# Contours and Contrast

Kaleigh Smith

#### Contours and Contrast

Not news: actual contrast creates a contour.



News: contour creates apparent contrast.

-- Floyd Ratliff (1919-1999), Contour and Contrast, 1970

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#### **Contrast Depiction**

If we could but paint with the hand what we see with the eye. -- Honore de Balzac (1799-1850)

**Contrast Depiction** The visual communication of all the important contrasts making up a real or synthetic scene. The challenge is to create an image that overcomes the constraints imposed by the depiction medium.



Le Noeud Noir, Georges Seurat 1882



Contours removed, contrast reduced

#### Contribution I

#### **Beyond Tone Mapping** Enhanced Depiction of Tone Mapped HDR Images



#### Contribution II

#### Apparent Greyscale A Simple and Fast Conversion to Perceptually Accurate Images and Video



#### Contribution III

#### **3D Unsharp Masking** for Scene Coherent Enhancement





Problem	Tone Mapping	<b>Greyscale Conversion</b>	<b>3D Rendering</b>
Goal	Restore lost contrast	Preserve chromatic contrast	Enhance scene contrast
Input ↓	HDR/LDR image pair	Colour image/video	3D scene
Output	LDR image	Greyscale image/video	Rendered image/video

## Enhancing Contrast Depiction

**Unsharp Masking** Local contrast enhancement technique, unsharp masking, can overcome these constraints by adding high-frequency contours to an image, increasing apparent contrast.

Image Enhancement via Adaptive Unsharp Masking. Polesel et al. 2000



#### Cornsweet Contour

A contour whose luminance profile of sharp opposing peaks gradually returns to the same luminance, or to luminances of lesser contrast.





#### First Principle

Adding a Cornsweet contour can increase **apparent contrast** beyond the physical contrast in complex images.



## Second Principle

**Unsharp masking** is capable of introducing Cornsweet contours, and the perceptual effect of unsharp masking can be explained by the Cornsweet illusion.



#### **Basic Unsharp Masking**



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 Difference of Gaussians approximates the Laplacian (second derivative). The contrast signal is measured by change in change in intensity (direction and magnitude).

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$$U(I)_{LUV} = \begin{bmatrix} L^* & , u^* + \lambda_{u^*}C(Y, y), v^* + \lambda_{v^*}C(Y, y) \end{bmatrix}$$

$$U(G)_{LAB} = \begin{bmatrix} G_{L^*} + \lambda C(L^*), & a^* & , & b^* \end{bmatrix}$$
Converted Greyscale Lightness Strength from Chromatic Difference



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# Beyond Tone Mapping

Restoring Apparent Contrast to Tone Mapped Images

# High Dynamic Range Images

- HDR images capture full range of luminance present in real world scenes.
  - details in both dark and light regions
  - precise luminance information



Viewing different ranges of values within an HDR image

# Tone Mapping

- For display, need to create LDR depictions of HDR images (loss of contrast information).
- Tone mapping operators map from HDR to LDR
  - Global Operators: loyal reproduction of luminance range
  - Local Operators: preservation of details



Photoreceptor Operator



**Bilateral Filtering** 



Gradient Domain Compression

## Purpose

- Enhance low dynamic range (LDR) images resulting from tone mapped high dynamic range (HDR) images:
  - Restore perceived dynamic range (depth)
  - Restore visibility of details (texture, contours)





Enhanced LDR by Chromatic Unsharp Masking

#### Unsharp Masking the Chromatic Channels

 $U(I)_{LUV} = [ L^* , u^* + \lambda_{u^*}C(Y, y), v^* + \lambda_{v^*}C(Y, y) ]$ 

• Use Difference of Gaussians (DoG) to determine contrast signals. This approximates the second derivative (Laplacian).

$$C(Y) = \log_{10} Y - \log_{10} Y_{\sigma}$$

Contrast of HDR Luminance

$$C(y) = \log_{10} y - \log_{10} y_{\sigma}$$

Contrast of LDR Luminance

- Compare C(Y) and C(y) to find magnitude of restoration.
- Need polarity of chromaticity. Make colourful side more so.

#### Unsharp Masking the Chromatic Channels

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Contrast of HDR Luminance

$$C(y) = \log_{10} y - \log_{10} y_{\sigma}$$

Contrast of LDR Luminance

$$C(Y, y) = sign(C^*-C^*\sigma) | C(Y) - C(y)|$$
Contrast of HDR Chroma Difference of HDR and LDR Contrast

#### Two-scale: Detail and Base Levels



Luminance



Base Layer Luminance (Bilaterally Filtered)



Details Contrast Signal



Base Contrast Signal

#### Results





Original LDR



**Beyond Tone Mapping** 

#### Results





Original LDR

Beyond Tone Mapping







Original LDR

Beyond Tone Mapping



Original LDR

#### Wish List

- Compare the HDR and LDR luminance contrasts in justnoticeable-differences (JND).
- Also, relate the lost contrast and restored colour contrasts in JND.
- Expand to multi-scale for more control over restoration.
- Measure perceived colour changes due to tone mapping and try to restore them as well.

# Apparent Greyscale

Greyscale Conversion of Images and Video

# Challenges to greyscale mapping

- Map chromatic to achromatic (3D to ID): reduce information to a single channel.
- Maintain Discriminability: in mapping, apparent colour differences may be reduced or even lost.



# Appearance is more than discriminability

Our algorithm creates a perceptually accurate version of the colour original by preserving:

- **Range**: original values' range and average luminance
- Apparent Order: colours ordered according to their appearance using apparent brightness.
- Discriminability: local contrasts neither lost nor exaggerated
- Image Features: local details unchanged

# Step I: Global Mapping to Lightness

- A colour's appearance depends mostly on its luminance.
- But, it also depends on its hue, saturation / chromaticity, known colour effects, surround, environment, etc...







Chromatic Lightness

# Lightness Models of Colour Appearance

- Lightness is the perceived brightness of object compared to a similarly illuminated white.
- Achromatic perceptual response to colour.





• From colour theory, several lightness models, such as:



#### The Helmholtz-Kohlrausch Effect

• For greyscale conversion, an important issue in colour appearance is the Helmholtz-Kohlrausch effect:

# Given two iso-luminant colours, the more colourful appears brighter.



# Lightness Models With H-K Effect



By accounting for this effect, the lightness of nearly isoluminant colours has greater variation.
# Step I: Global Mapping to Lightness

- The L\*N (or L\*NVAC) chromatic lightness metric is defined in CIELUV colour space.
- Adds a H-K effect corrective term to L\* lightness.



Simple estimation methods for the Helmholtz-Kohlrausch effect. [Nayatani et al., Color Res. Appl., 1997]

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• Global Mapping:  $I_{RGB} \rightarrow I_{LUV} \rightarrow I_{L_{N}} \rightarrow G$ 

# Lost Discriminability

 The global mapping solves the problems of perceptually correct colour ordering, matching dynamic range, detail preservation - however, **discriminability** may be inadequate.



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 In CIE LAB, construct Laplacian pyramids for the original and greyscale images.



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Use chromatic contrast to weight strength of grey image contrast signal.

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Greyscale Contrast

### Where Contrast Is Gained















Chromatic Enhancement of G

# Multiscale Strengths

- **Parameters k**<sub>i</sub> **at each bandpass level** controls the strength of the enhancement, and thus the resulting discriminability.
- User choice made depending on intended display conditions.





 $k = \{0.1, 0.1, 0.1, 0.1\}$ 

### Enhancement of Weak Contrasts

• **Parameter p** remaps the gain so weaker contrasts can be emphasized without exaggerating stronger contrasts.

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

 Setting p depends on the range of contrast strengths in the original image.





# **Discriminating Isoluminant Colours**



Original



Luminance Y



Apparent Greyscale

- 'lso-light' colours are possible, but
  - are perceptually very similar colours
  - differ only by hue, not chromaticity

### Accurate Colour Appearance



# Consistent Colour Ordering

Colour Originals Ordered by Increasing Brightness



Apparent Greyscale

### **Impression Sunrise**





Original

Gimp Greyscale

# Impression Sunrise



Original



Apparent Greyscale

# Video to Greyscale

- Very fast algorithm, no optimizations required.
- First perceptually accurate method suitable for video.



### Perceptual Evaluation by Cadik et al.



# Conclusions & Wish List

- This paper shows that a simple approach can work best.
- It is fast and simple: the runtime depends on the Laplacian pyramid construction and image resolution.
  - 1.8 and 6.7 seconds for single scale.
  - 3.2 and 10.8 seconds for 4 pyramid levels.
  - Humming bird video took 0.96 seconds per frame.

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  - 1.8 and 6.7 seconds for single scale.
  - 3.2 and 10.8 seconds for 4 pyramid levels.
  - Humming bird video took 0.96 seconds per frame.
- More sophisticated colour appearance prediction.
- Treat temporal coherence of local enhancement.
- Automatically control over-shot enhancements.

Scene Coherent Enhanced 3D Rendering

# Related Work

Normals Enhancement Cignoni et al. C&G 2005



Exaggerated Shading Rusinkiewicz et al. SIGGRAPH 2006



Unsharp Masking the Depth Buffer Luft et al. SIGGRAPH 2006





Rendering of<br/>Lit SurfacesRendering of<br/>Smoothly Lit SurfacesContrast Signal<br/>(Cornsweet Contours)Enhanced Rendering







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# **Complex Geometry**



#### **Basic Rendering**

**3D** Unsharp Masking

# **3D** Cornsweet Illusion

The effect of a Cornsweet contour is much stronger when it is enforced by 3D cues.



Dale Purves et al., 1999

# **3D** Cornsweet Illusion

The effect of a Cornsweet contour is much stronger when it is enforced by 3D cues.



Dale Purves et al., 1999

### Creating the 3D Cornsweet Illusion



### Video Results



### Video Results



### Perceived Effect

- Users prefer scenes enhanced by twice the just noticeable difference.
- Users tolerate up to four times just noticeable difference.
- Smoothing parameter  $\sigma$  has only a small effect.



# Conclusions and Wish List

- Enhances all lighting gradients holistically.
- Improves over existing approaches, is more flexible and robust.
- Investigate temporal coherence of 3D unsharp masking of defoming meshes with topology changes.
- Extend to multi-scale allowing smoothing parameter to adapt over the scene.
### Final Conclusions

- Depiction of contrast despite constraints.
- Champions the use of perceptual models and visual effects in computer graphics algorithms.
- Foundations in the human visual system and perception results in algorithms that create more effective imagery.



Beyond Tone Mapping



Apparent Greyscale



3D Unsharp Masking

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### Additional Slides (To Answer Anticipated Questions)

## Difference of Gaussians (DoG)

- Center-Surround cellular processing.
- Approximates 2nd derivative, Laplacian.



### Restore Contrast with Colours

- Restore the lost luminance contrast by introducing colour contrasts.
- Create enhanced images with more loyal luminance range or details visibility.
  - Colours don't interfere with user-chosen luminance.
  - Colours create strong effects.
  - Colours integral to art and effective techniques known.



Increases Global Contrast Appearance



Increases Details Salience

# Recent Greyscale Methods

Techniques to maintain discriminability use optimization, poisson solution, custom colour spaces.

- Color2Gray: salience-preserving color removal [Gooch et al., Siggraph 2005]
- Recoloring images for gamuts of lower dimension [Rasche et al., Eurographics 2005]
- Fast, contrast enhancing, color to grayscale conversion
  [Grundland et al., Pattern Recogn. 2007]
- An efficent perception-based adaptive color to gray transformation [Neumann et al., Comp. Aesthetics 2007]





## Recent Greyscale Methods

- Color-to-grayscale conversion to maintain discriminibility [Bala et al., SPIE 2004]
- Spatial color-to-grayscale transformation preserving chrominance edge information
  [Bala et al., Color Imaging Conference 2004]



### Impression Sunrise





Original











#### **Impression Sunrise**



Original

Neumann et al.

### The Helmholtz-Kohlrausch Effect

"A chromatic stimulus with the same luminance as a white reference stimulus will appear brighter than the reference." - Y. Nayatani

Two experimental approaches for measuring this effect:

- VCC (variable-chromatic-colour) subjects adjust a colour's chromaticity until its brightness matches a grey stimulus.
- VAC (variable-achromatic-colour) subjects match grey values to given colour stimulus.

## Adaptive Gain Factor

- Measures the chromatic contrast to be restored.
- Ratio of original and greyscale contrast measured in CIELAB  $\Delta$ E perceptual colour differences.

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

- *hi(l)* is contrast because it is the difference between a pixel and its neighbourhood.
- $\Delta E(hi(I))$  is the Euclidean distance in LAB.
- $|h_i(G_{L^*})| \sim \Delta E(h_i(G))$  because the chromatic channels of G contain no contrast information.

### Limitations of Our Work

• Chromatic contrast adjustment is local: it cannot enhance contrast between non-adjacent regions.



 Local enhancement is done frame-by-frame - may produce temporal incoherence; but in the examples we tried, this is not a problem [see video results].

## Apparent Greyscale Plug-In



#### Effect of Smoothness Parameter $\boldsymbol{\sigma}$



### 2D Buffer Unsharp vs. 3D Unsharp



Depth Buffer Unsharp



Shadow Buffer Unsharp



#### Comparison 2D to 3D



O - spurious occlusion enhancements D - distant objects affect eachother P - adapt to perspective 88

## **3D Unsharp Timing Numbers**

	Scene	Lighting	FPS			Vertices	σ	Time		Supersampling	
			Total	W/Out	Extra			Light	Smooth	Surface	Framebuffer
	Feet	Natural	10.2	15.2	33 %	57 k	5	26.5	3.7	no	none
	Dice	Point	15.6	63.0	75 %	74 k	1	1.7	4.9	yes	$2 \times 2$
	Keys	Point	15.2	63.0	76%	152 k	20	5.1	34.0	no	$2 \times 2$
TUK-	Columns	Point, AO	28.3	63.2	55%	119 k	2	7.5	2.5	no	$2 \times 2$
	Chamfer	Natural	8.3	10.7	22 %	39 k	2	20.0	10.1	no	none
	Golfball	Natural	17.9	31.3	43 %	127 k	8	14.3	10.3	no	none
	Cross	Natural	10 <b>.9</b>	12.4	16 %	8 k	10	7.2	4.7	no	none
	Lucy	Natural	9.5	37.5	75%	262 k	40	16.3	62.2	no	none

#### Mesh Dependence

