# Taking CIE Out of the Lab

#### An Adaptive Color Difference Model

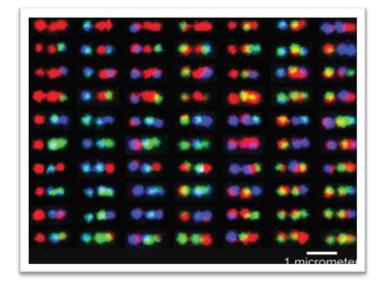
Danielle Albers and Michael Gleicher University of Wisconsin-Madison Department of Computer Sciences SIGGRAPH Submission 2013



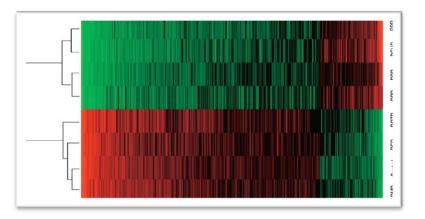












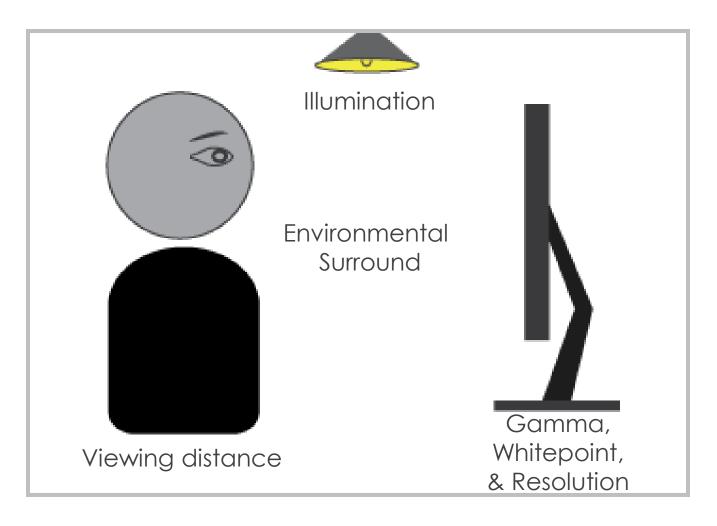








Apparent color depends on viewing conditions.



Make informed decisions about color that hold across a variety of viewing conditions.

### Our Target Model Is:

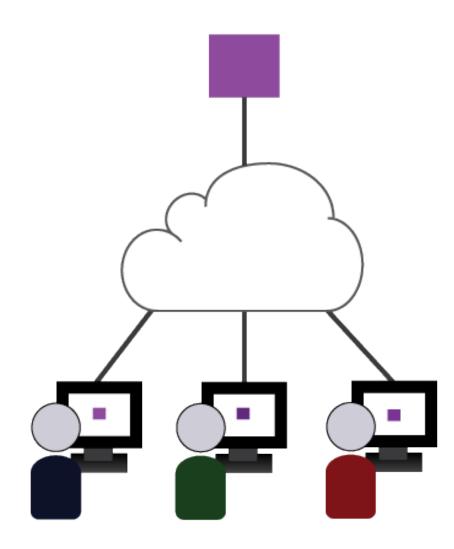
**Parametric** – Tuned to a range of viewers

**Data-Driven** – Adaptable to specific conditions

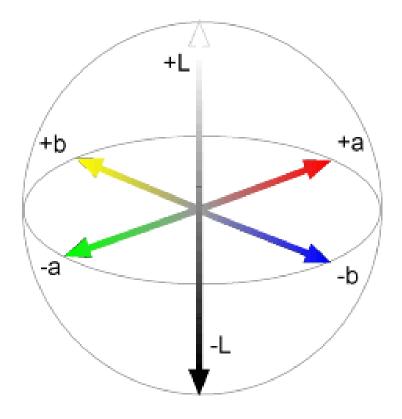
**Practical** – Straight-forward to use and generate

Probabilistic - Accounts for uncertainty in the data

### Model Problem – Web Viewing



# Theoretical CIELab Color Space

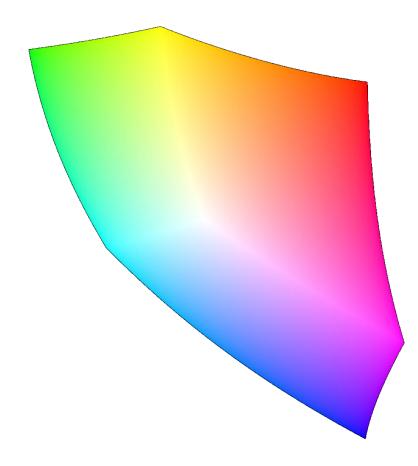


Perceptually-based color difference space

Approximately perceptual uniform

1 JND = 1 unit Euclidean distance

# Practical CIELab Color Space



Bound by monitor gamut and whitepoint

Over-extended along yellow-blue

1 JND = ~2.3 units Euclidean distance

#### CIELab Difference Model

$$\Delta C = \sqrt{(L_1 - L_2)^2 + (a_1 - a_2)^2 + (b_1 - b_2)^2}$$

$$C_1 = (L_1, a_1, b_1)$$

$$C_2 = (L_2, a_2, b_2)$$

### Adapted CIELab Difference Model

$$\Delta C = \sqrt{\left(\frac{L_1 - L_2}{s_L}\right)^2 + \left(\frac{a_1 - a_2}{s_a}\right)^2 + \left(\frac{b_1 - b_2}{s_b}\right)^2}$$

$$C_1 = (L_1, a_1, b_1)$$

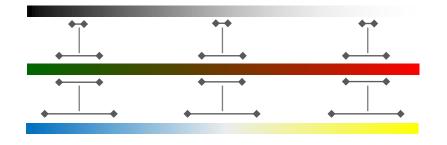
$$C_2 = (L_2, a_2, b_2)$$

 $\Delta C = 1$  is detectable for p% of viewers

 $S_{\chi} \in \mathbf{R}^1$ 

Do CIELab's theorhetical assertions about color hold across the target viewing conditions?

A1: Axes are perceptually orthogonal.



A2: Euclidean distance is an effective metric for perceptual distance.

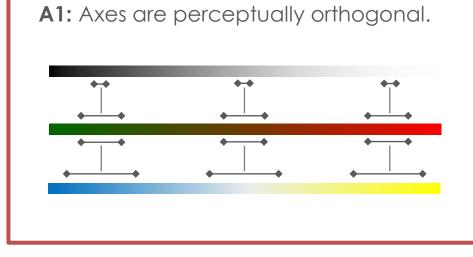
$$\Delta C = \sqrt{(L_1 - L_2)^2 + (a_1 - a_2)^2 + (b_1 - b_2)^2}$$

A3: Axes are perceptually uniform.



A4: Axes are scaled such that one unit corresponds to one JND.

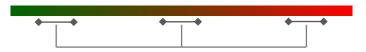




A2: Euclidean distance is an effective metric for perceptual distance.

$$\Delta C = \sqrt{(L_1 - L_2)^2 + (a_1 - a_2)^2 + (b_1 - b_2)^2}$$

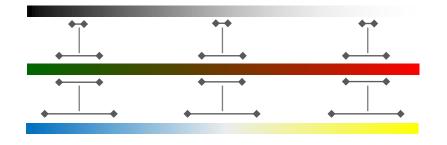
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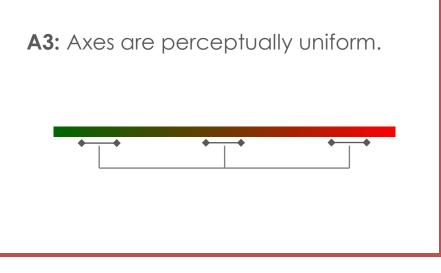


A1: Axes are perceptually orthogonal.



A2: Euclidean distance is an effective metric for perceptual distance.

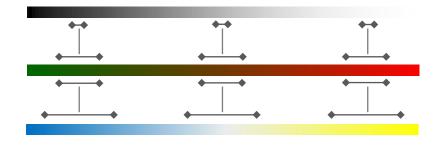
$$\Delta C = \sqrt{(L_1 - L_2)^2 + (a_1 - a_2)^2 + (b_1 - b_2)^2}$$



A4: Axes are scaled such that one unit corresponds to one JND.



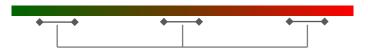
A1: Axes are perceptually orthogonal.

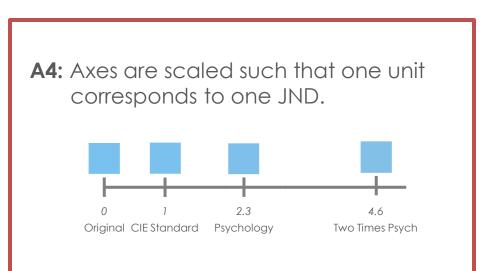


A2: Euclidean distance is an effective metric for perceptual distance.

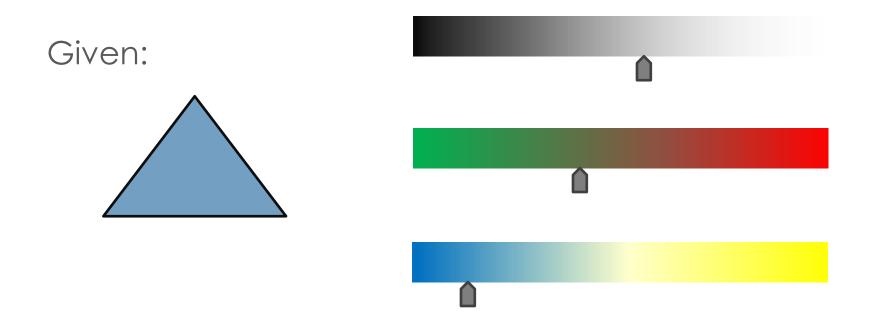
$$\Delta C = \sqrt{(L_1 - L_2)^2 + (a_1 - a_2)^2 + (b_1 - b_2)^2}$$

A3: Axes are perceptually uniform.





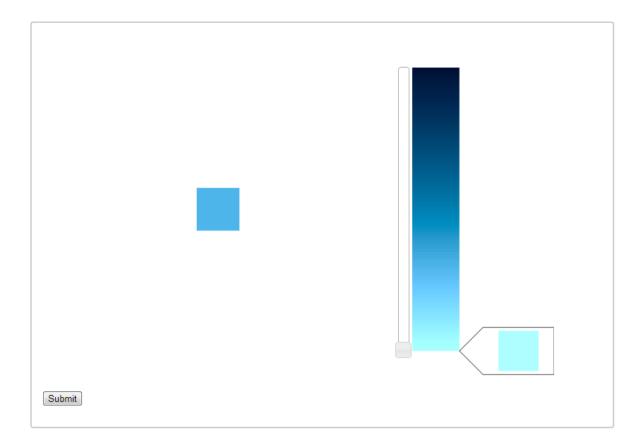
# Validating Color Space



#### Modern Maxwell Color Matching Experiment

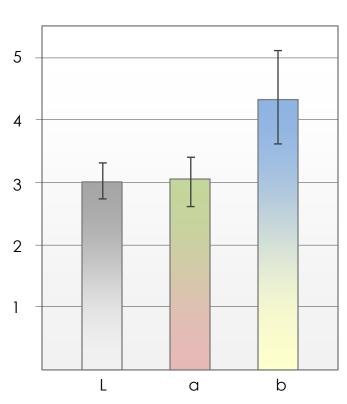
# Validating Color Space

Determine color error using a single-axis Maxwell task on Mechanical Turk.



### Validating Color Space – Web Viewing

**A4**:



Per-Axis Color Matching Error

A3:

Within Axis Color Matching Error

L Axis:

 $\mu = 3.025$ within: p = 0.2008, F = 1.6437insert gradient from both ends of the axis

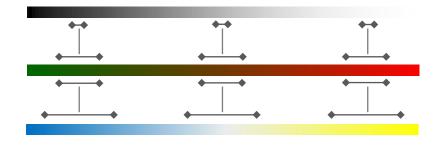
a Axis:

 $\mu = 3.44$ within: p = 0.5711, F = 0.3215

b Axis:

 $\mu = 4.327$ within: p = 0.5154, F = 0.4240

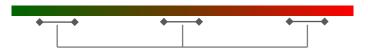
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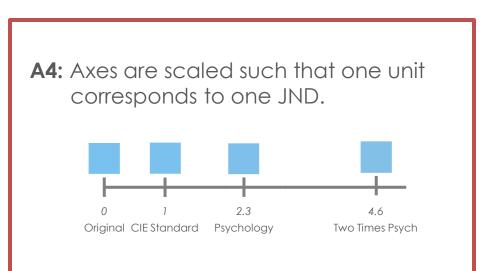


A2: Euclidean distance is an effective metric for perceptual distance.

$$\Delta C = \sqrt{(L_1 - L_2)^2 + (a_1 - a_2)^2 + (b_1 - b_2)^2}$$

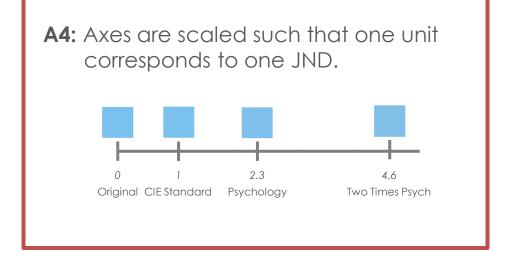
A3: Axes are perceptually uniform.





Parameters account for how different must two colors be to appear different across a variety of viewing conditions.

# Adapted CIELab Difference Model



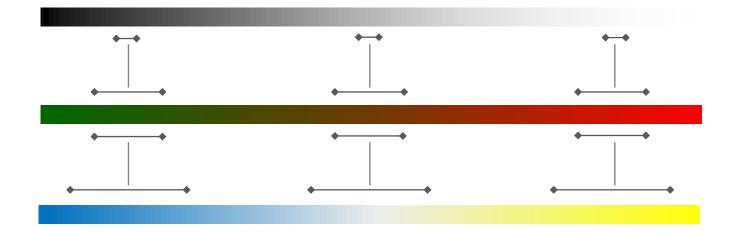
$$\Delta C = \sqrt{\left(\frac{L_1 - L_2}{s_L}\right)^2 + \left(\frac{a_1 - a_2}{s_a}\right)^2 + \left(\frac{b_1 - b_2}{s_b}\right)^2}$$

 $\Delta C = 1$  is detectable for p% of viewers

 $S_{\chi} \in \mathbf{R}^1$ 

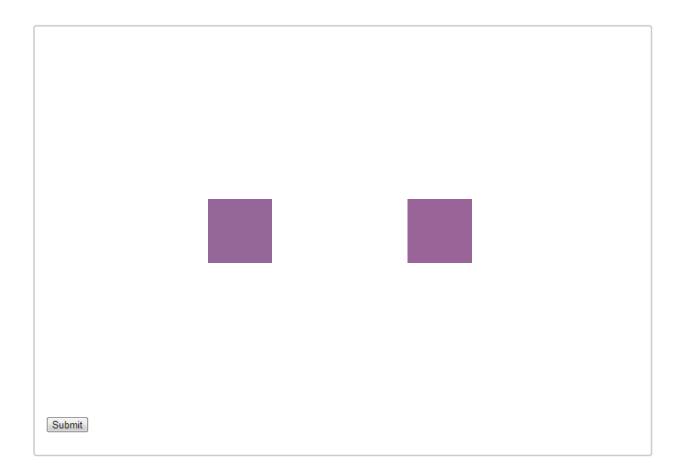
#### Adapting the Model

#### How do we scale each axis?



#### Adapting the Model

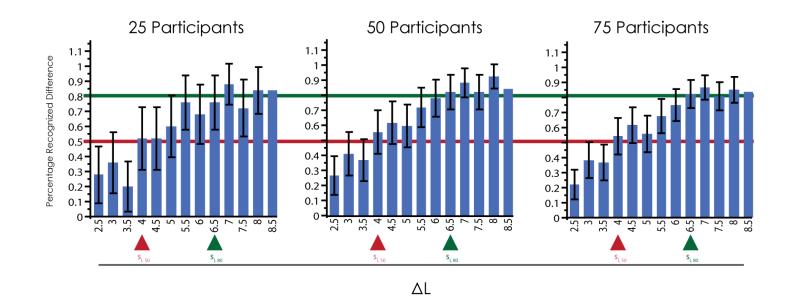
#### Do these two colors match?



#### Adapting the Model



- 1) Determine the **proportion of samples** where colors were accurately identified as different.
- 2) Fit a function to these proportions to identify the **discriminability distribution**.\*
- 3) Identify the point at which this function equals some **threshold p**.



50% of samples are discriminable:

 $s_L = 4.0$ 

$$s_a = 5.5$$

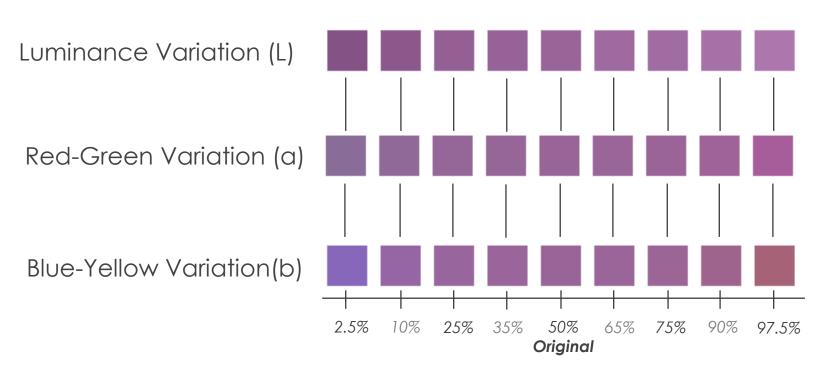
$$s_b = 6.0$$

80% of samples are discriminable:

 $s_L = 6.5$  $s_a = 8.5$  $s_b = 9.0$  Does our adapted color difference model work for web viewing conditions?

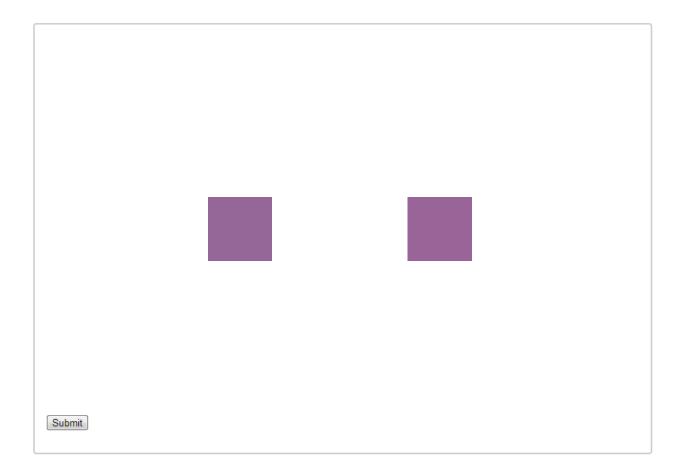
$$\Delta C = \sqrt{\left(\frac{L_1 - L_2}{4.0}\right)^2 + \left(\frac{a_1 - a_2}{5.5}\right)^2 + \left(\frac{b_1 - b_2}{6.0}\right)^2}$$

$$\Delta C = \sqrt{\left(\frac{L_1 - L_2}{6.5}\right)^2 + \left(\frac{a_1 - a_2}{8.5}\right)^2 + \left(\frac{b_1 - b_2}{9.0}\right)^2}$$



Unsigned Error Quantiles

Do these two colors match?

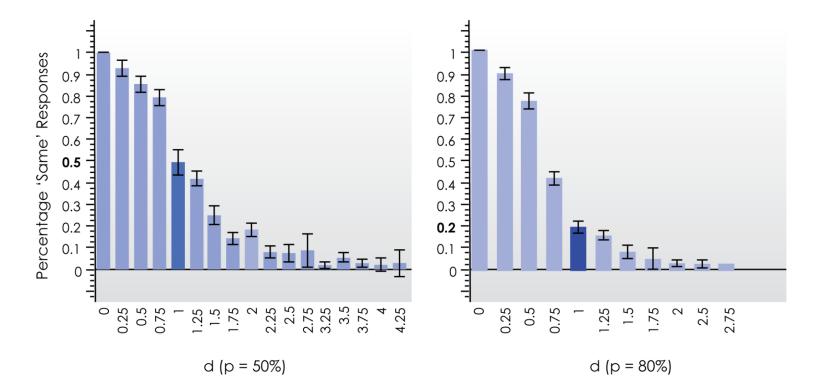


A4: Axes are scaled such that one unit corresponds to one JND.



**p%** of viewers will identify a difference at d = 1

Percentage Similarity for a Web-Adapted Color Difference Model at Multiple Parameter Scales



#### Contributions

Taking CIE out of the Lab

Model is **parametric**, **data driven**, **probabilistic**, and **practical** 

Validation color space for **web-viewed** color

#### Limitations

Data-driven implies data-based

Limited validation to date

# Thank you!

Danielle Albers (dalbers@cs.wisc.edu)



graphics.cs.wisc.edu

#### Where should we send this?