## 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

$$
\begin{aligned}
& \text { Compuriny of wisconsm, Marasion } \\
& \text { Computhics }
\end{aligned}
$$

## Motivation



|  | 4 | - | + | \% | ** |
| :---: | :---: | :---: | :---: | :---: | :---: |
| 1 $=$ | + 2 | Anat | 4 | \% 4 er | $\pm$ ¢ |
| -20 | $4=$ | 4 | *- | ** | * ${ }^{2}$ |
|  | $\pm$ * | ther | *-4 | 0 | - |
| 4** | $\cdots+8$ | $4 \times$ | $4 \times$ | - * | *-4 |
| $\bigcirc$ | 04 | N-8 | -20 | A-m | - |
| - \#* | 4* | Cols | +ar | Qrey | * 4 |
| - | + | cer | \% | -2 | 4* |
| $0 \times 8$ | 48 | Tas | 8 | $4-2$ | + ${ }_{\text {c }}$ |
| $0 \times$ | 4-3 | C8 | $4-3$ | 4 | -4 |
|  |  |  |  |  | 1 |



## Motivation



## Motivation



## Motivation

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
$1 \mathrm{JND}=1$ 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

$$
\Delta C=\sqrt{\left(L_{1}-L_{2}\right)^{2}+\left(a_{1}-a_{2}\right)^{2}+\left(b_{1}-b_{2}\right)^{2}}
$$

$$
\begin{aligned}
& C_{1}=\left(L_{1}, a_{1}, b_{1}\right) \\
& C_{2}=\left(L_{2}, a_{2}, b_{2}\right)
\end{aligned}
$$

## Adapted CIELab Difference Model

$$
\begin{gathered}
\Delta C=\sqrt{\left(\frac{L_{1}-L_{2}}{s_{L}}\right)^{2}+\left(\frac{a_{1}-a_{2}}{s_{a}}\right)^{2}+\left(\frac{b_{1}-b_{2}}{s_{b}}\right)^{2}} \\
C_{1}=\left(L_{1}, a_{1}, b_{1}\right) \\
C_{2}=\left(L_{2}, a_{2}, b_{2}\right)
\end{gathered}
$$

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

$$
s_{x} \in \boldsymbol{R}^{1}
$$

## Do CIELab's theorhetical

 assertions about color hold across the target viewing conditions?
## Color Space Assumptions

A1: Axes are perceptually orthogonal.


A3: Axes are perceptually uniform.


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

$$
\Delta C=\sqrt{\left(L_{1}-L_{2}\right)^{2}+\left(a_{1}-a_{2}\right)^{2}+\left(b_{1}-b_{2}\right)^{2}}
$$

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


## Color Space Assumptions

A1: Axes are perceptually orthogonal.


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

$$
\Delta C=\sqrt{\left(L_{1}-L_{2}\right)^{2}+\left(a_{1}-a_{2}\right)^{2}+\left(b_{1}-b_{2}\right)^{2}}
$$

A3: Axes are perceptually uniform.
A4: Axes are scaled such that one unit corresponds to one JND.


## Color Space Assumptions

A1: Axes are perceptually orthogonal.


A3: Axes are perceptually uniform.


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

$$
\Delta C=\sqrt{\left(L_{1}-L_{2}\right)^{2}+\left(a_{1}-a_{2}\right)^{2}+\left(b_{1}-b_{2}\right)^{2}}
$$

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


## Color Space Assumptions

A1: Axes are perceptually orthogonal.


A3: Axes are perceptually uniform.


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

$$
\Delta C=\sqrt{\left(L_{1}-L_{2}\right)^{2}+\left(a_{1}-a_{2}\right)^{2}+\left(b_{1}-b_{2}\right)^{2}}
$$

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


## Validating Color Space

Given:


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:
A3:
Within Axis Color Matching Error

L Axis:
$\mu=3.025$
within: $p=0.2008, F=1.6437$
insert 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: $p=0.5154, F=0.4240$

## Color Space Assumptions

A1: Axes are perceptually orthogonal.


A3: Axes are perceptually uniform.


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

$$
\Delta C=\sqrt{\left(L_{1}-L_{2}\right)^{2}+\left(a_{1}-a_{2}\right)^{2}+\left(b_{1}-b_{2}\right)^{2}}
$$

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


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

## Adapted CIELab Difference Model

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


$$
\Delta C=\sqrt{\left(\frac{L_{1}-L_{2}}{s_{L}}\right)^{2}+\left(\frac{a_{1}-a_{2}}{s_{a}}\right)^{2}+\left(\frac{b_{1}-b_{2}}{s_{b}}\right)^{2}}
$$

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

$$
s_{x} \in \boldsymbol{R}^{1}
$$

## Adapting the Model

How do we scale each axis?


## Adapting the Model

Do these two colors match?


## Adapting the Model

$$
D=
$$

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 $p$.

## Adapting the Model - Web Viewing

25 Participants


50 Participants


75 Participants

$\Delta \mathrm{L}$
$50 \%$ of samples are discriminable:

$$
\begin{gathered}
s_{L}=4.0 \\
s_{a}=5.5 \\
s_{b}=6.0
\end{gathered}
$$

$80 \%$ of samples are discriminable:

$$
\begin{aligned}
s_{L} & =6.5 \\
s_{a} & =8.5 \\
s_{b} & =9.0
\end{aligned}
$$

# Does our adapted color difference model work for web viewing conditions? 

## Validating the Model - Web Viewing

$$
\begin{gathered}
\Delta C=\sqrt{\left(\frac{L_{1}-L_{2}}{4.0}\right)^{2}+\left(\frac{a_{1}-a_{2}}{5.5}\right)^{2}+\left(\frac{b_{1}-b_{2}}{6.0}\right)^{2}} \\
\Delta C=\sqrt{\left(\frac{L_{1}-L_{2}}{6.5}\right)^{2}+\left(\frac{a_{1}-a_{2}}{8.5}\right)^{2}+\left(\frac{b_{1}-b_{2}}{9.0}\right)^{2}}
\end{gathered}
$$

## Validating the Model - Web Viewing



## Validating the Model - Web Viewing

Do these two colors match?


## Validating the Model - Web Viewing

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

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

## Validating the Model - Web Viewing

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

## Danielle Albers (dalbers@cs.wisc.edu) <br> Thank you! graphics.cs.wisc.edu <br> Where should we send this?

