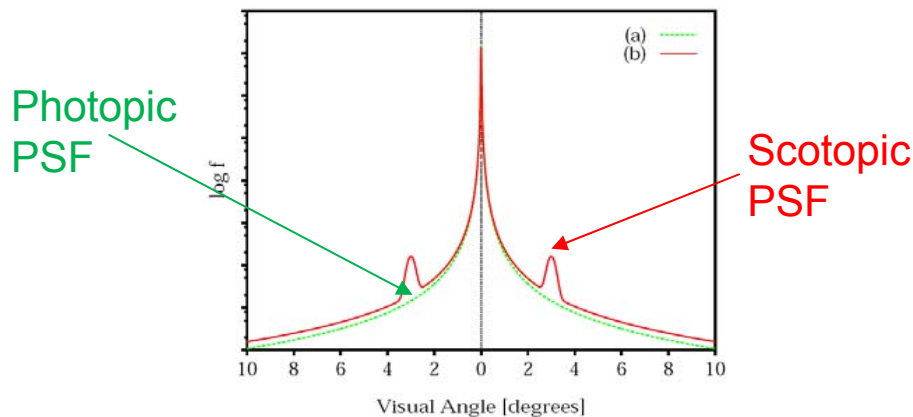
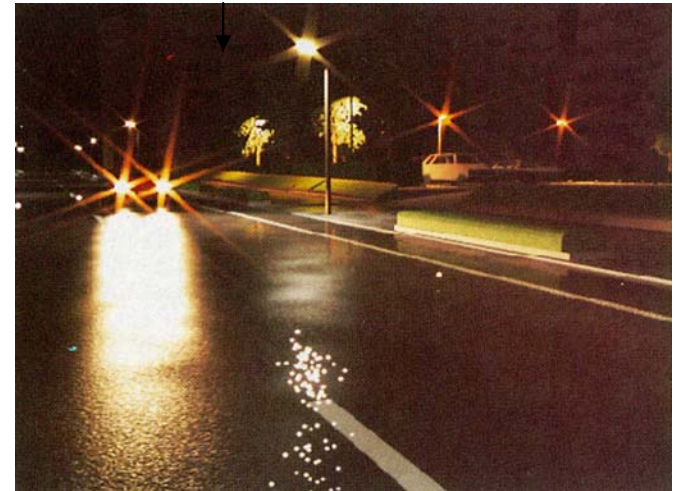
- Kawase, Practical Implementation of High Dynamic Range Rendering, Game Developer's Conference 2004



# Glare in Realistic Rendering

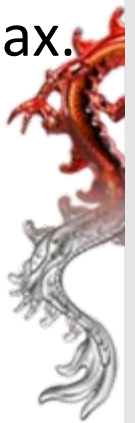
## ■ Optics-based models for rendering glare illusion

- [Nakamae et al. 1990]
- [Rokita 1993]
- [Ward Larson et al. 1997]
- [Kakimoto et al. 2004, 2005]
- [Van den Berg et al. 2005]
- [Spencer et al. 1995]



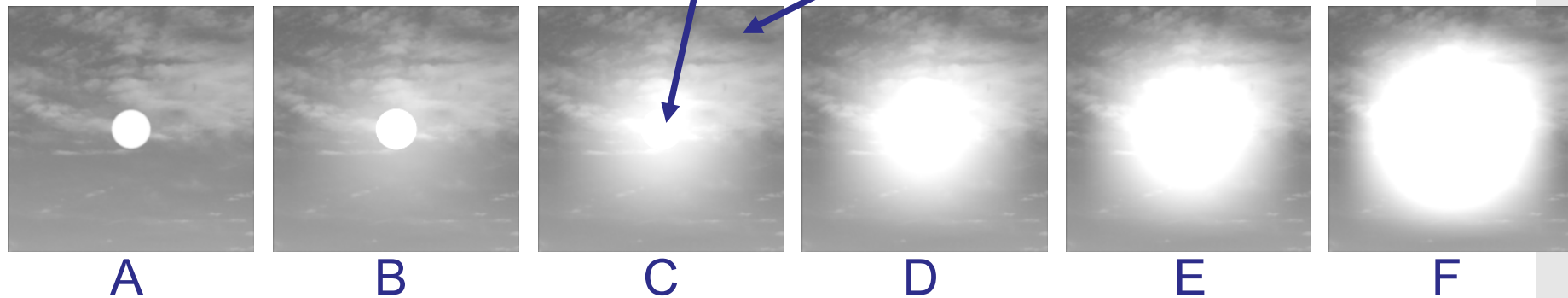
# Psychophysical Experiment

- Goal
  - Measuring the brightness boosts caused by glare illusion
- 2 methods, 6 patterns for each
  - Gaussian: blurring kernel
    - Cheap approximation
  - Spencer et al.: human eye's PSF (disability glare)
    - Optical correctness
- 10 subjects
  - 20 minutes per person
- Barco Coronis Color 3MP Diagnostic Luminance Display (max. 430 cd/m<sup>2</sup>)
- Dimly illuminated room (60 lux)

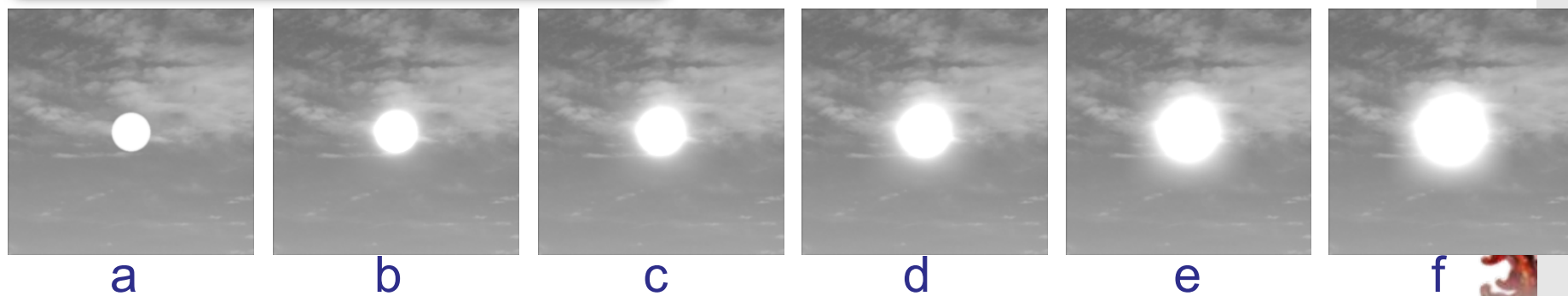




## Method I (Gaussian)



## Method II (Spencer et al.)



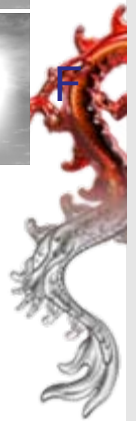
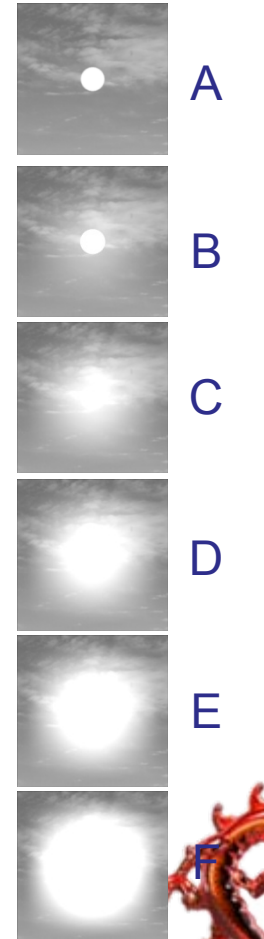
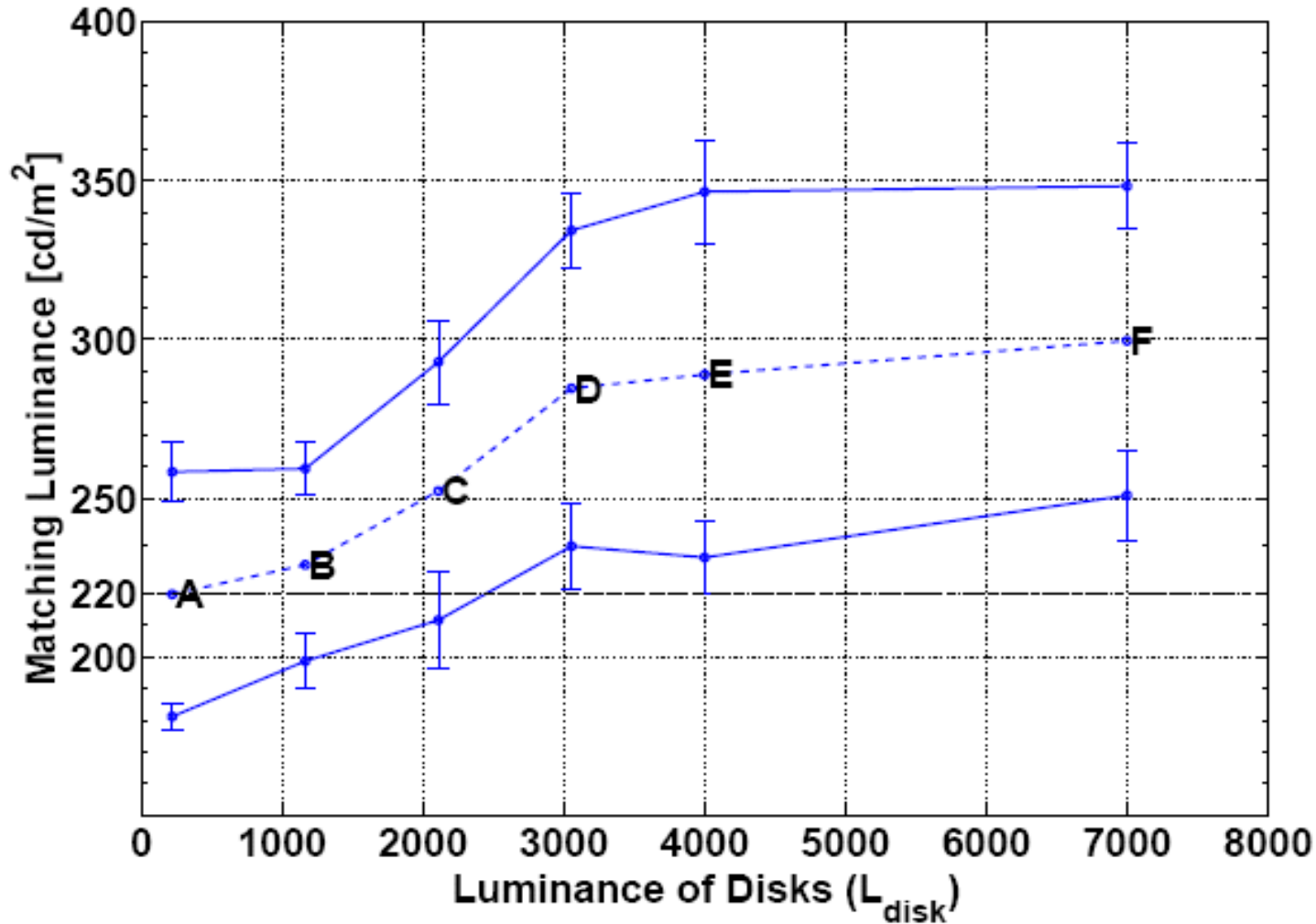
# Perceptual Experiment



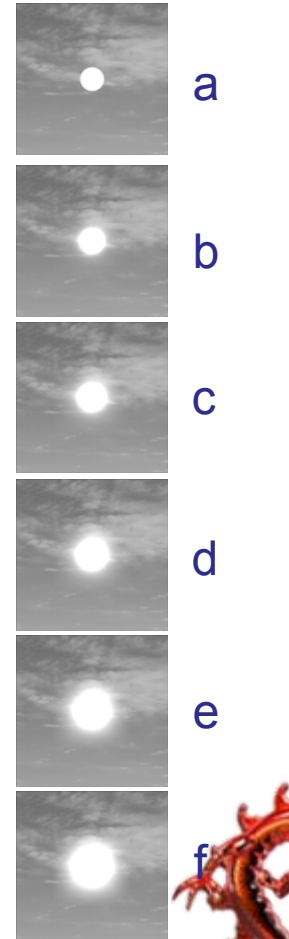
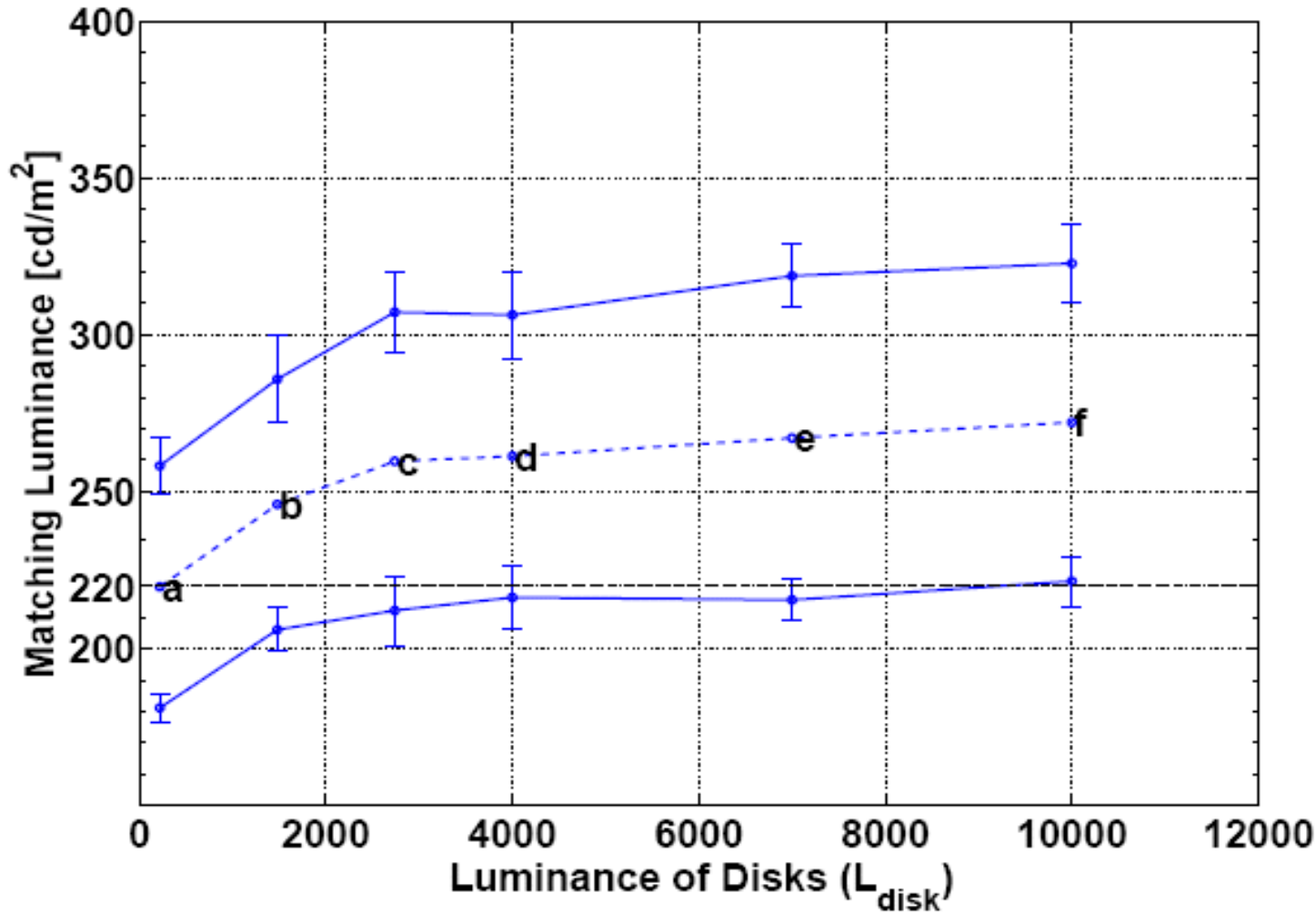
Task: Adjust the target disk luminance as close as possible to that of the reference, but slightly yet visibly darker/brighter.



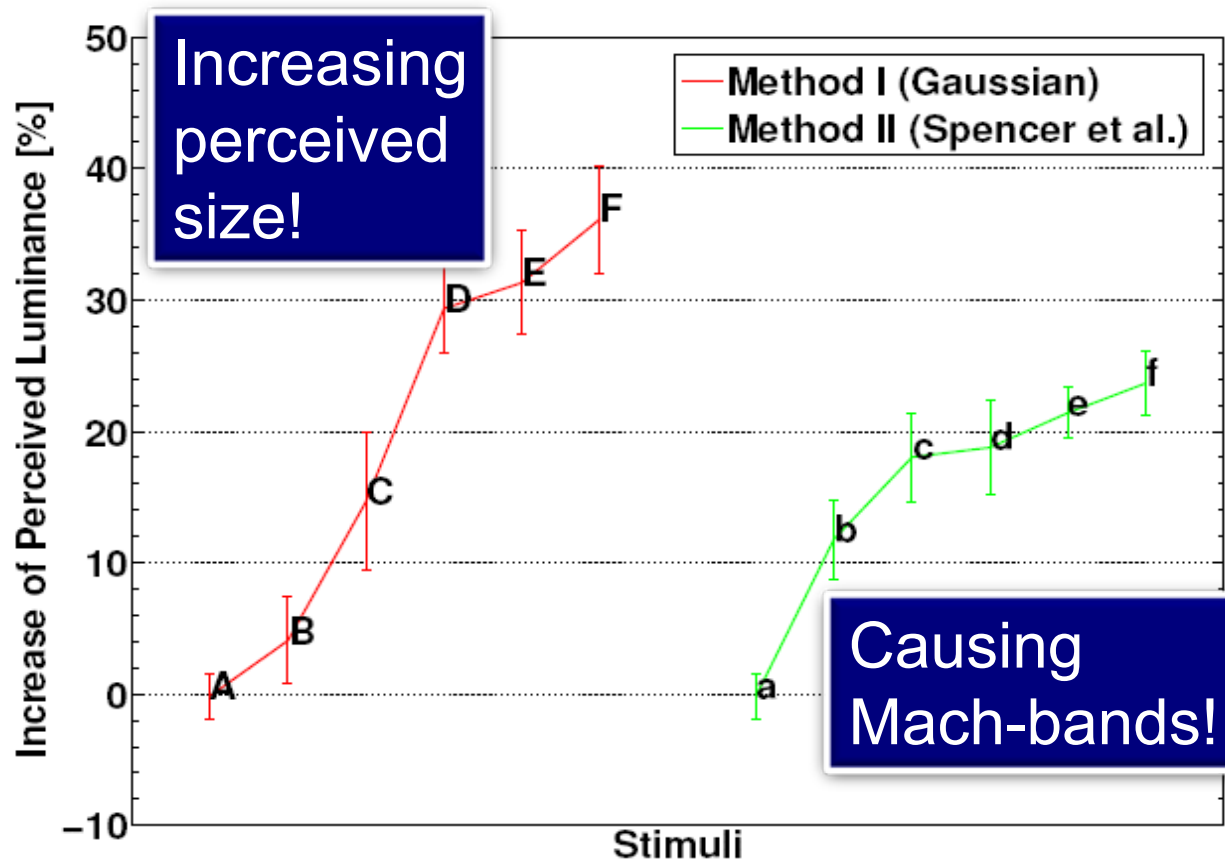
# Method I (Gaussian)



# Method II (Spencer et al.)

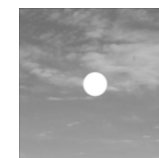




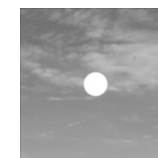


Method I (Gaussian)

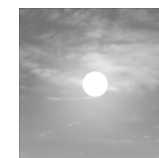
Method II (Spencer et al.)



A



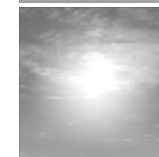
a



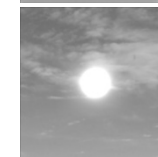
B



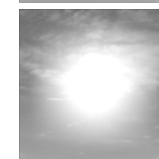
b



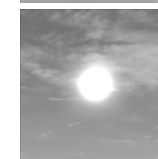
C



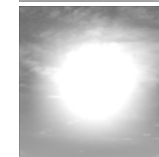
c



D



d



E



e



F



f

- Measuring brightness boost of the glare illusion
  - Increasing the perceived luminance by 20 – 35 %
  - Gaussian blurring is equally effective

- Trade-offs for both Gaussian and human eye's PSF





- **Realism**  
Colorful haloes around bright lights by camera or eyes
- **Temporal glare**  
Changes over time (in eyes)
- **Motivation**  
Model of dynamic human eye to simulate temporal glare
- **Study**  
Can temporal glare boost even further boost brightness?



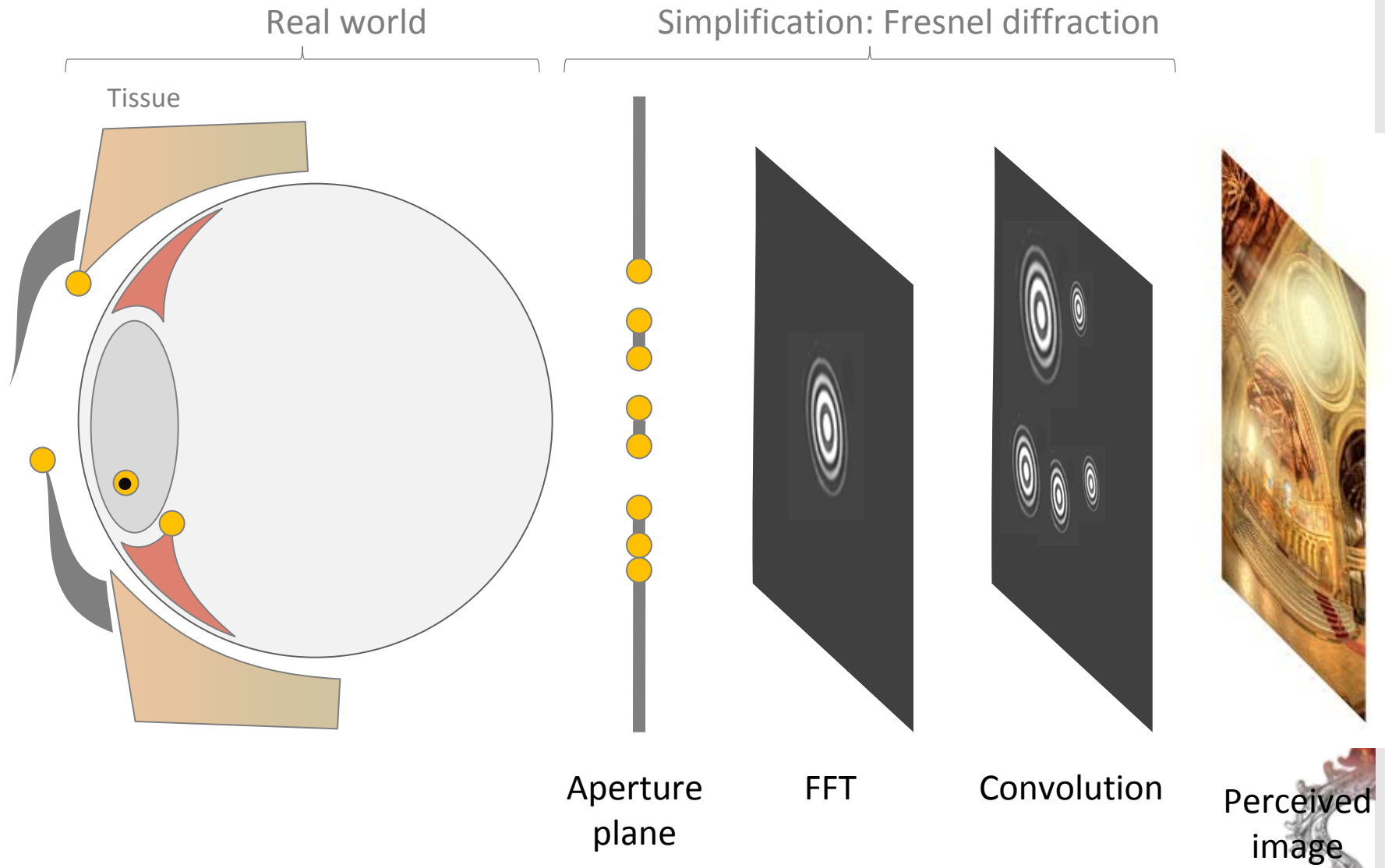
# Point spread function (*PSF*)



- **Point Spread Function**
- Key to glare modeling
- Describes, how a **pixel** maps to a **pattern** under an **aperture**



# Our Simplified Model





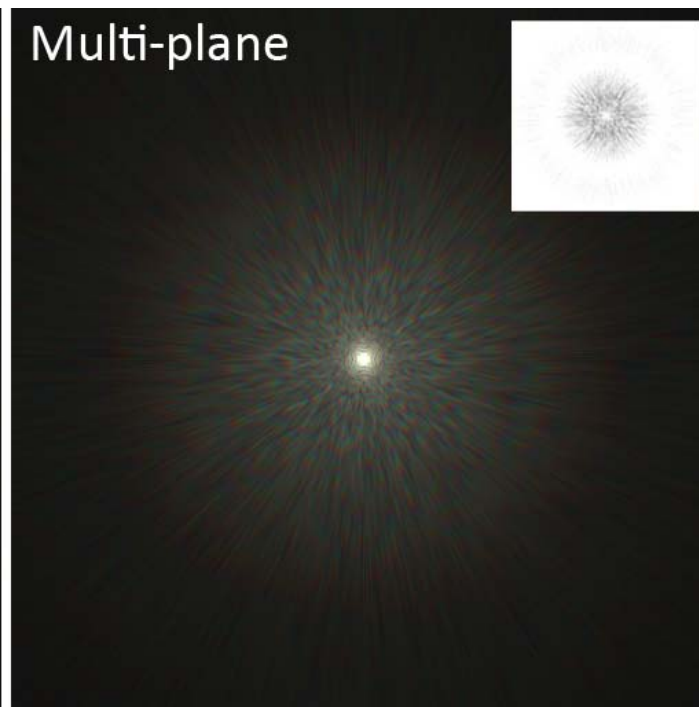


# Diffraction: Single vs. Multi Aperture Planes

$$L_i(x_i, y_i) = K \left| \mathcal{F} \{ P(x_p, y_p) E(x_p, y_p) \}_{p=\frac{x_i}{\lambda d}, q=\frac{y_i}{\lambda d}} \right|^2$$

$$K = 1/(\lambda d)^2$$

$$E(x_p, y_p) = e^{i\frac{\pi}{\lambda d}(x_p^2 + y_p^2)}$$



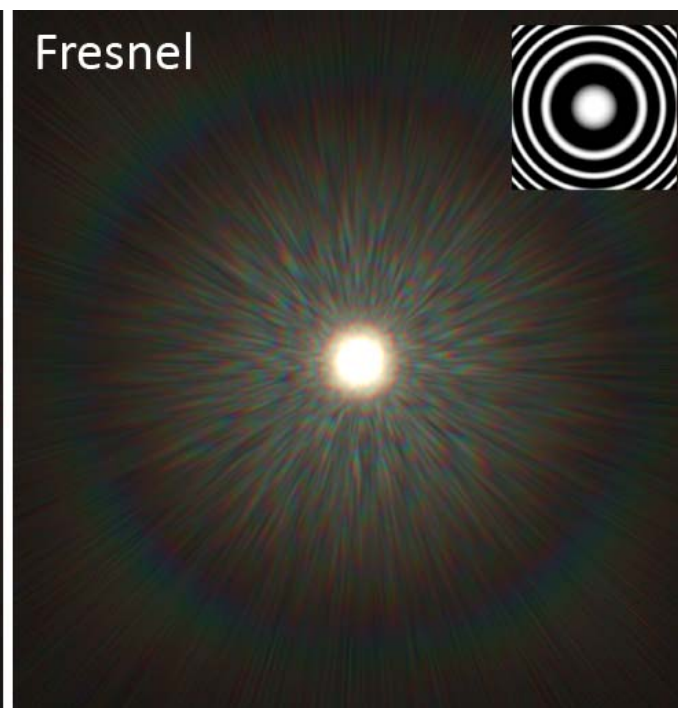


# Diffraction: Fraunhofer vs. Fresnel

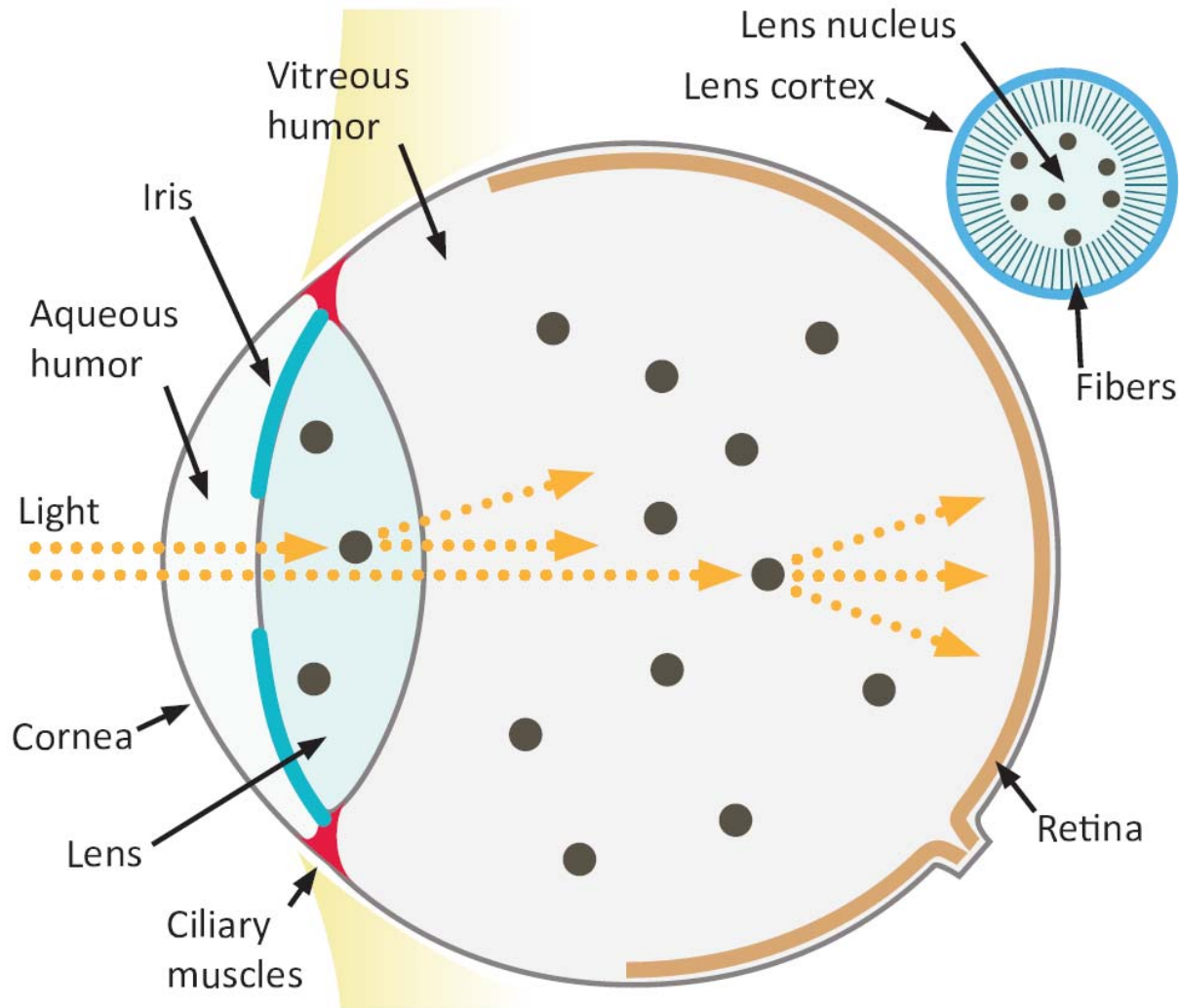
$$L_i(x_i, y_i) = K \left| \mathcal{F} \{ P(x_p, y_p) E(x_p, y_p) \}_{p=\frac{x_i}{\lambda d}, q=\frac{y_i}{\lambda d}} \right|^2$$

$$K = 1/(\lambda d)^2$$

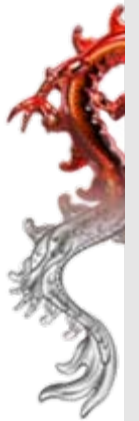
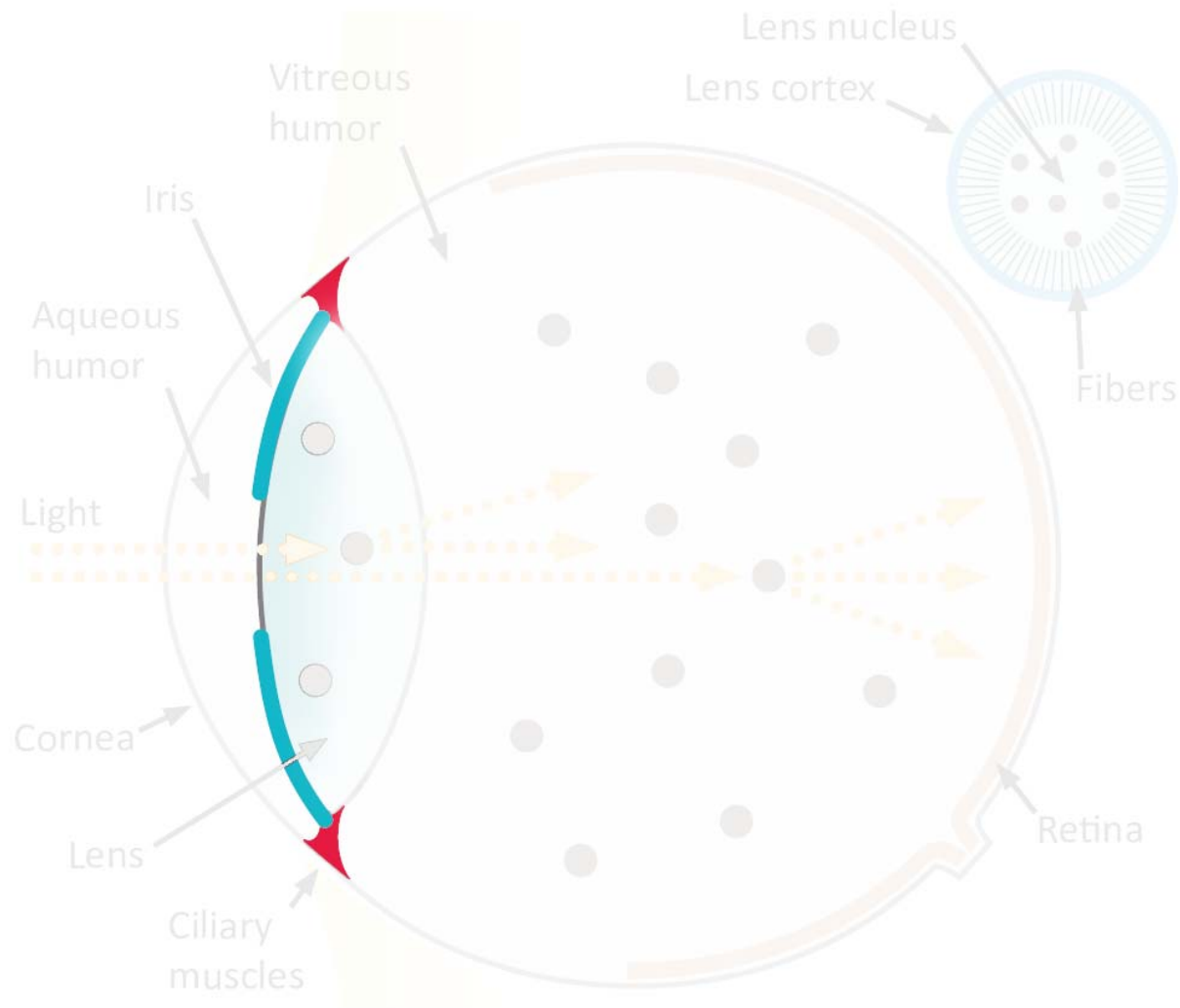
$$E(x_p, y_p) = e^{i\frac{\pi}{\lambda d}(x_p^2 + y_p^2)}$$



# Temporal Glare Pipeline

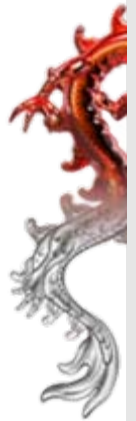
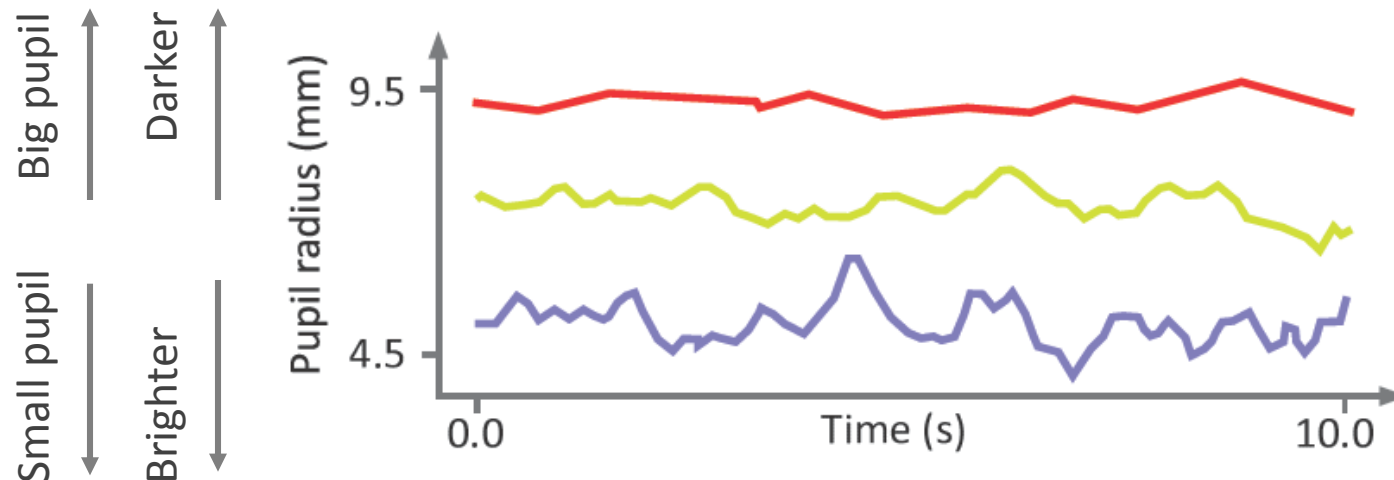


# Aperture: Pupil





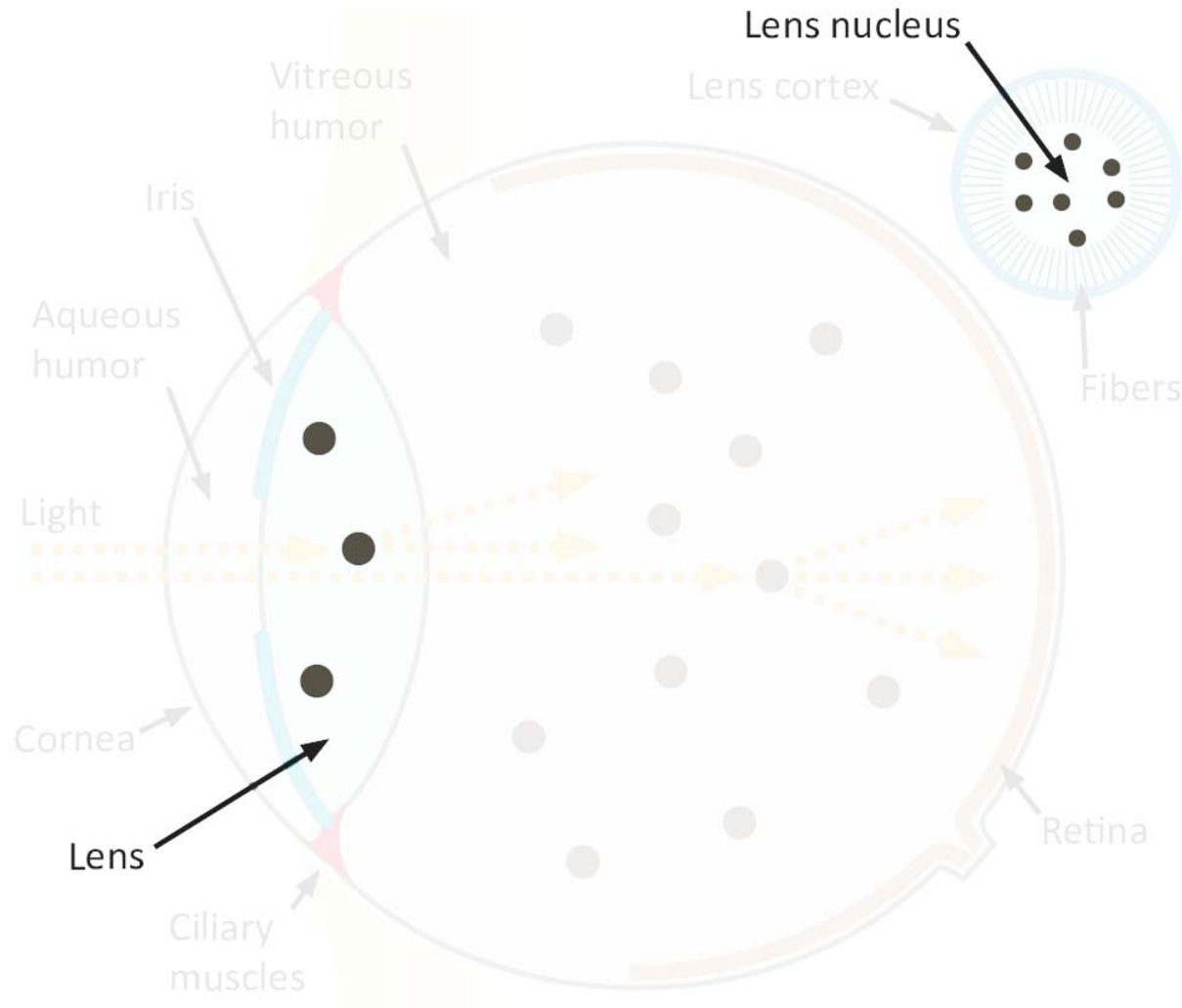
- **Adaptation**
- Can convert HDR image into pupil size
- Pupillary hippus:  
Strong contrast between glare source and background
- Stronger for smaller pupils, i.e. bright conditions



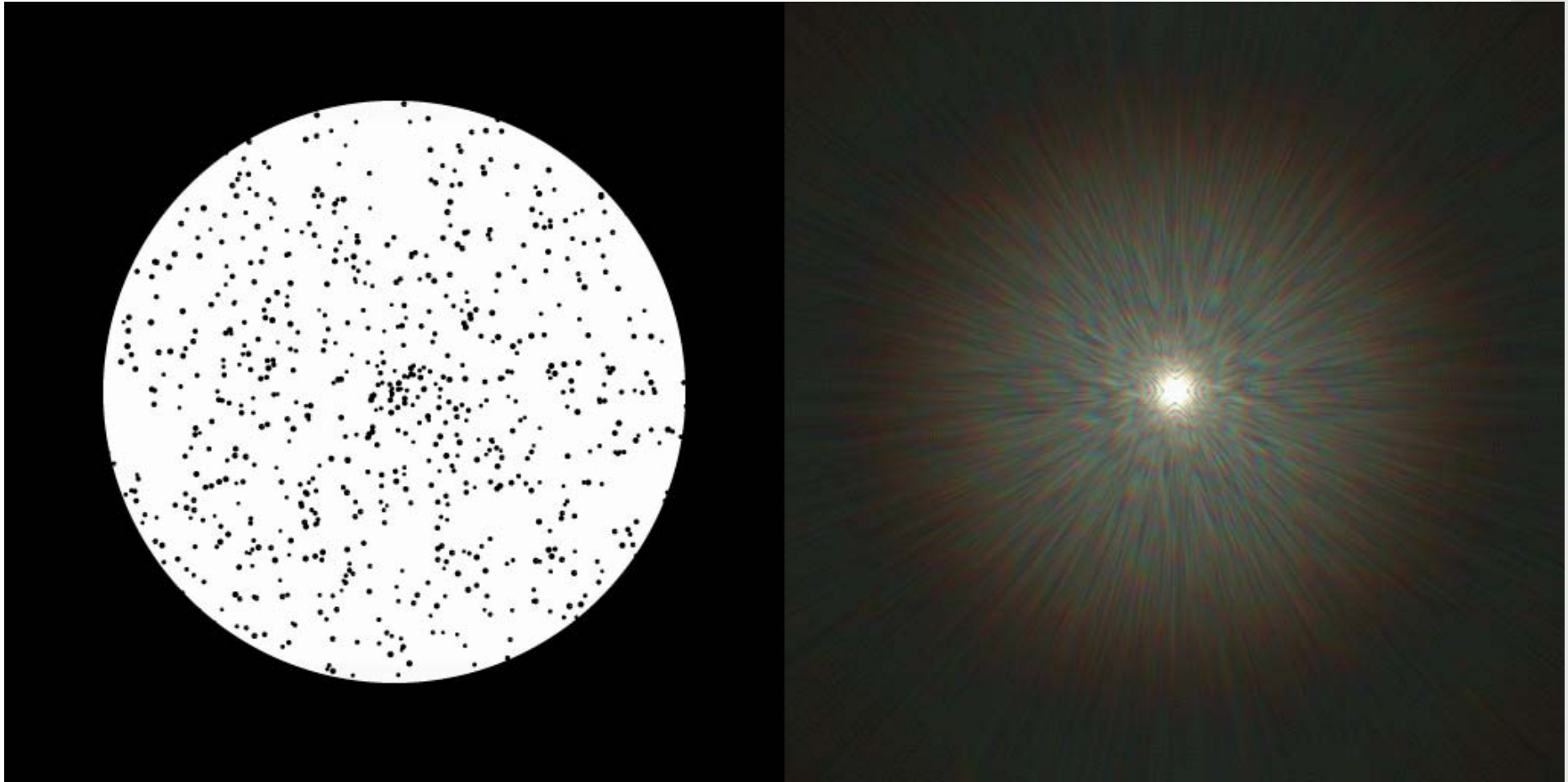
# Aperture: Pupil



# Aperture: Lens

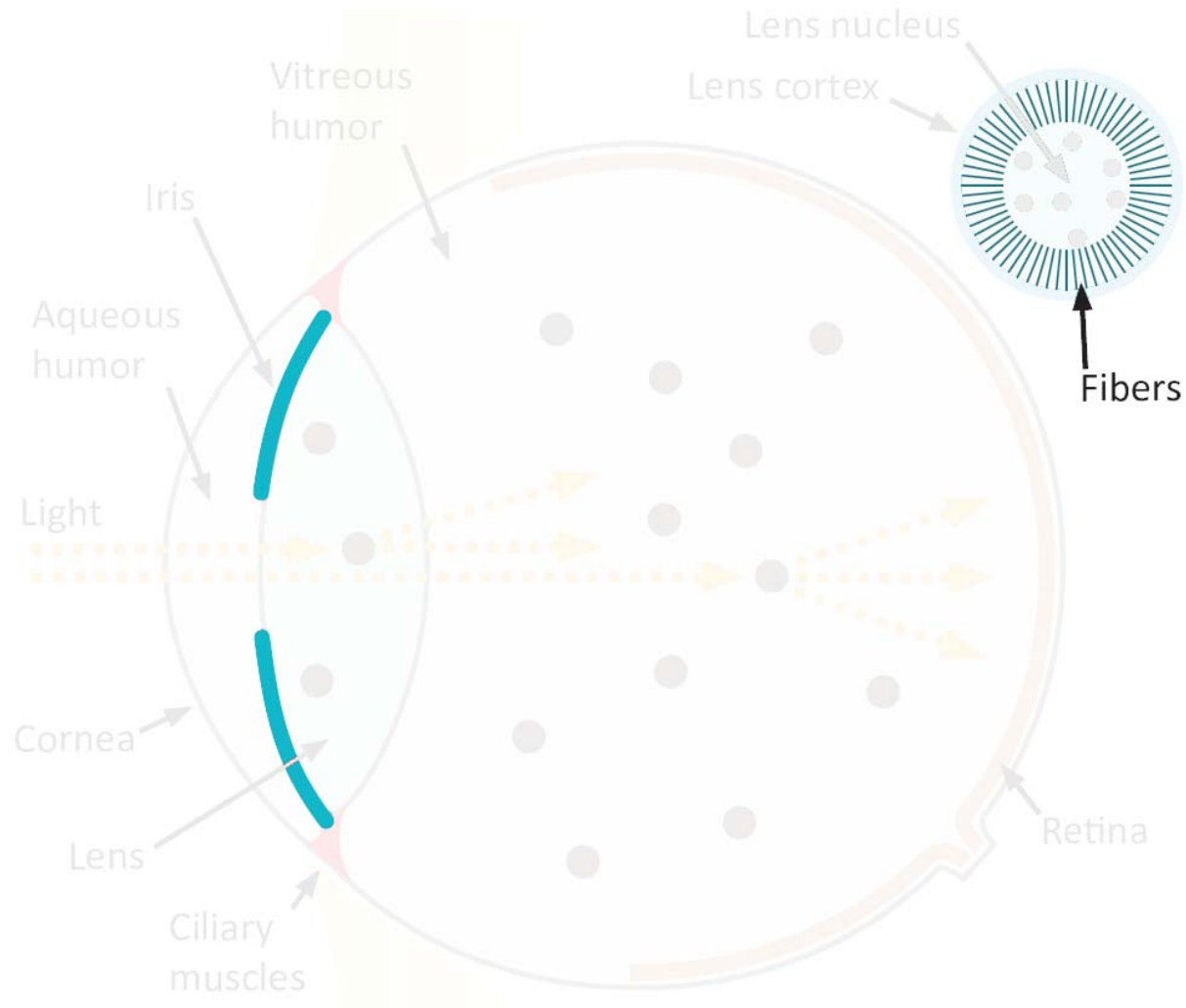


# Aperture: Lens

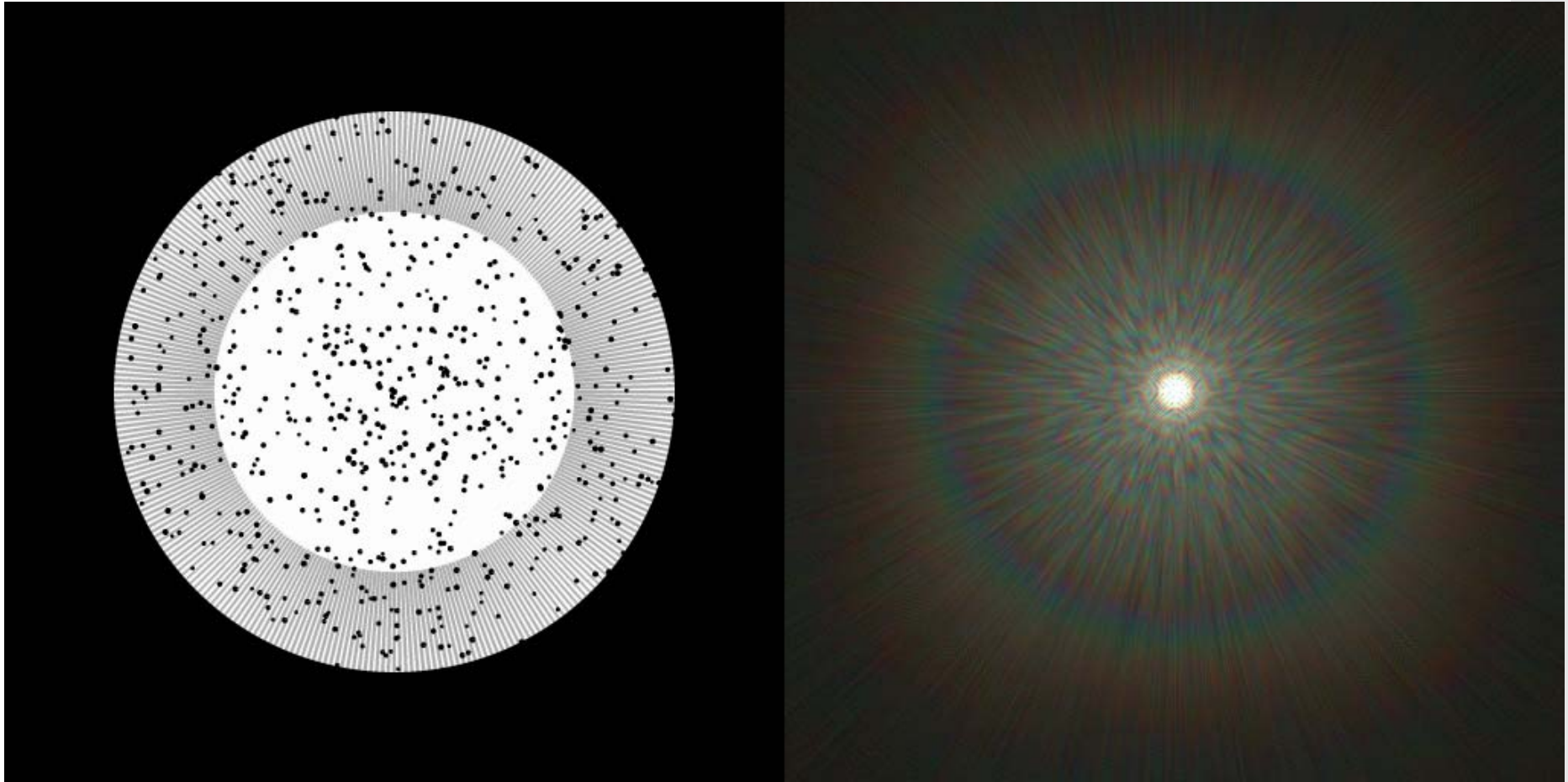




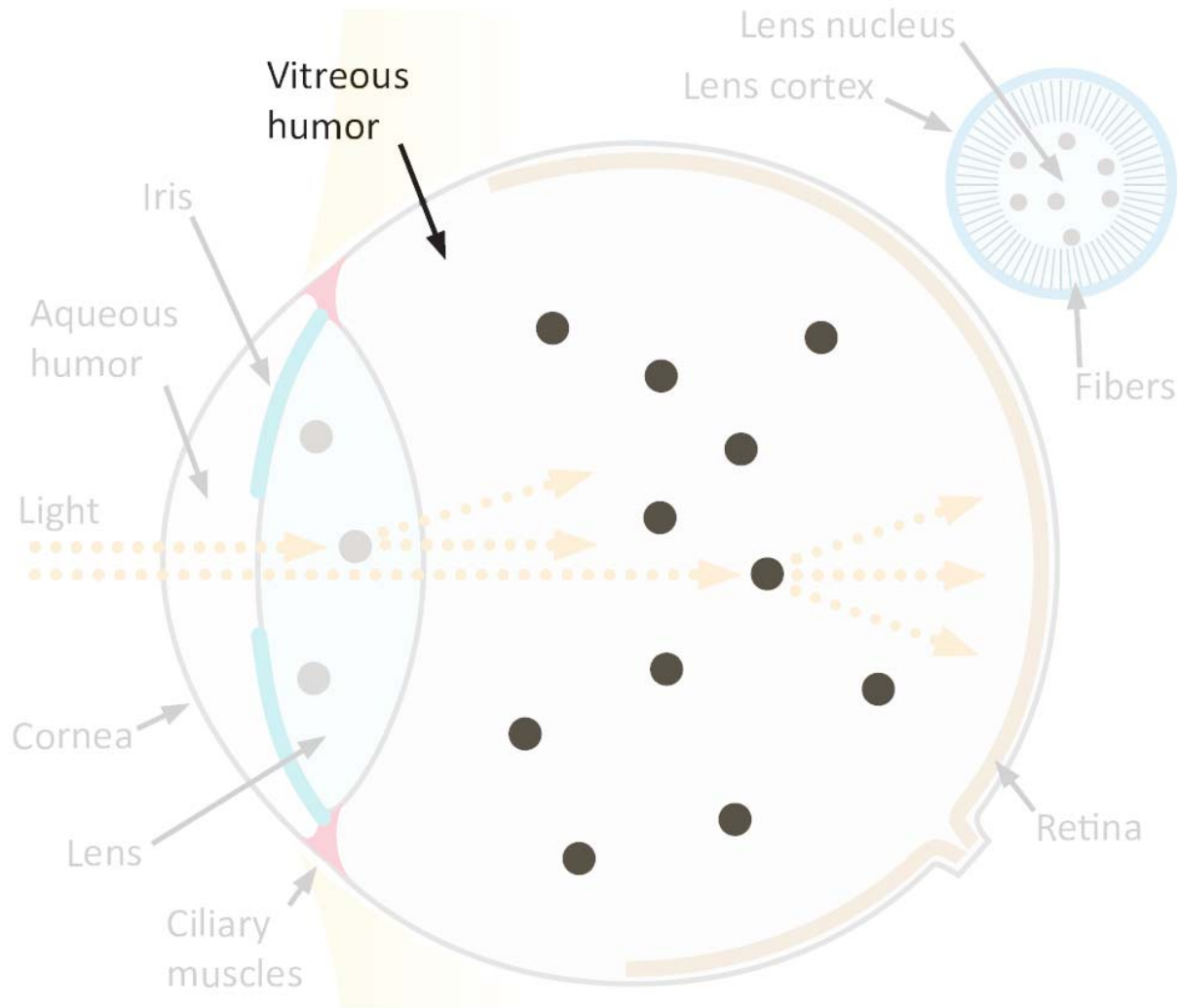
# Aperture: Gratings / Lens fibers



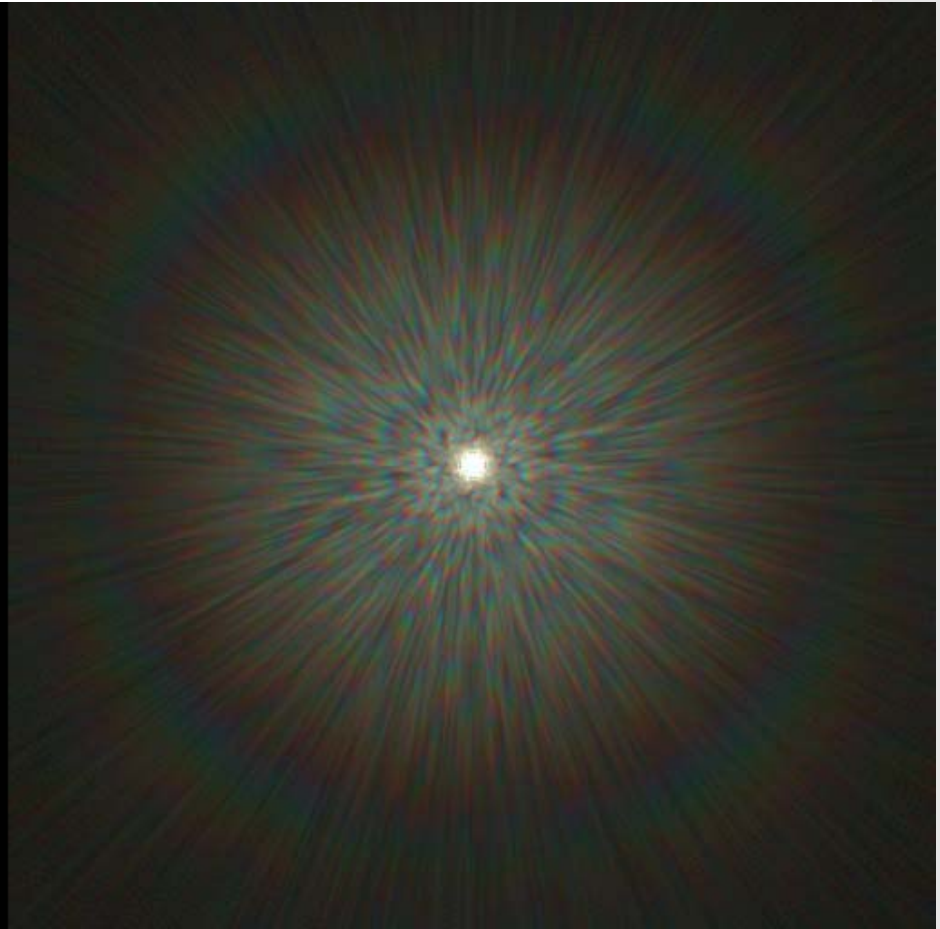
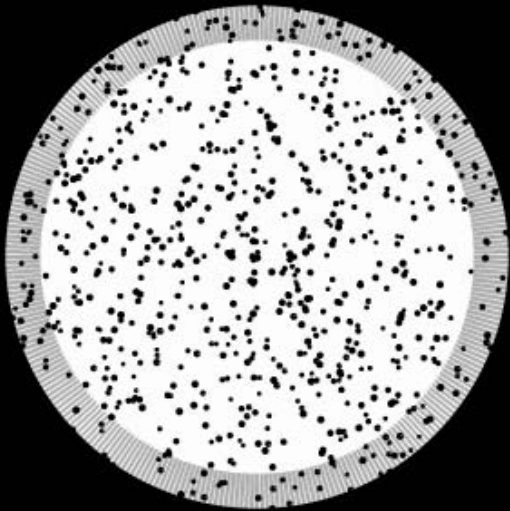
# Aperture: Gratings / Lens fibers



# Aperture: Vitreous Humor

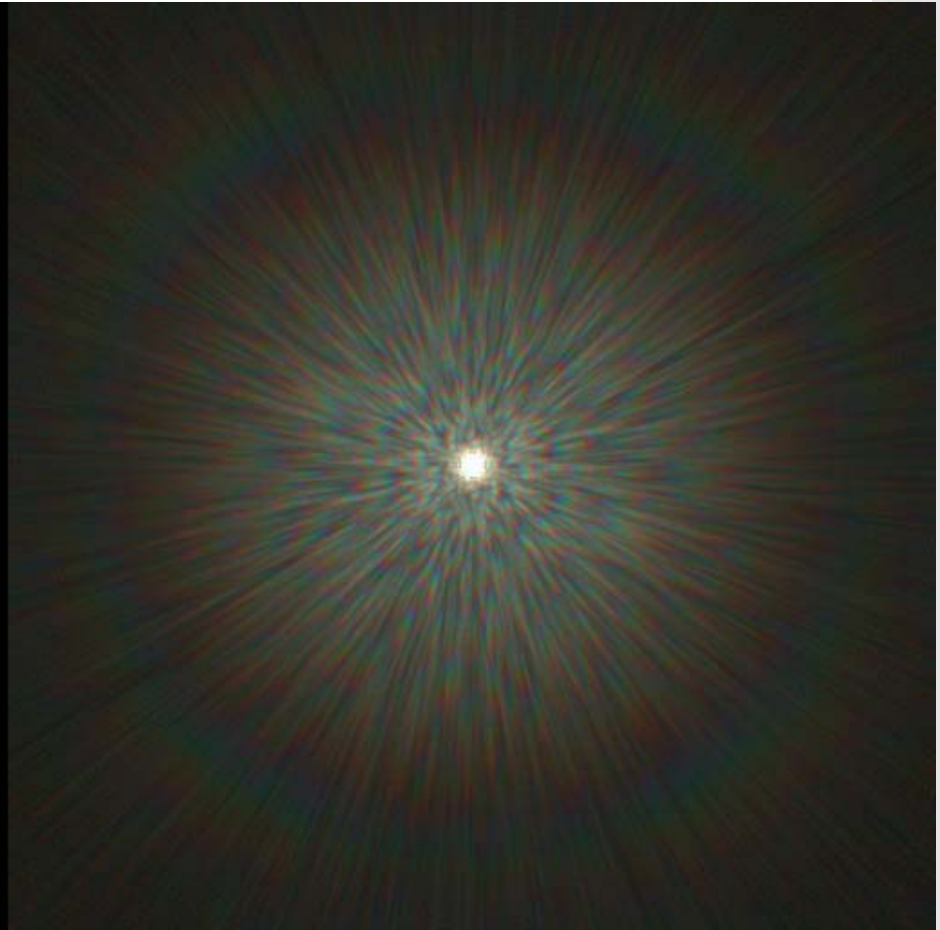
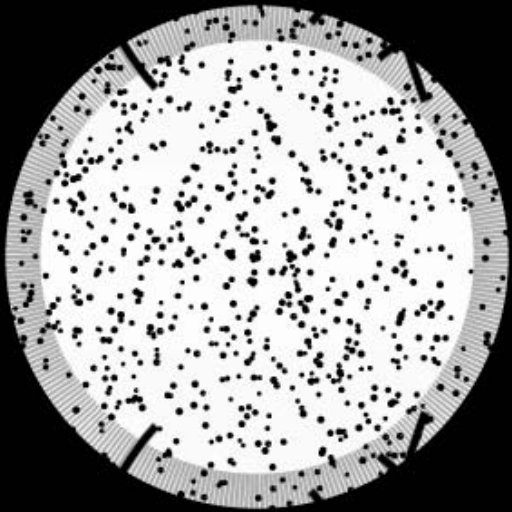


# Aperture: Vitreous Humor

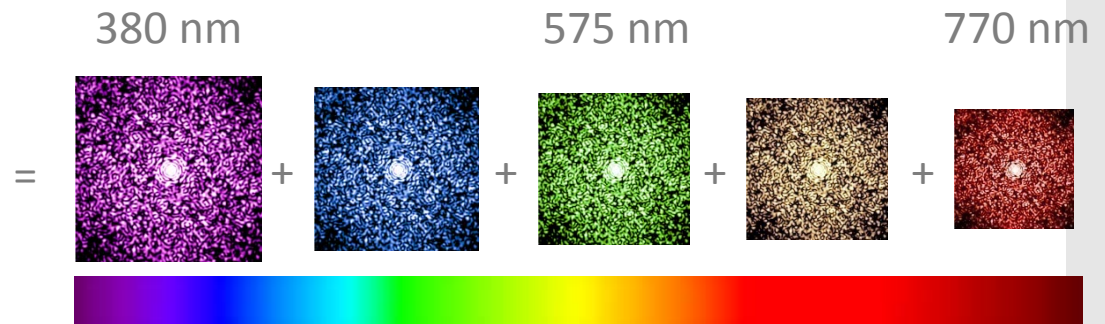




# Aperture: Eyelashes (*optional*)



- Compute one wavelength - Get others for free!
- They are scaled copy of base wavelength, i.e. 575 nm (approximation)



$$F_s(\mathbf{x}) = \sum_{i=0}^{n-1} s(\lambda_i) F_{575\text{nm}}(\mathbf{x}_i)$$

$$\lambda_i = 380\text{nm} + i \frac{770\text{nm} - 380\text{nm}}{n}$$

$$\mathbf{x}_i = \mathbf{x} \frac{575\text{nm}}{\lambda_i} .$$



# Convolution

HDR image

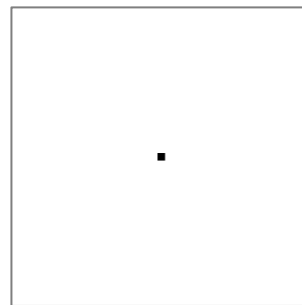
PSF

Bright pixels

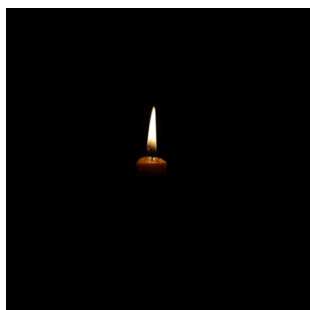
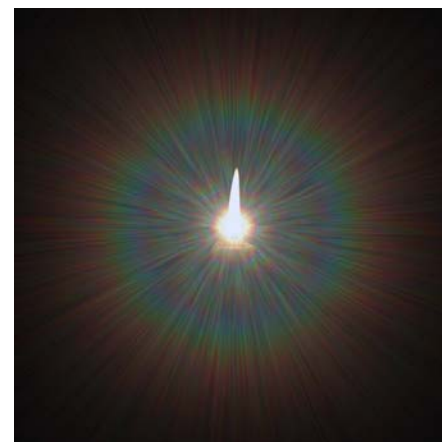
Billboard



+



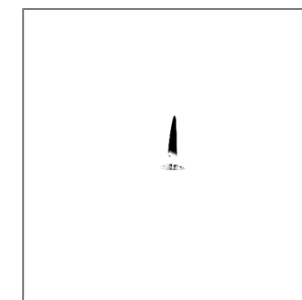
=



•



=



Convolution





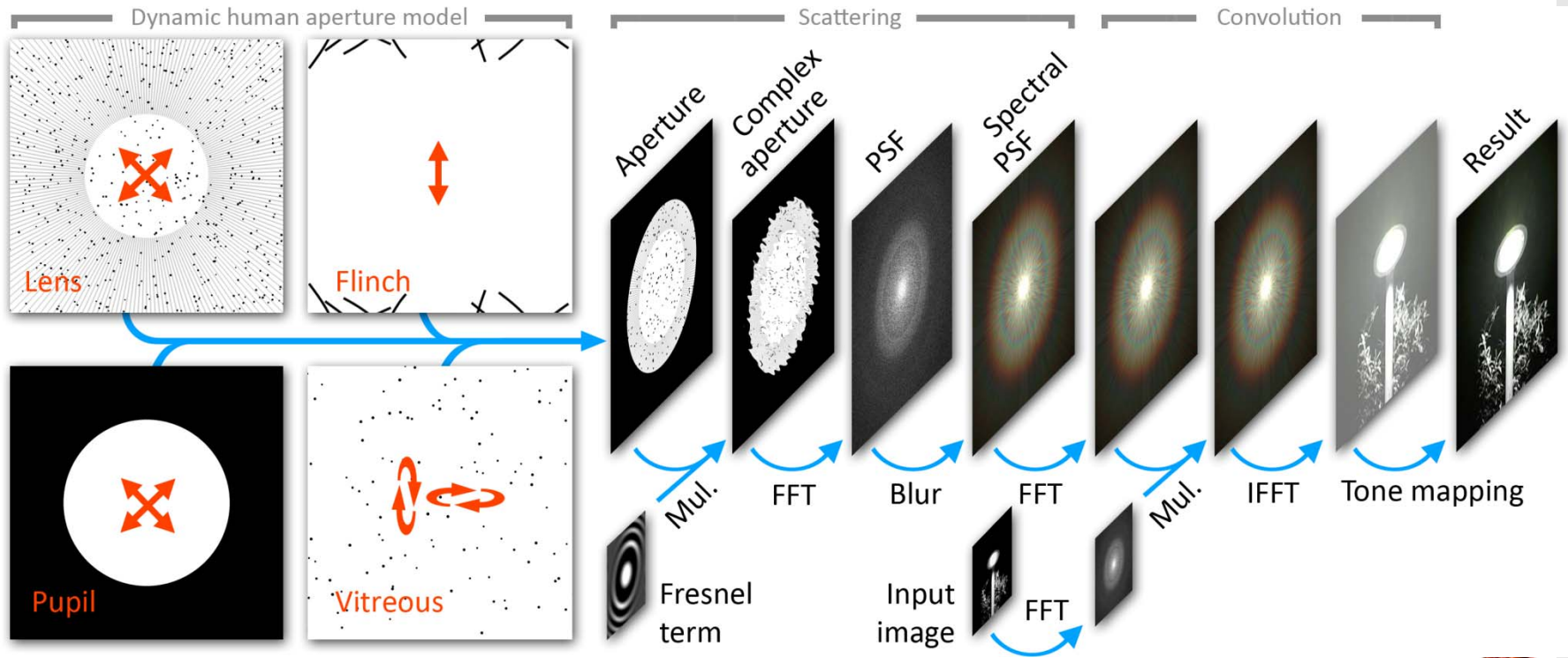
Convolution

Billboard

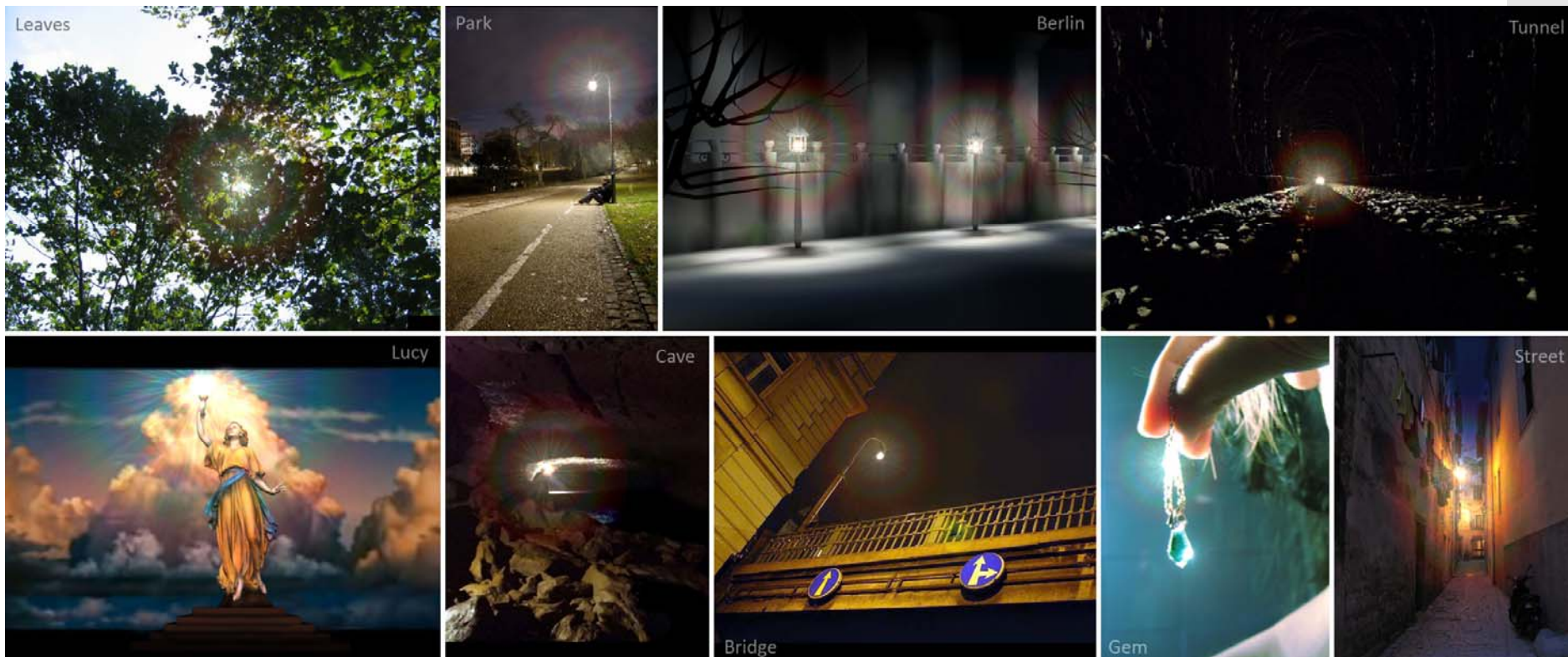




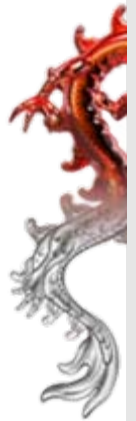
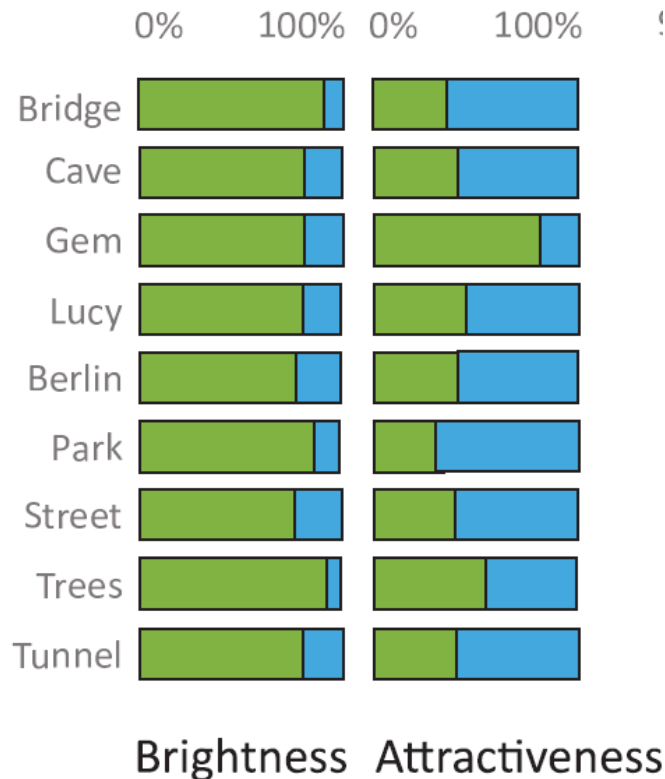
# Temporal Glare Pipeline



1. Two-alternative-forced-choice (bright, attractive, real)  
10 subjects
2. Method of adjustment  
4 subjects



1. Two-alternative-forced-choice (bright, attractive)  
10 subjects
2. Method of adjustment: dynamic glare ~5% brighter  
4 subjects









- Glare illusion might boost apparent brightness up to 30%
- Comprehensible model of light scattering in the eye taking into account dynamic eye elements
- Real-time rendering
- Model might miss important parts
- Model might contain unimportant parts
  - No differential study
- Other temporal low-level eye physics like
  - Floaters
  - Local adaptation (“After images”)

<http://www.mpi-inf.mpg.de/resources/hdr/TemporalGlare/>



# Acknowledgements

- I would like to thank Grzegorz Krawczyk, Tobias Ritschel, Kaleigh Smith, Akiko Yoshida, and Matthias Ihrke for help in preparing slides.

