# Information Visualization Color, ArteryViz, Rainbows Rev *Ex: Two Numbers, Colors*

#### **Tamara Munzner**

Department of Computer Science

University of British Columbia

Week 5, 5 Oct 2022

https://www.cs.ubc.ca/~tmm/courses/547-22

## Plan for today

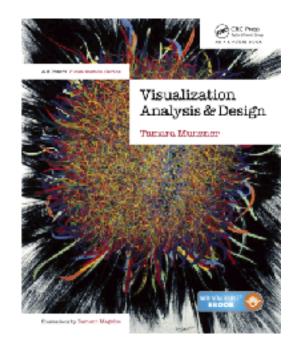
- this week reading Q&A
  - -Color, Artery Viz, Rainbows Revisited
- small group exercises
  - -Two Numbers start
  - -(break)
  - -Two Numbers end
  - -Color
- due tomorrow 8pm: finalized teams
  - Canvas -> People -> Project Pitch Groups

#### Next week

- to read & discuss (async, before next class)
  - VAD book, Ch 9: Networks and Trees
  - -paper: ABySS-Explorer [design study]
  - -paper: Genealogical Graphs [technique]
- pre-proposal meetings
  - I'll use full class slot plus some extra slots
  - exact timing TBD after I see final number of teams (10-15 min each)
  - stay tuned on Piazza for signup link
  - -encouraged but not required to use rest of class slot for teams work

# Q&A / Backup Slides

# Visualization Analysis & Design



# Color (Ch 10)

#### **Tamara Munzner**

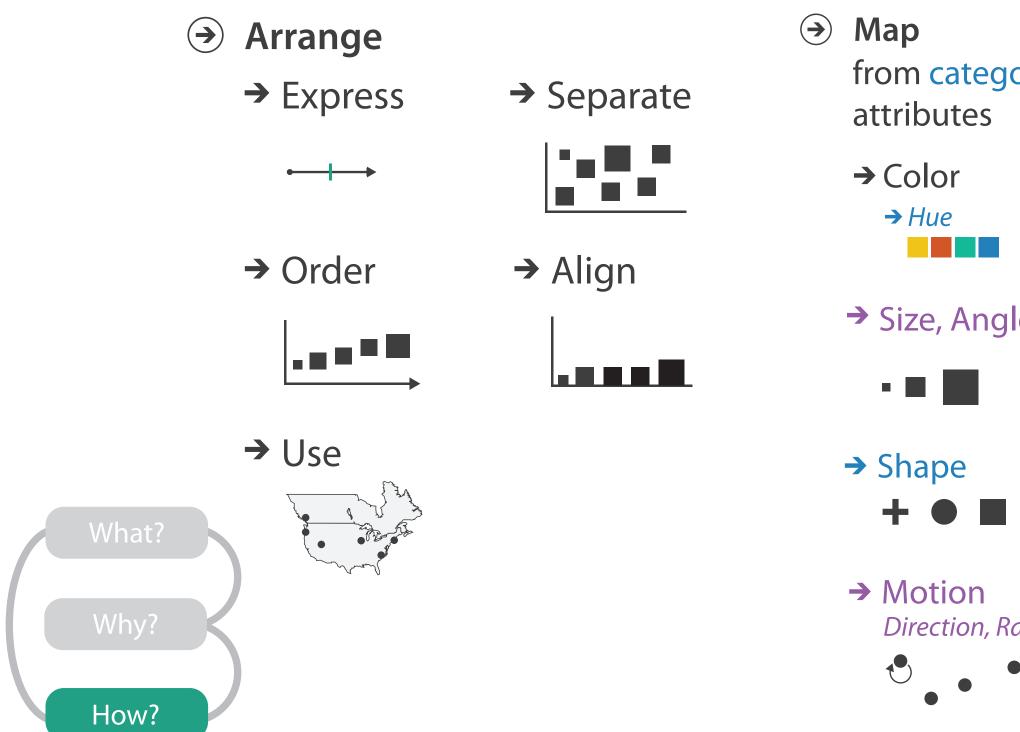
Department of Computer Science

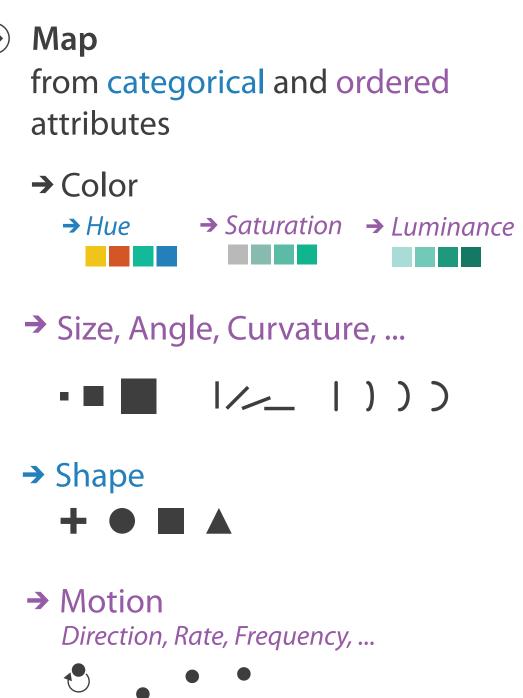
University of British Columbia

@tamaramunzner

### Idiom design choices: Visual encoding

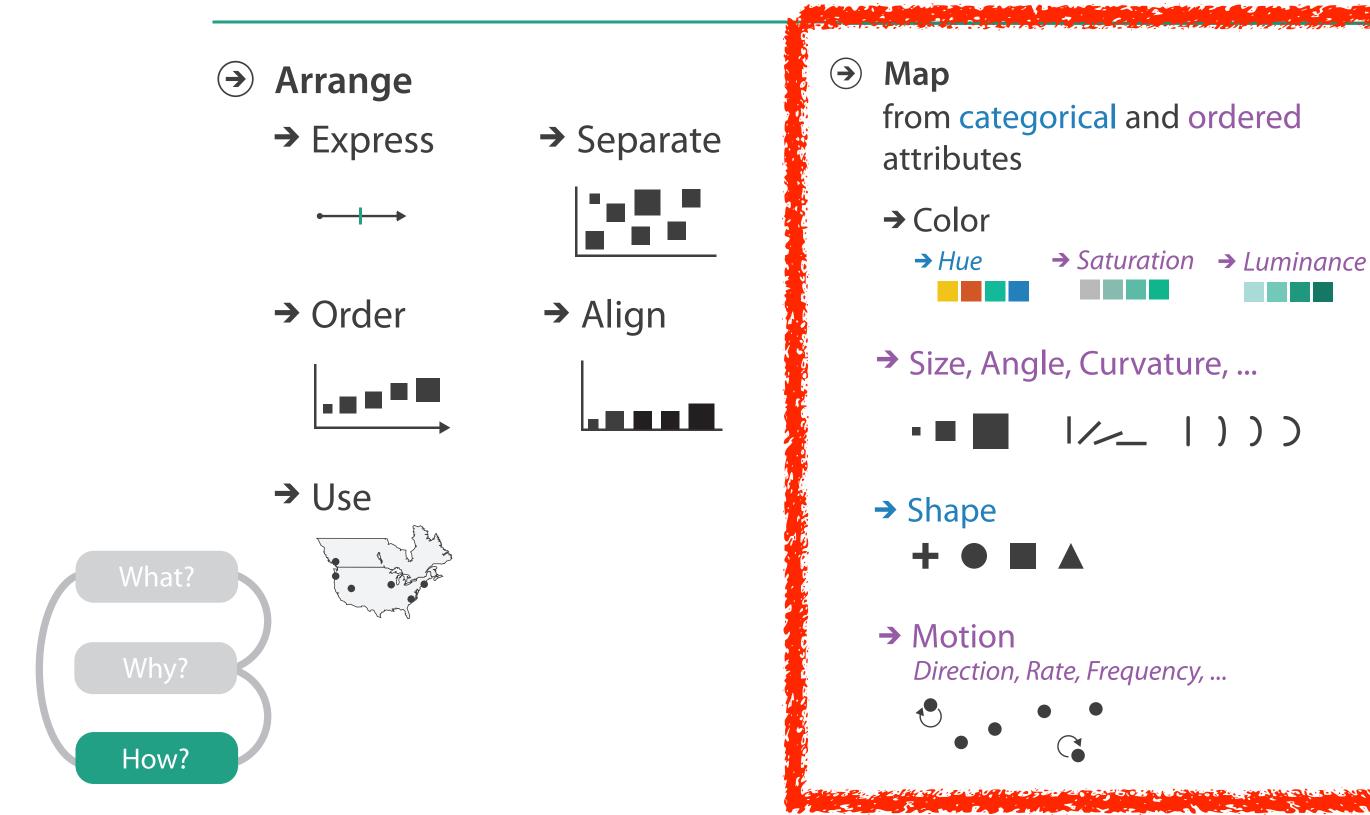
#### **Encode**



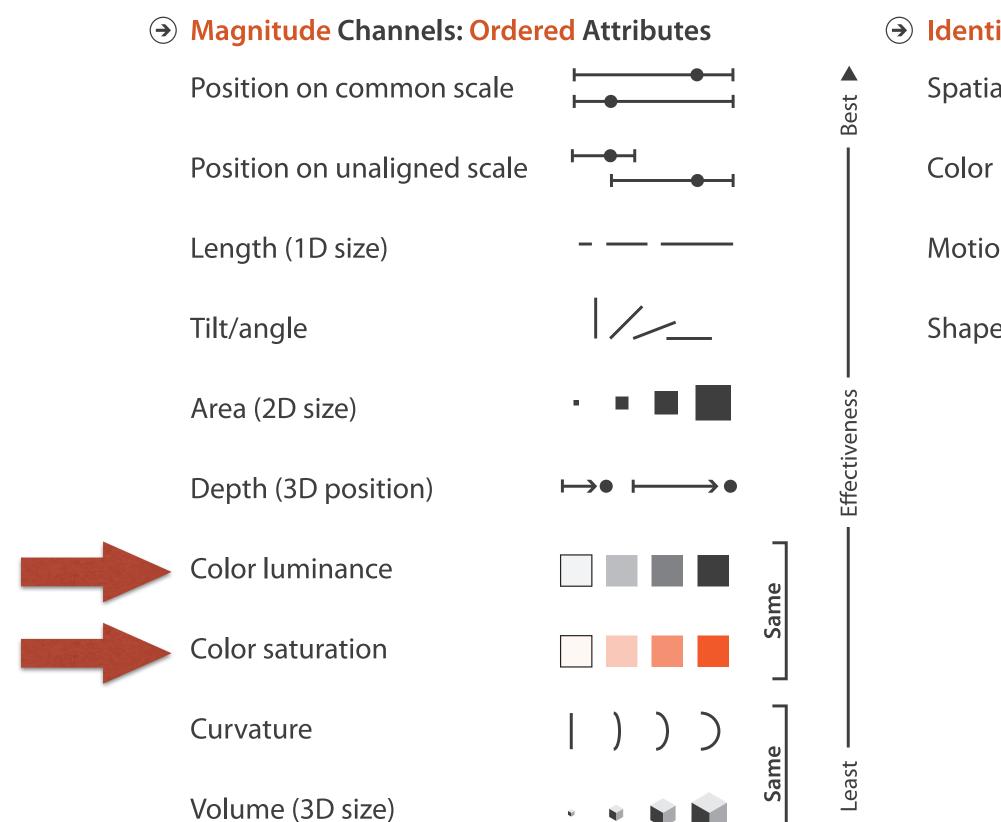


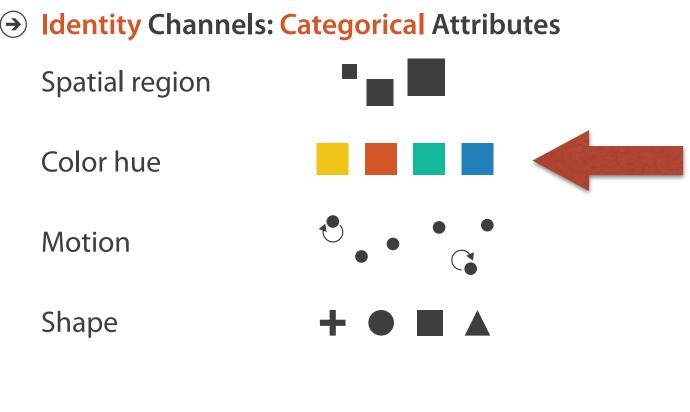
## Idiom design choices: Beyond spatial arrangement

#### Encode



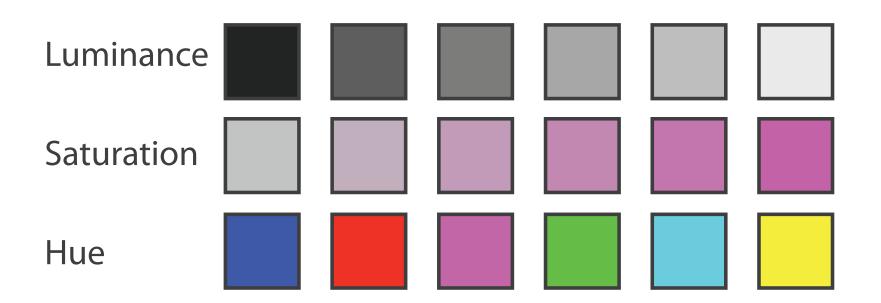
# Channels: What's up with color?



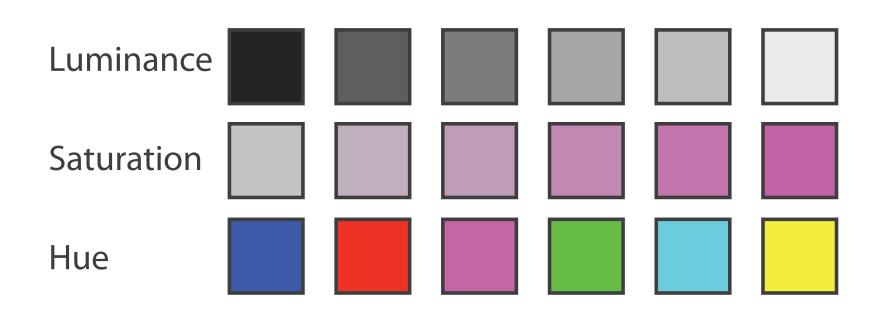


- first rule of color: do not (just) talk about color!
  - -color is confusing if treated as monolithic

- first rule of color: do not (just) talk about color!
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  - ordered can show magnitude
    - **luminance**: how bright (B/W)
    - saturation: how colourful
  - categorical can show identity
    - hue: what color



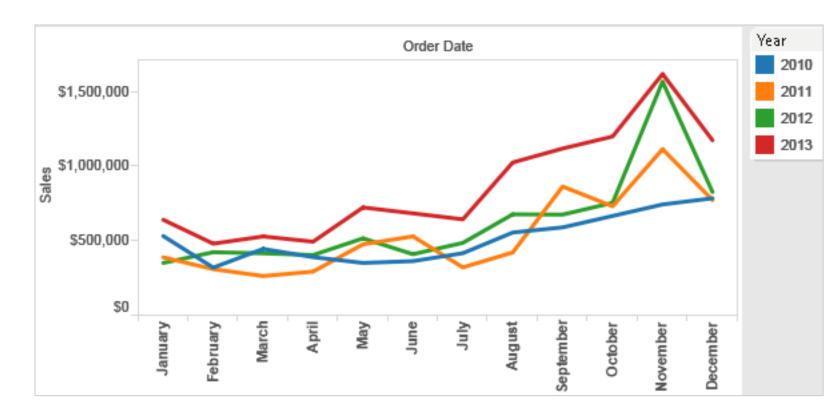
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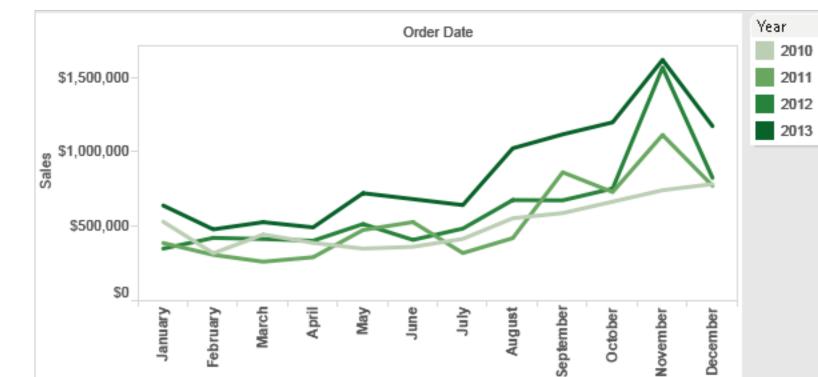


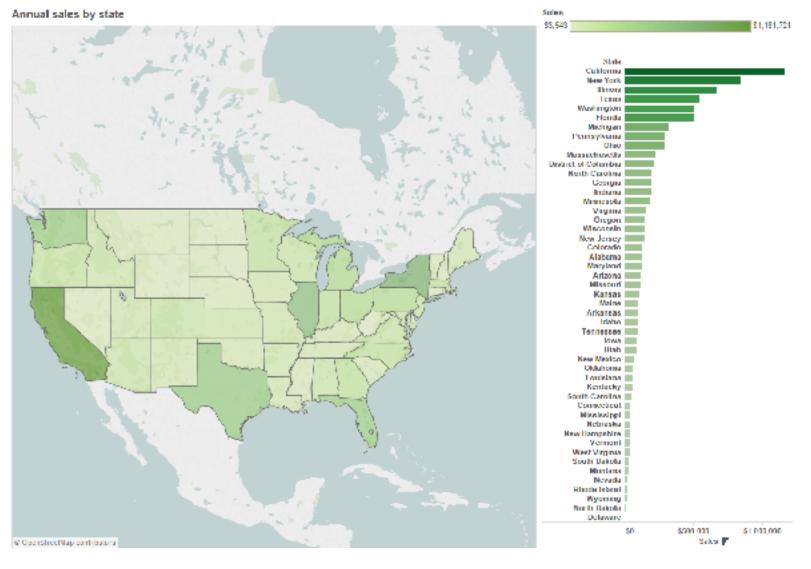
- channels have different properties
  - -what they convey directly to perceptual system
  - -how much they can convey
    - how many discriminable bins can we use?

# Color Channels in Visualization

## Categorical vs ordered color



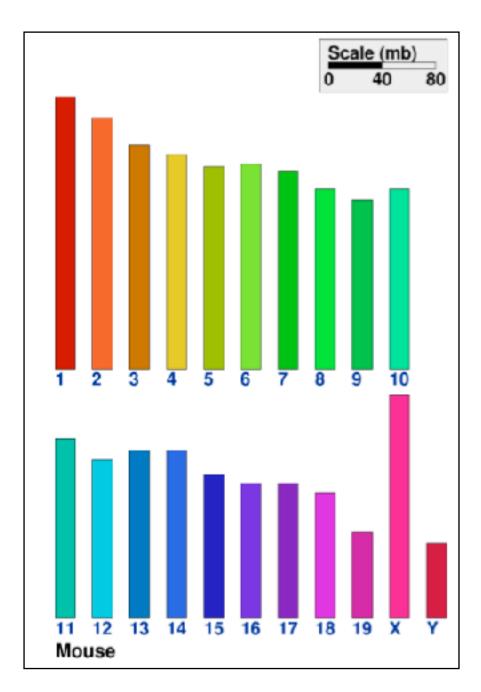




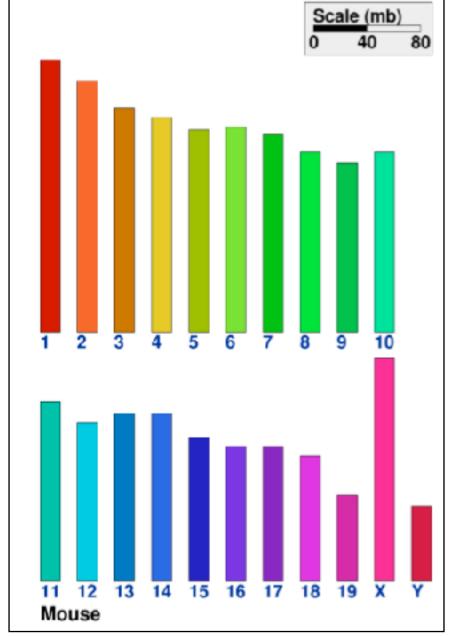
[Seriously Colorful: Advanced Color Principles & Practices. Stone. Tableau Customer Conference 2014.]

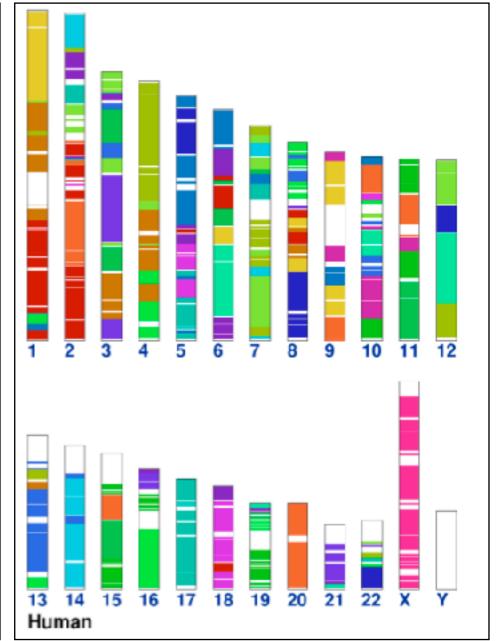
 human perception built on relative comparisons

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  - -great if color contiguous

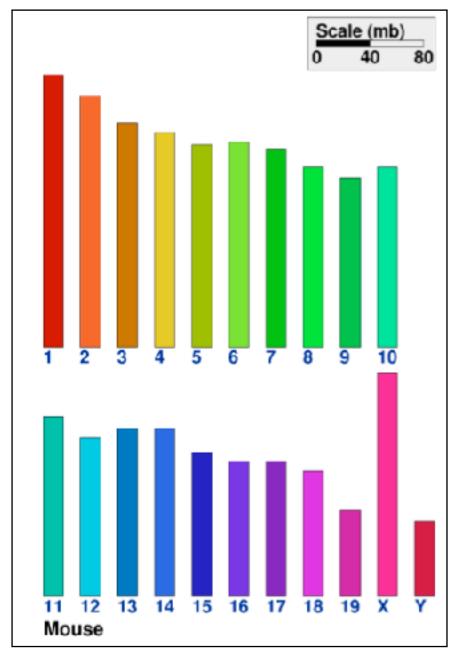


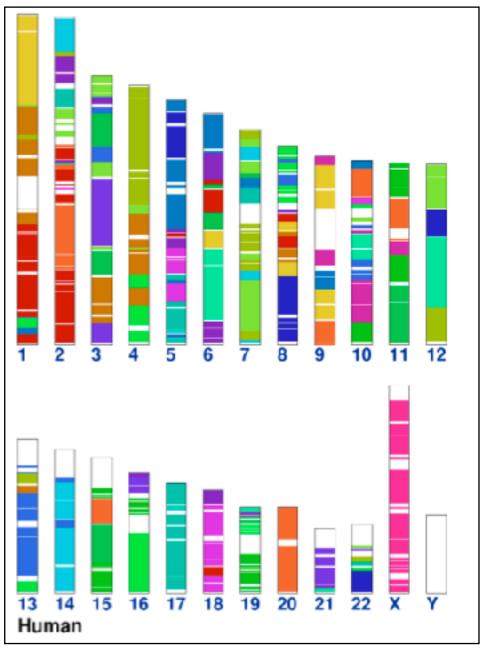
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  - -great if color contiguous
  - surprisingly bad for absolute comparisons





- human perception built on relative comparisons
  - -great if color contiguous
  - surprisingly bad for absolute comparisons
- noncontiguous small regions of color
  - -fewer bins than you want
  - rule of thumb: 6-12 bins,including background and highlights





- Cancer
- Connective tissue
- Bone
- Muscular
- Skeletal Dermatological
- Cardiovascular
  - Hematological

Renal

Immunological

Endocrine

- Nutritional Metabolic

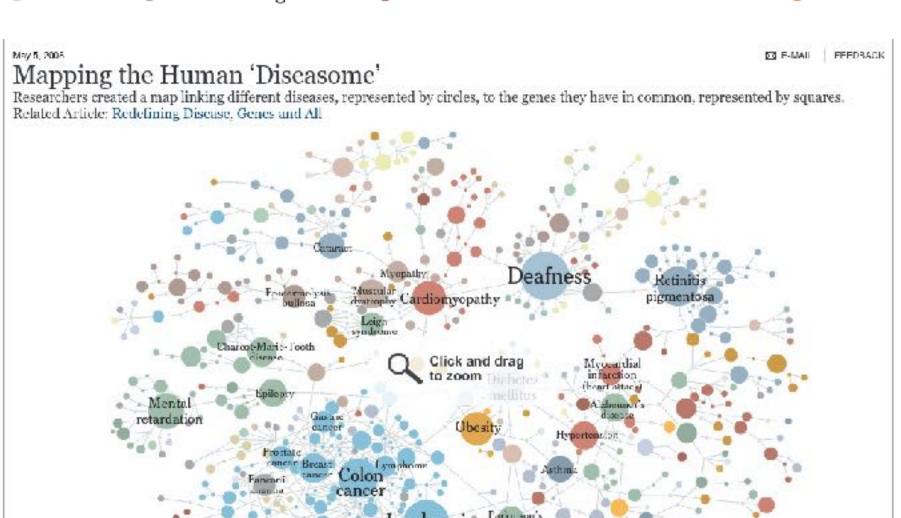
Gastrointestinal

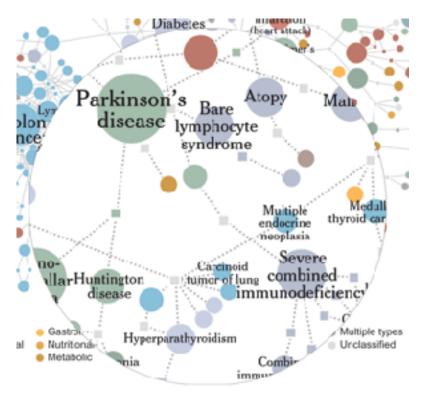
- Ear, nose, throat
- Ophthalmological
- Respiratory
- Developmental

Neurological

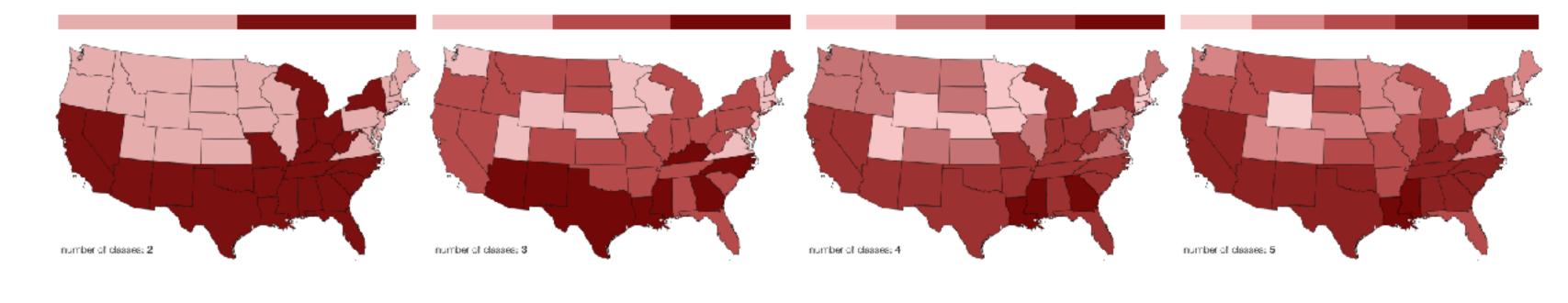
Psychiatric

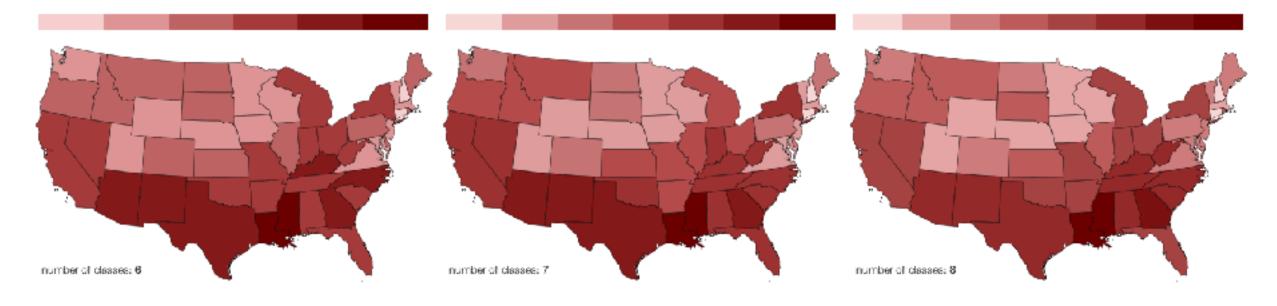
- Multiple types
- Unclassified





#### Ordered color: limited number of discriminable bins





- problems
  - perceptually unordered
  - perceptually nonlinear

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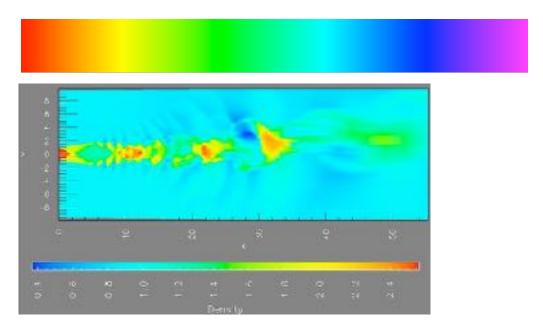


#### problems

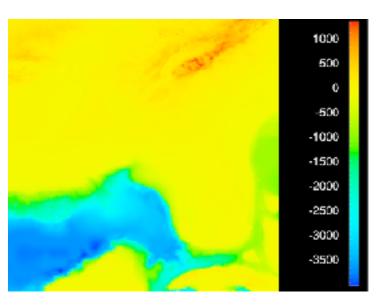
- perceptually unordered
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#### benefits

fine-grained structure visible and nameable



[A Rule-based Tool for Assisting Colormap Selection. Bergman,. Rogowitz, and Treinish. Proc. IEEE Visualization (Vis), pp. 118–125, 1995.]



[Why Should Engineers Be Worried About Color? Treinish and Rogowitz 1998. http://www.research.ibm.com/people/I/lloydt/color/color.HTM]

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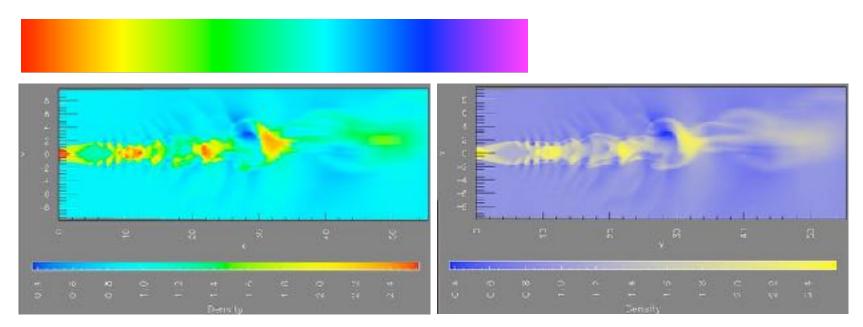
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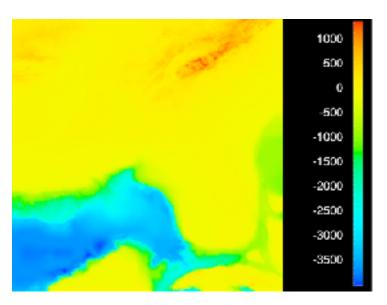
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#### alternatives

large-scale structure: fewer hues



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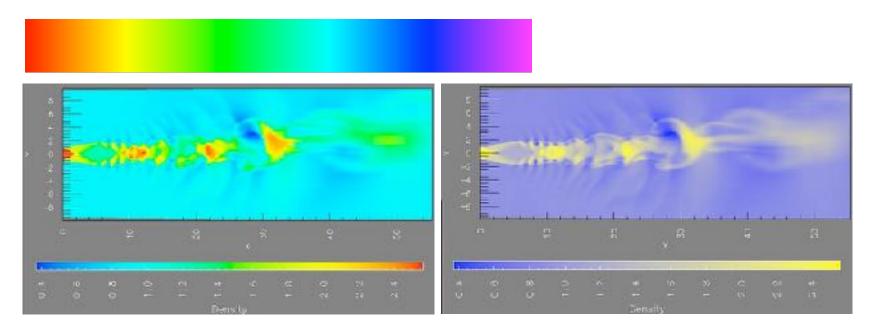
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#### benefits

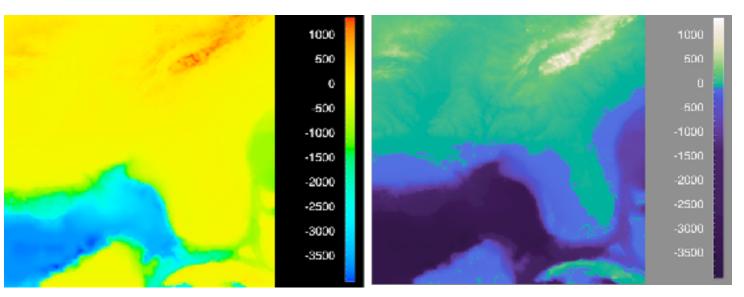
fine-grained structure visible and nameable

#### alternatives

- large-scale structure: fewer hues
- fine structure: multiple hues with monotonically increasing luminance [eg viridis]



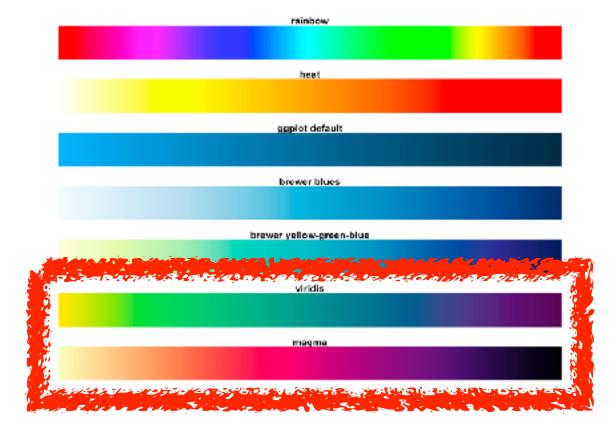
[A Rule-based Tool for Assisting Colormap Selection. Bergman,. Rogowitz, and Treinish. Proc. IEEE Visualization (Vis), pp. 118–125, 1995.]

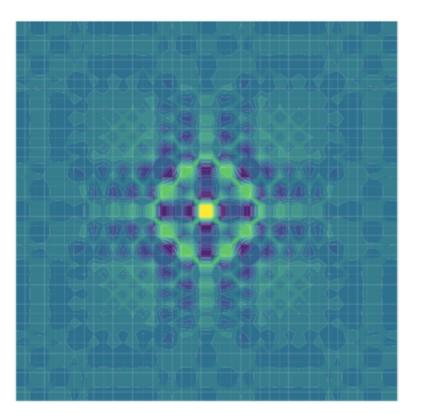


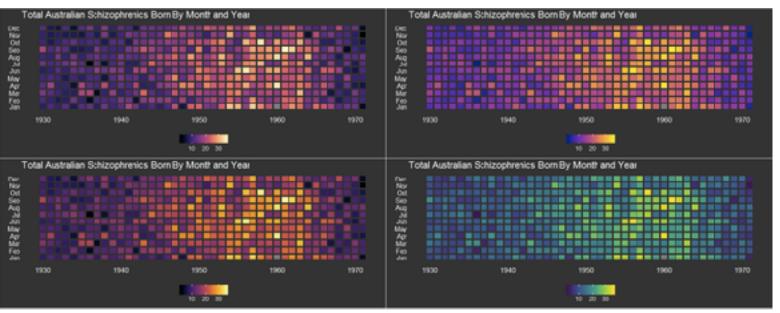
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## Viridis / Magma: sequential colormaps

- monotonically increasing luminance, perceptually uniform
- colorful, colorblind-safe
  - -R, python, D3







https://cran.r-project.org/web/packages/viridis/vignettes/intro-to-viridis.html

#### problems

- perceptually unordered
- -perceptually nonlinear

#### benefits

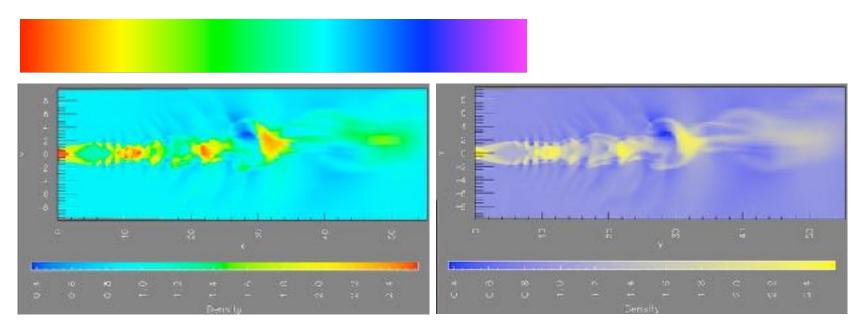
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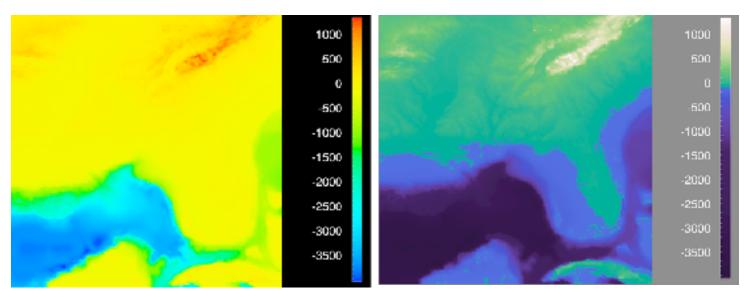
- large-scale structure: fewer hues
- fine structure: multiple hues with monotonically increasing luminance [eg viridis]

#### legit for categorical

-segmented saturated rainbow is good!



[A Rule-based Tool for Assisting Colormap Selection. Bergman,. Rogowitz, and Treinish. Proc. IEEE Visualization (Vis), pp. 118–125, 1995.]

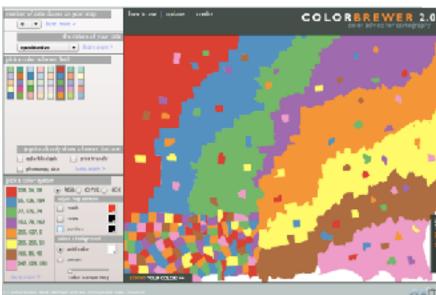


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#### Interaction between channels: Not fully separable

- color channel interactions
  - size heavily affects salience
  - small regions need high saturation
  - large regions need low saturation



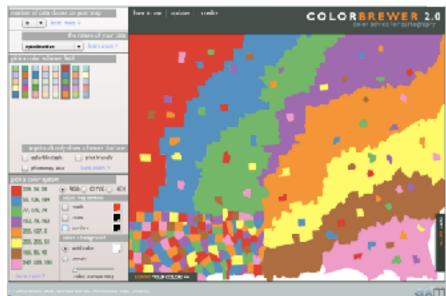


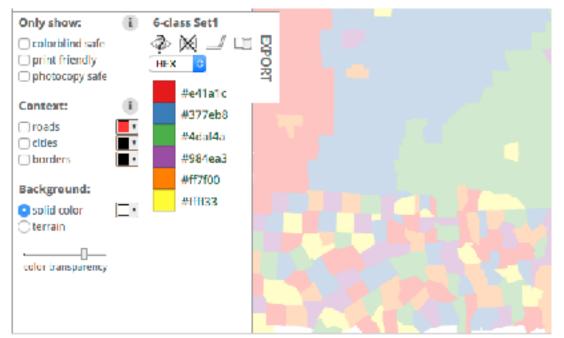
http://colorbrewer2.org/

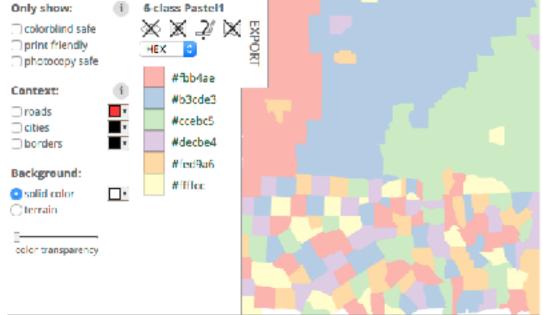
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  - large regions need low saturation
- saturation & luminance:
  - not separable from each other!
  - also not separable from transparency









http://colorbrewer2.org/

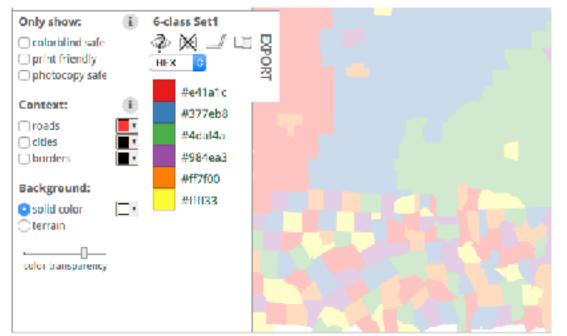
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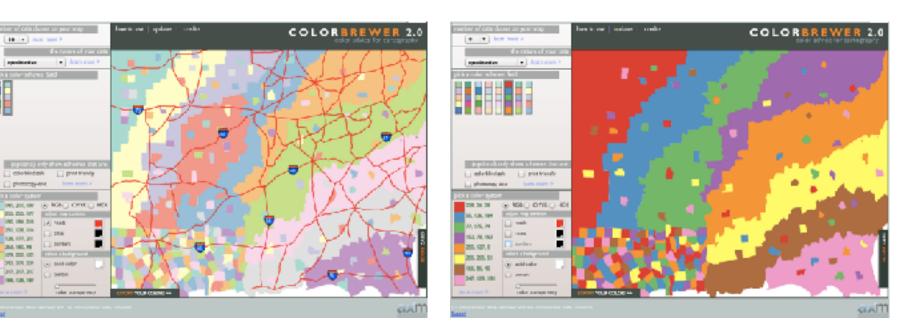
- size heavily affects salience
- small regions need high saturation
- large regions need low saturation

#### saturation & luminance:

- not separable from each other!
- also not separable from transparency
- small separated regions: 2 bins safest (use only one of these channels), 3-4 bins max
- contiguous regions: many bins (use only one of these channels)







http://colorbrewer2.org/

# **Color Palettes**

→ Categorical



- categorical
  - aim for maximum distinguishability
  - aka qualitative, nominal





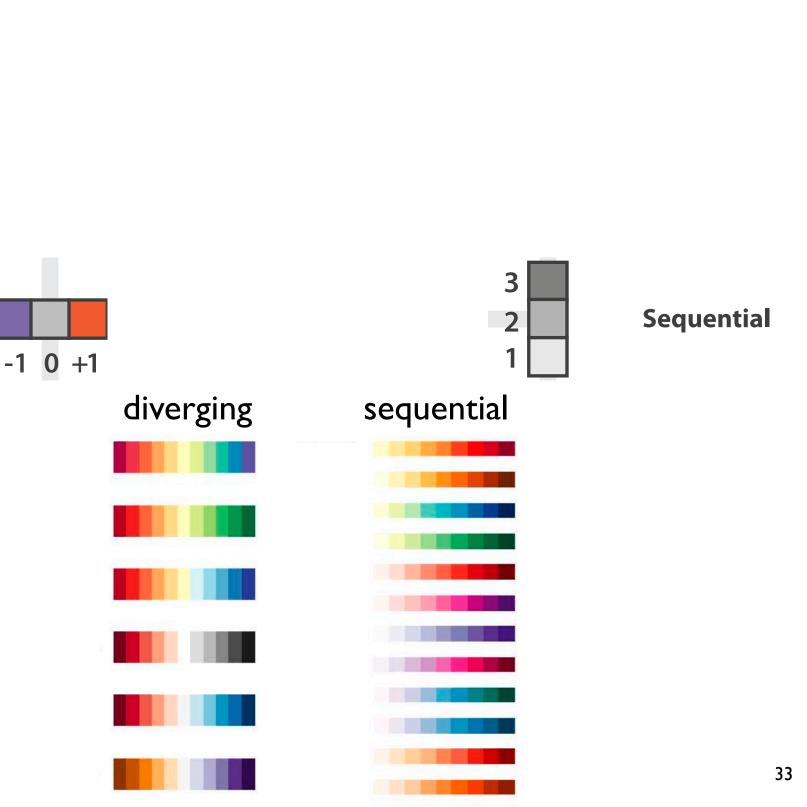
→ Categorical



- → Ordered
  - → Sequential
- → Diverging
- **→**
- diverging
  - useful when data has meaningful "midpoint"

**Diverging** 

- use neutral color for midpoint
  - white, yellow, grey
- use saturated colors for endpoints
- sequential
  - ramp luminance or saturation



**Categorical** 

→ Categorical

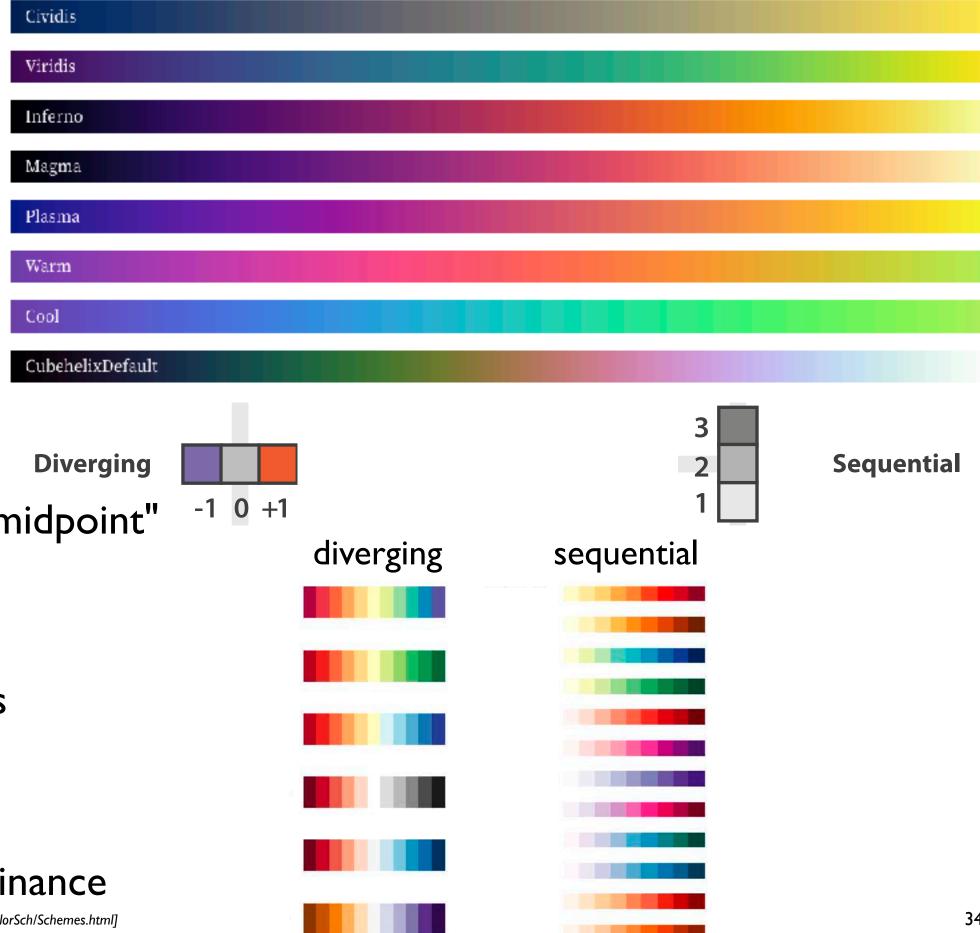


- → Ordered
  - → Sequential
- → Diverging





- diverging
  - useful when data has meaningful "midpoint"
  - use neutral color for midpoint
    - white, yellow, grey
  - use saturated colors for endpoints
- sequential
  - ramp luminance or saturation
  - if multi-hue, good to order by luminance



→ Categorical



→ Ordered



→ Diverging

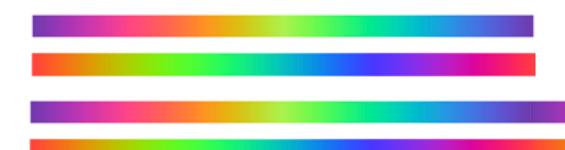




→ Cyclic

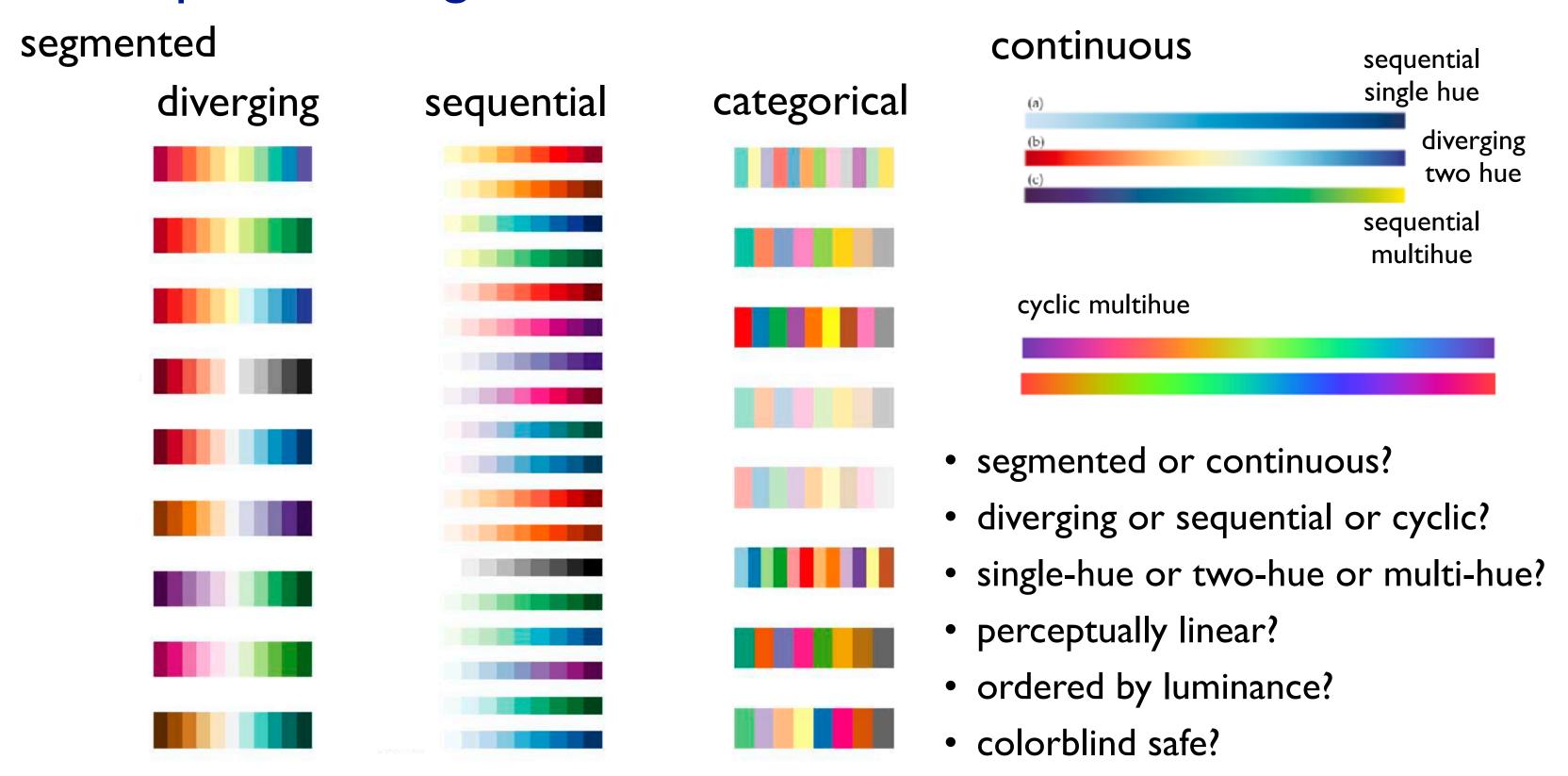


cyclic multihue



https://github.com/d3/d3-scale-chromatic

### Color palette design considerations: univariate



#### Colormaps: bivariate

→ Categorical



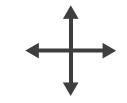
→ Ordered

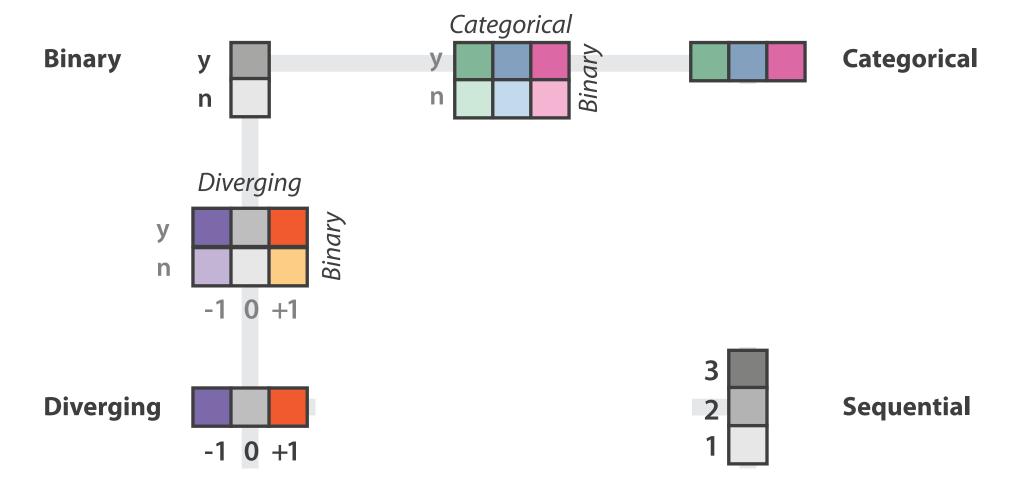
→ Sequential

→ Diverging



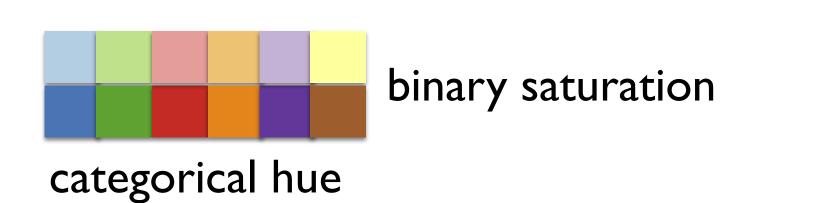
→ Bivariate





- bivariate best case
  - binary in one of the directions





#### Colormaps: bivariate

→ Categorical

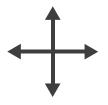


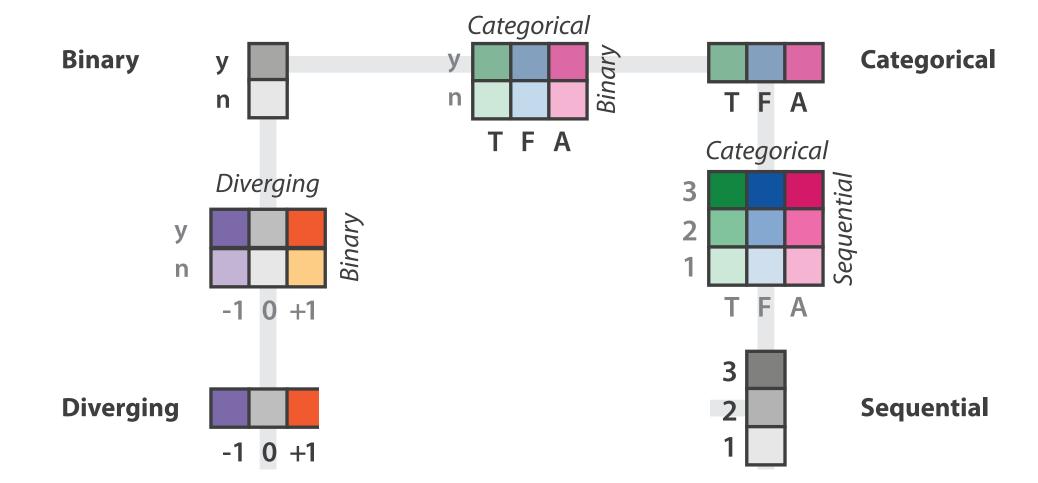
- → Ordered
  - → Sequential
- → Diverging





→ Bivariate



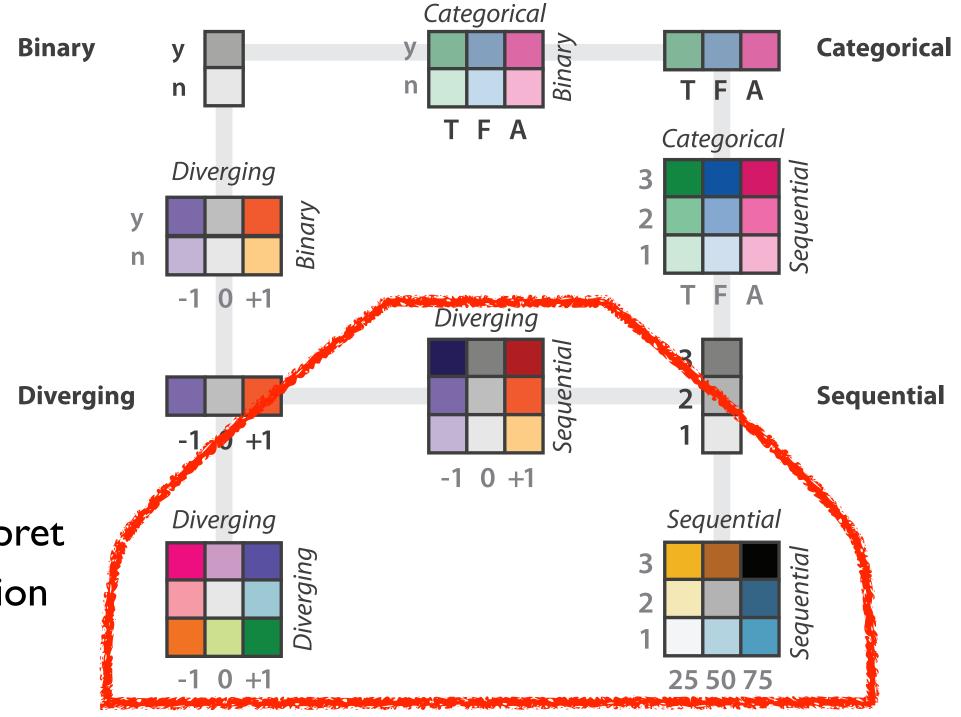


#### Colormaps

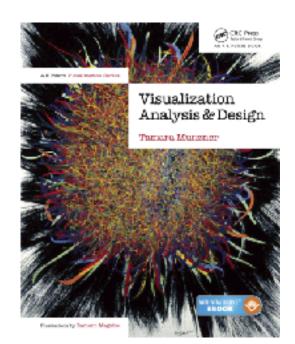
- → Categorical
- → Ordered
  - → Sequential
- → Diverging
- **←**
- → Bivariate



- bivariate can be very difficult to interpret
  - when multiple levels in each direction



## Visualization Analysis & Design



## Color (Ch 10) II

#### **Tamara Munzner**

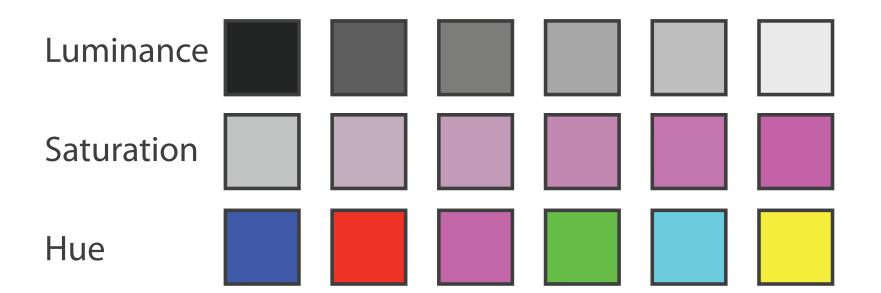
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@tamaramunzner

#### Decomposing color

- decompose into three channels
  - ordered can show magnitude
    - **luminance**: how bright (B/W)
    - saturation: how colourful
  - categorical can show identity
    - hue: what color



# Color Deficiency

#### Luminance

- need luminance for edge detection
  - -fine-grained detail only visible through luminance contrast
  - -legible text requires luminance contrast!





Saturation/hue information



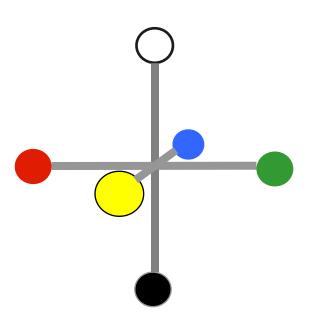




[Seriously Colorful: Advanced Color Principles & Practices. Stone. Tableau Customer Conference 2014.]

#### Opponent color and color deficiency

- perceptual processing before optic nerve
  - one achromatic luminance channel (L\*)
    - -edge detection through luminance contrast
  - -2 chroma channels
    - -red-green (a\*) & yellow-blue axis (b\*)









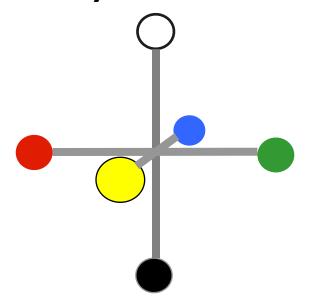
Chroma information



[Seriously Colorful: Advanced Color Principles & Practices. Stone. Tableau Customer Conference 2014.]

### Opponent color and color deficiency

- perceptual processing before optic nerve
  - one achromatic luminance channel (L\*)
    - -edge detection through luminance contrast
  - -2 chroma channels
    - -red-green (a\*) & yellow-blue axis (b\*)
- "colorblind": degraded acuity, one axis
  - -8% of men are red/green color deficient
  - -blue/yellow is rare









Chroma information

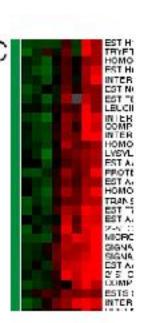


[Seriously Colorful: Advanced Color Principles & Practices. Stone. Tableau Customer Conference 2014.]

#### Designing for color deficiency: Check with simulator



Normal vision



green-weak



**Deuteranope Protanope** red-weak



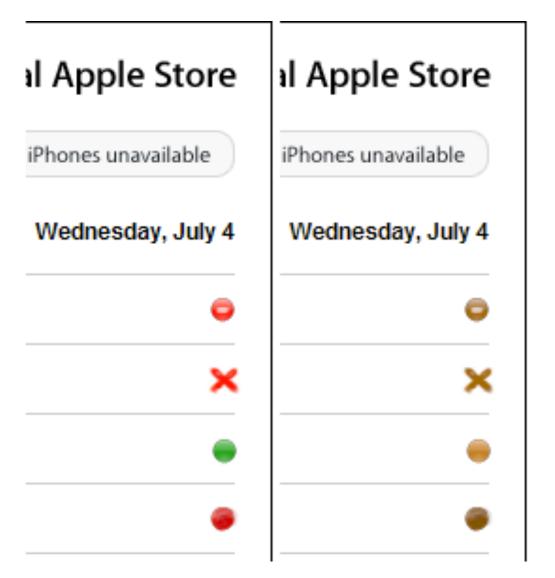


**Tritanope** blue-weak

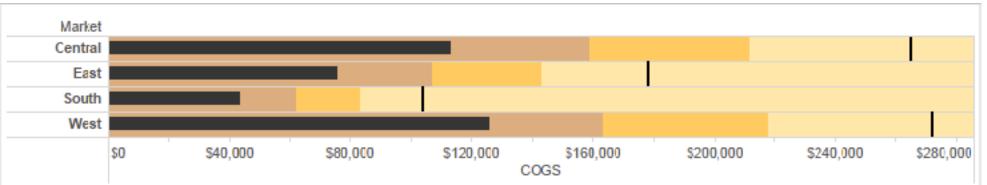
https://www.color-blindness.com/coblis-color-blindness-simulator/

### Designing for color deficiency: Avoid encoding by hue alone

- redundantly encode
  - vary luminance
  - change shape





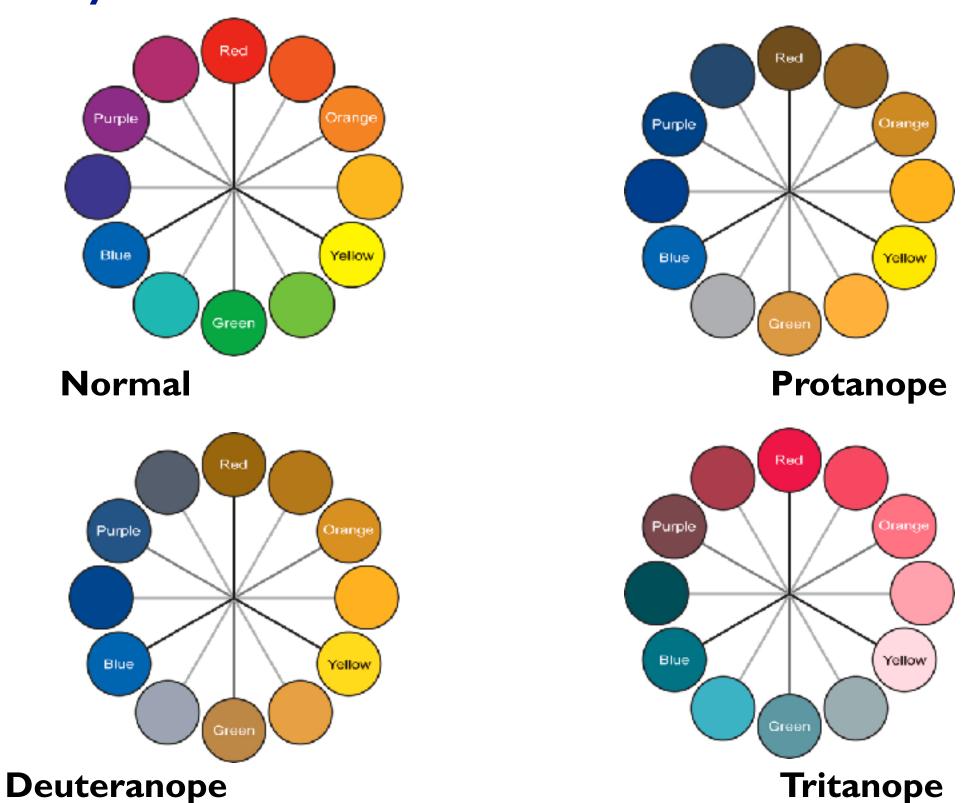


Deuteranope simulation

Change the shape

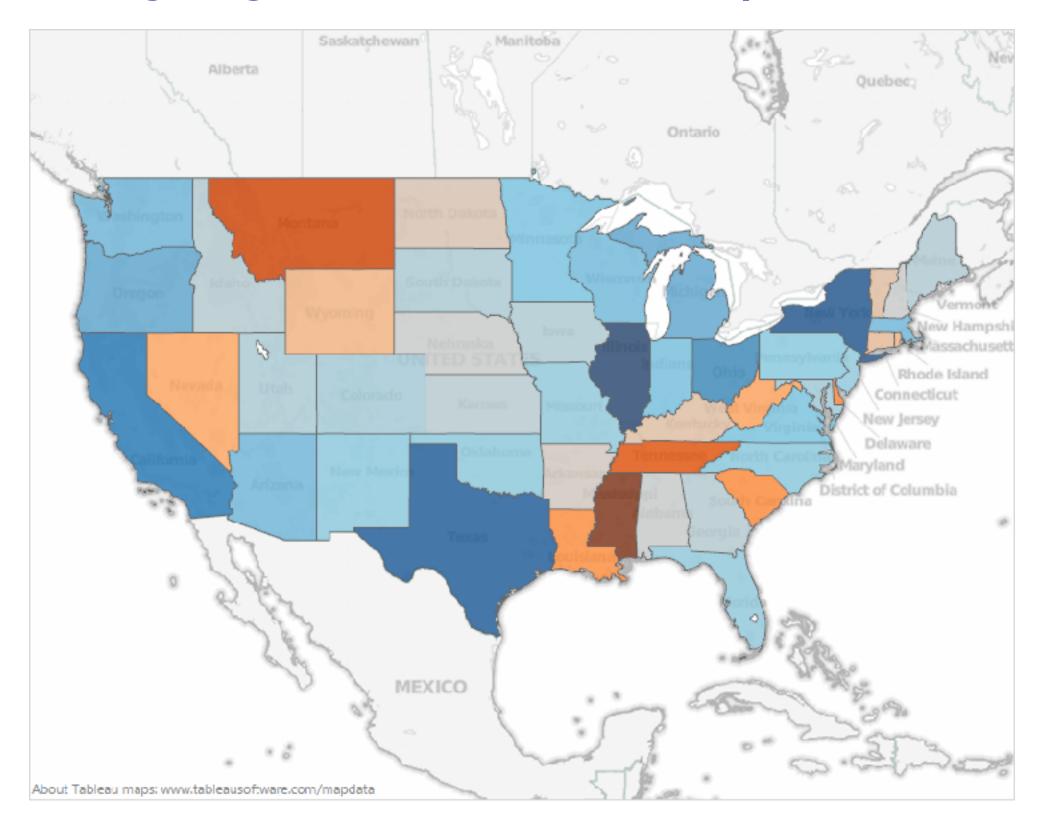
Vary luminance

#### Color deficiency: Reduces color to 2 dimensions

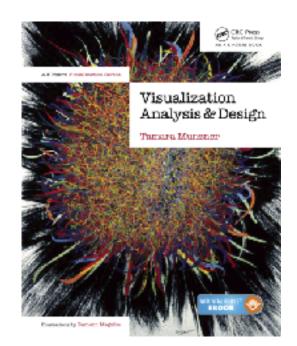


**Tritanope** 

### Designing for color deficiency: Blue-Orange is safe



## Visualization Analysis & Design



## Color (Ch 10) III

#### **Tamara Munzner**

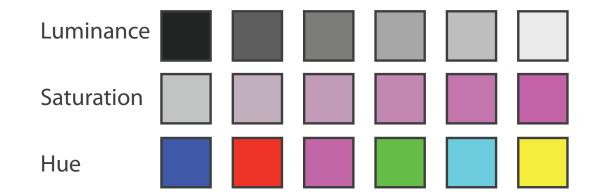
Department of Computer Science

University of British Columbia

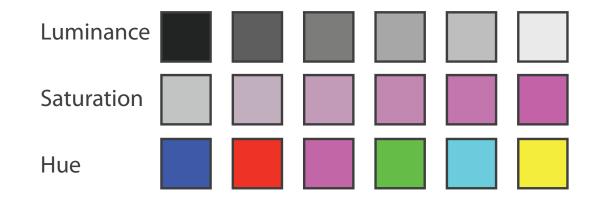
@tamaramunzner

# Color Spaces

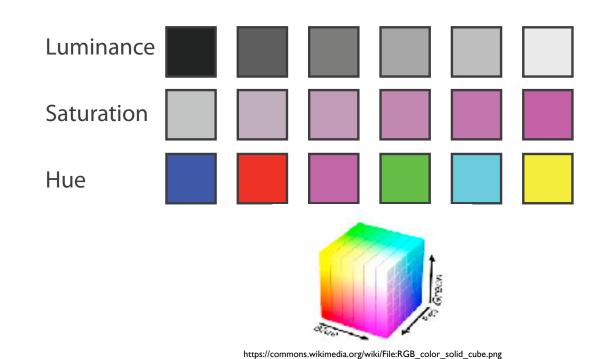
- Luminance (L\*), hue (H), saturation (S)
  - good for encoding



- Luminance (L\*), hue (H), saturation (S)
  - good for encoding
  - but not standard graphics/tools colorspace



- Luminance (L\*), hue (H), saturation (S)
  - good for encoding
  - but not standard graphics/tools colorspace
- RGB: good for display hardware

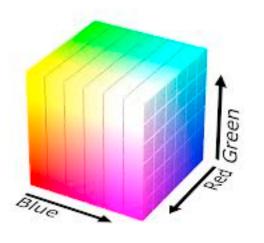


#### **RGB**

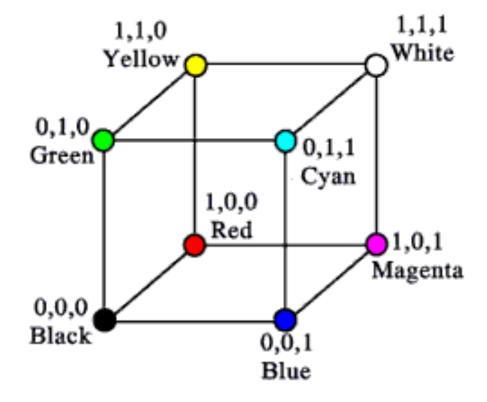
• RGB: good for display hardware

Corners of the RGB color cube





 $https://commons.wikimedia.org/wiki/File: RGB\_color\_solid\_cube.png$ 

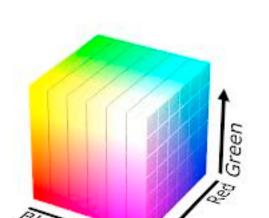


#### **RGB**

• RGB: good for display hardware

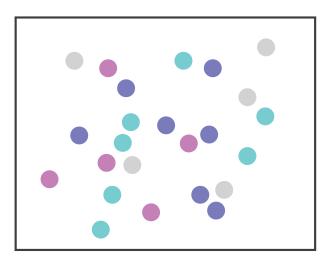
poor for encoding & interpolation

Corners of the RGB color cube



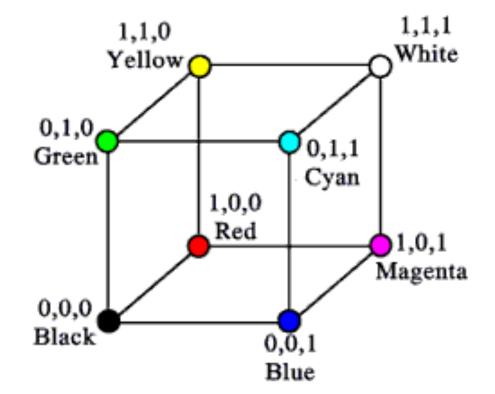
https://commons.wikimedia.org/wiki/File:RGB color solid cube.png

Red + Green

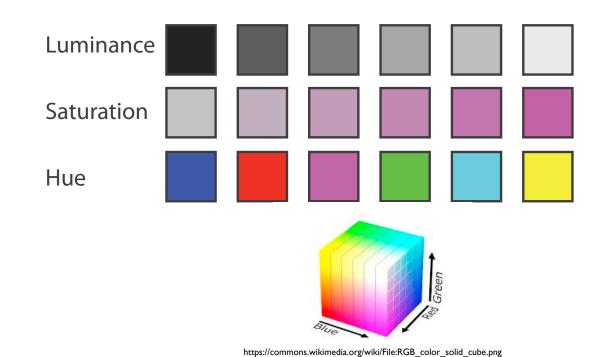


Major interference

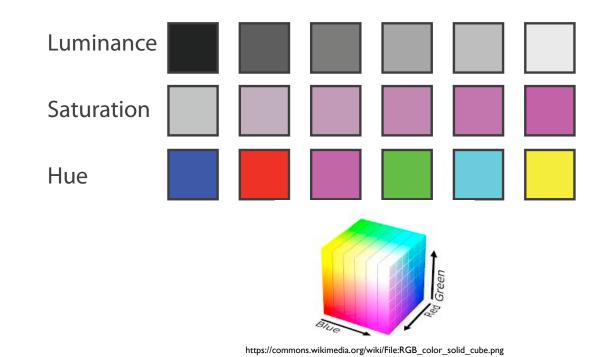




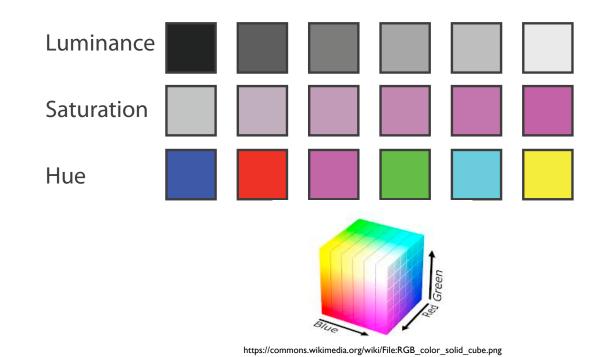
- Luminance (L\*), hue (H), saturation (S)
  - good for encoding
  - but not standard graphics/tools colorspace
- RGB: good for display hardware
  - poor for encoding & interpolation



- Luminance (L\*), hue (H), saturation (S)
  - good for encoding
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- RGB: good for display hardware
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- CIE LAB (L\*a\*b\*): good for interpolation

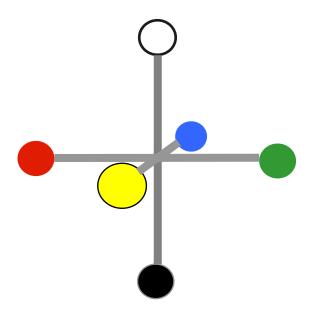


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- CIE LAB (L\*a\*b\*): good for interpolation
  - hard to interpret, poor for encoding



### Perceptual colorspace: L\*a\*b\*

- perceptual processing before optic nerve
  - one achromatic luminance channel (L\*)
    - edge detection through luminance contrast
  - -2 chroma channels
    - red-green (a\*) & yellow-blue axis (b\*)









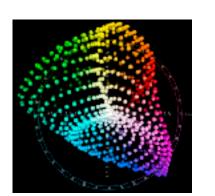
Chroma information

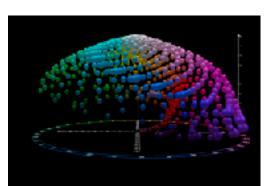


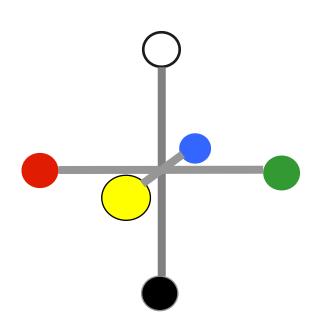
[Seriously Colorful: Advanced Color Principles & Practices. Stone. Tableau Customer Conference 2014.]

### Perceptual colorspace: L\*a\*b\*

- perceptual processing before optic nerve
  - one achromatic luminance channel (L\*)
    - edge detection through luminance contrast
  - -2 chroma channels
    - red-green (a\*) & yellow-blue axis (b\*)
- CIE LAB
  - -perceptually uniform
    - great for interpolating
  - -complex shape
    - poor for encoding













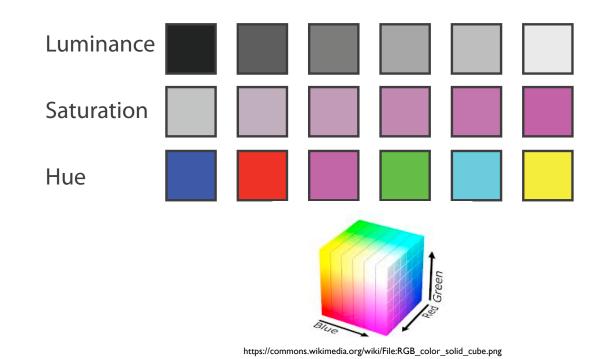
Chroma information



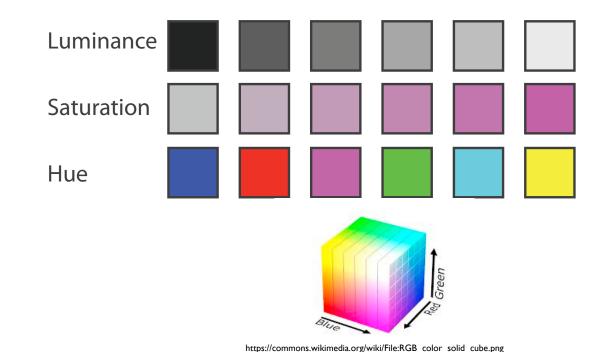
[Seriously Colorful: Advanced Color Principles & Practices. Stone. Tableau Customer Conference 2014.]

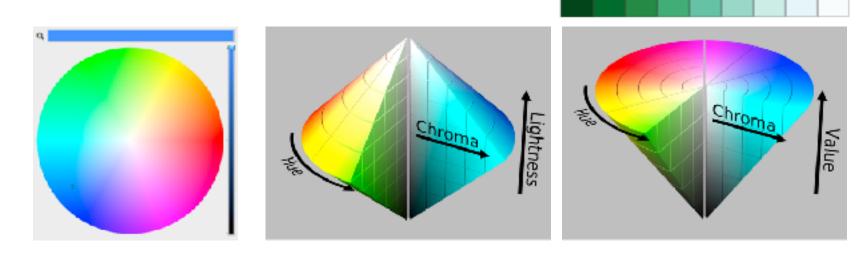
https://en.wikipedia.org/wiki/CIELAB\_color\_space

- Luminance (L\*), hue (H), saturation (S)
  - good for encoding
  - but not standard graphics/tools colorspace
- RGB: good for display hardware
  - poor for encoding & interpolation
- CIE LAB (L\*a\*b\*): good for interpolation
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- Luminance (L\*), hue (H), saturation (S)
  - good for encoding
  - but not standard graphics/tools colorspace
- RGB: good for display hardware
  - poor for encoding & interpolation
- CIE LAB (L\*a\*b\*): good for interpolation
  - hard to interpret, poor for encoding
- HSL/HSV: somewhat better for encoding

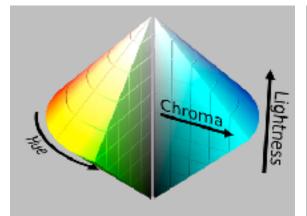


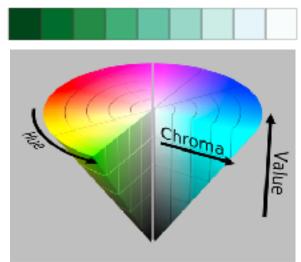


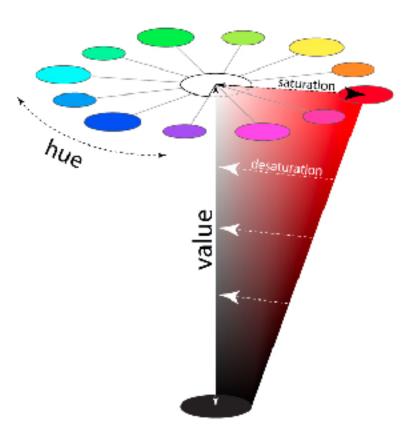
#### HSL/HSV

- HSL/HSV: somewhat better for encoding
  - hue/saturation wheel intuitive
- saturation
  - in HSV (single-cone) desaturated = white
  - in HSL (double-cone) desaturated = grey







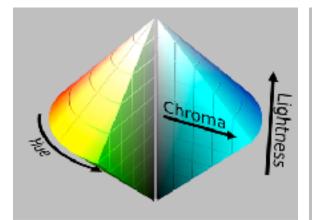


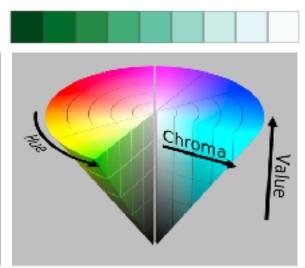
http://learn.leighcotnoir.com/artspeak/elements-color/hue-value-saturation/hsv8/

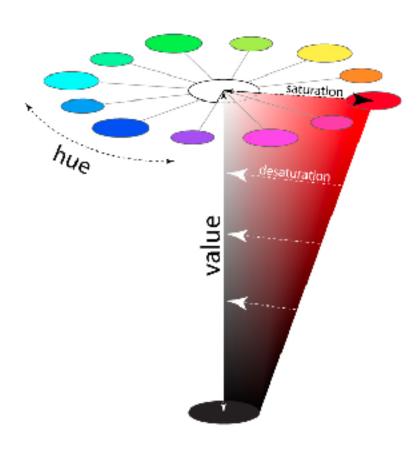
#### HSL/HSV

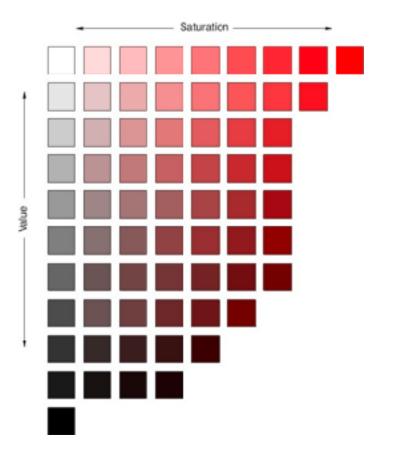
- HSL/HSV: somewhat better for encoding
  - hue/saturation wheel intuitive
- saturation
  - in HSV (single-cone) desaturated = white
  - in HSL (double-cone) desaturated = grey
- luminance vs saturation
  - -channels **not** very separable
  - typically not crucial to distinguish between these with encoding/decoding
  - key point is hue vs luminance/saturation











http://learn.leighcotnoir.com/artspeak/elements-color/hue-value-saturation/hsv8/

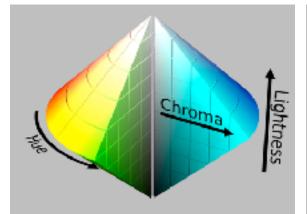
http://learn.leighcotnoir.com/artspeak/elements-color/hue-value-saturation/hsv8/

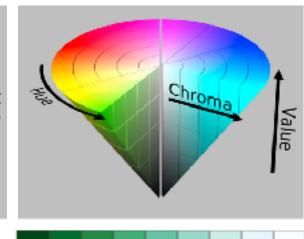
### HSL/HSV: Pseudo-perceptual colorspace

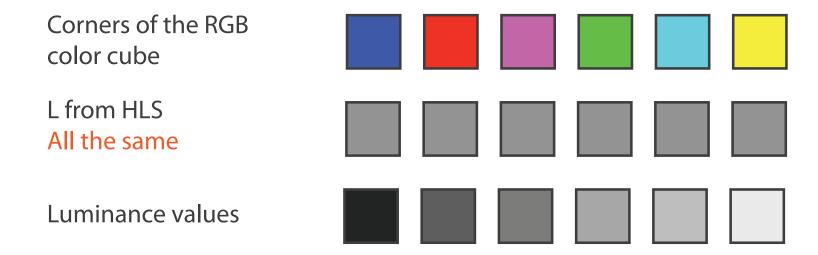
 HSL better than RGB for encoding
 but beware

-L lightness  $\neq L^*$  luminance



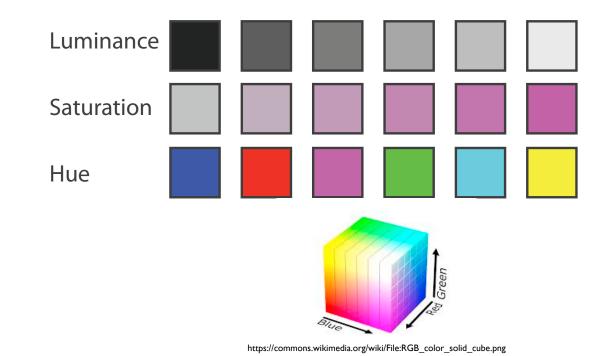


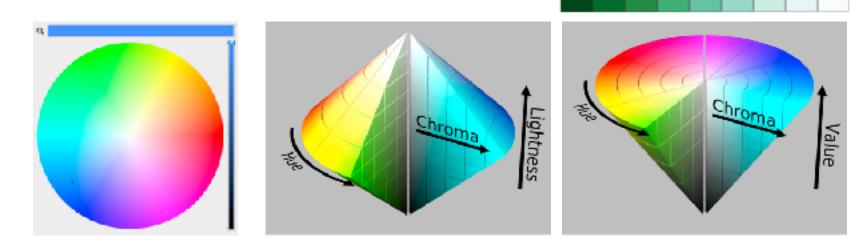




[Seriously Colorful: Advanced Color Principles & Practices. Stone. Tableau Customer Conference 2014.]

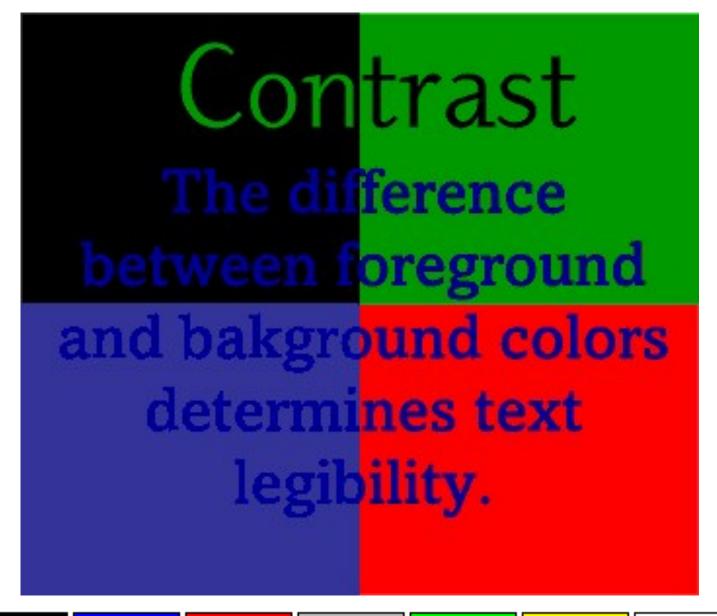
- Luminance (L\*), hue (H), saturation (S)
  - good for encoding
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- RGB: good for display hardware
  - poor for encoding & interpolation
- CIE LAB (L\*a\*b\*): good for interpolation
  - hard to interpret, poor for encoding
- HSL/HSV: somewhat better for encoding
  - hue/saturation wheel intuitive
  - beware: only pseudo-perceptual!
  - lightness (L) or value (V)  $\neq$  luminance (L\*)





## Color Constrast & Naming

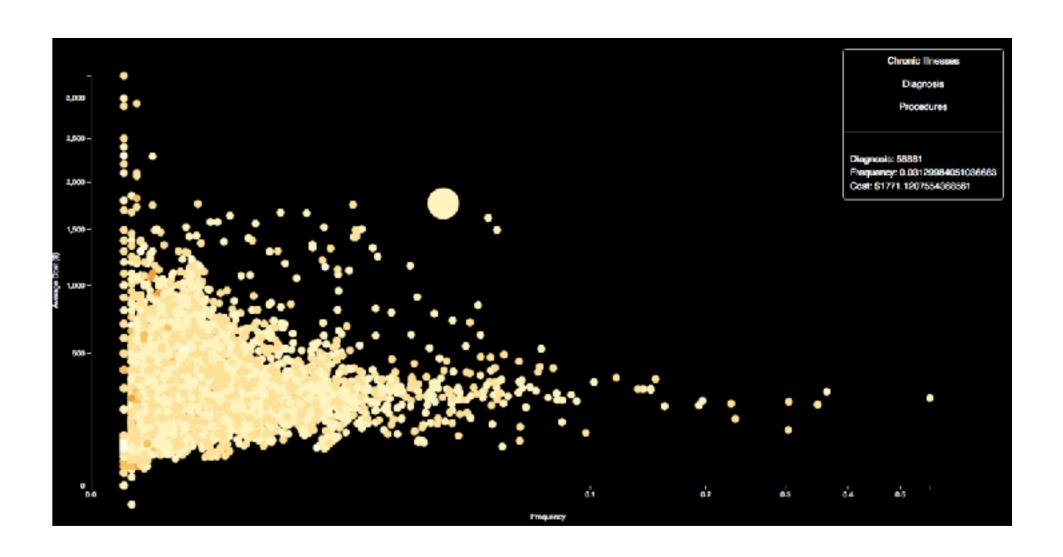
### Interaction with the background



	Hello	Hello	Hello	Hello	Hello	Hello
Hello		Hello	Hello	Hello	Hello	Hello
Hello	Hello		Hello	Hello	Hello	Hello
Hello	Hello	Hello		Hello	Hello	Hello
Hello	Hello	Hello	Hello		Hello	Hello
Hello	Hello	Hello	Hello	Hello		Hello
Hello	Hello	Hello	Hello	Hello	Hello	

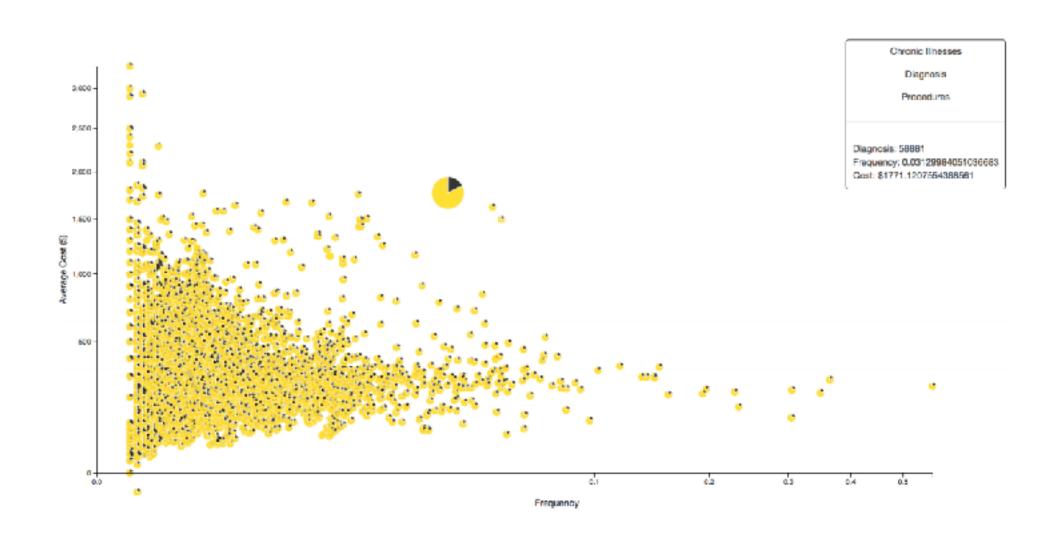
### Interaction with the background: tweaking yellow for visibility

• marks with high luminance on a background with low luminance



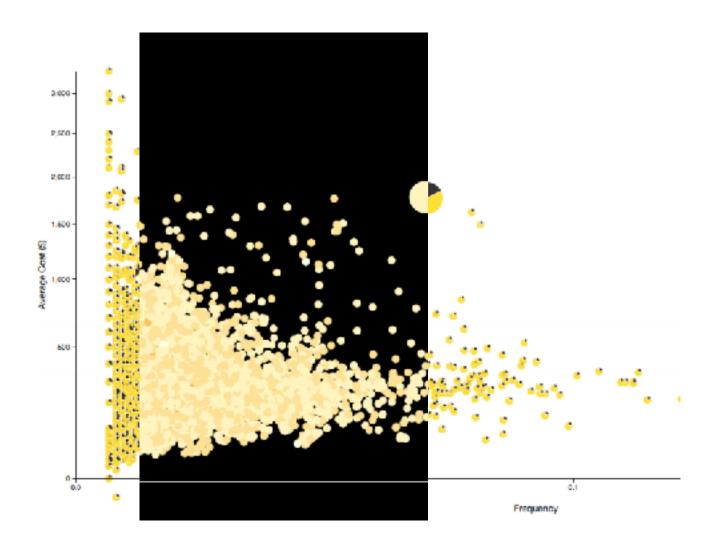
### Interaction with the background: tweaking yellow for visibility

• marks with medium luminance on a background with high luminance



#### Interaction with the background: tweaking yellow for visibility

• change luminance of marks depending on background



# Color/Lightness constancy: Illumination conditions

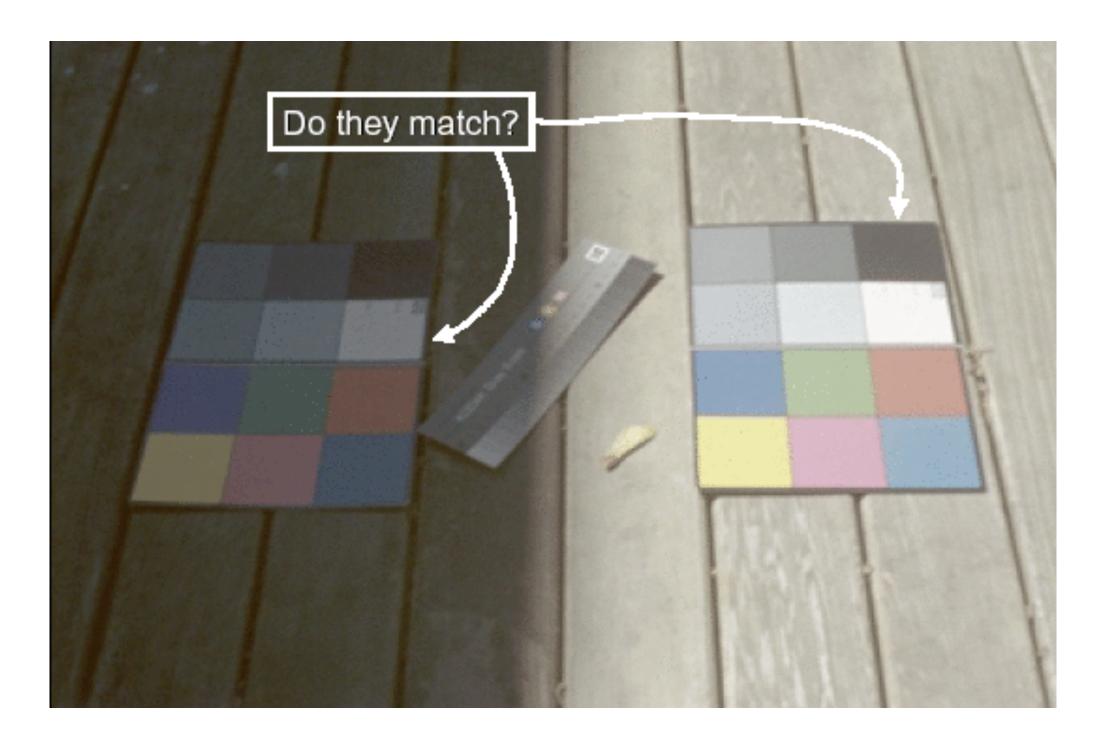


Image courtesy of John McCann via Maureen Stone

# Color/Lightness constancy: Illumination conditions

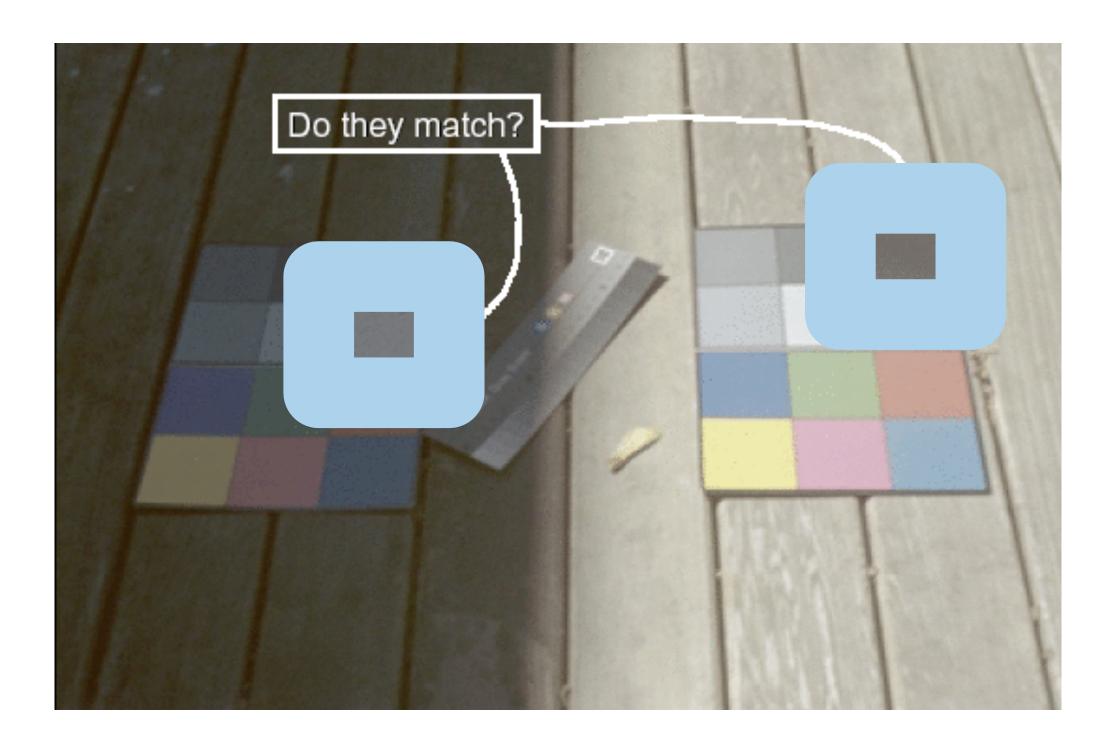
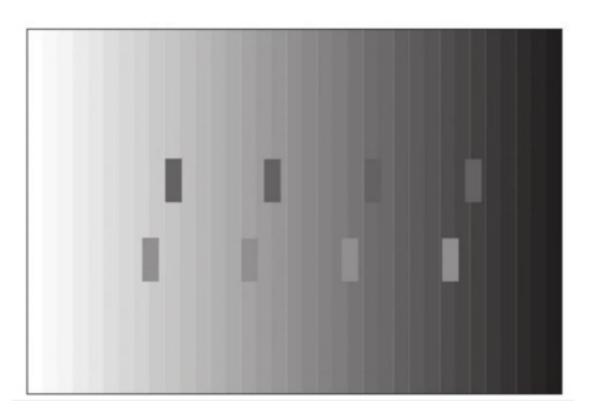


Image courtesy of John McCann via Maureen Stone

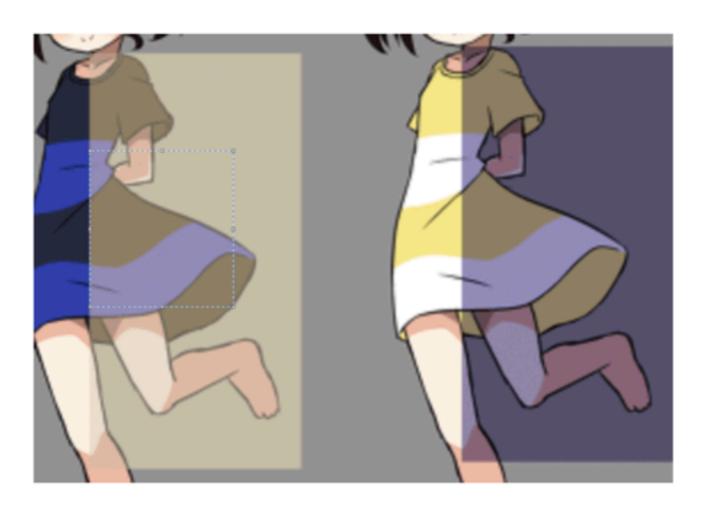
# Contrast with background





# Contrast with background



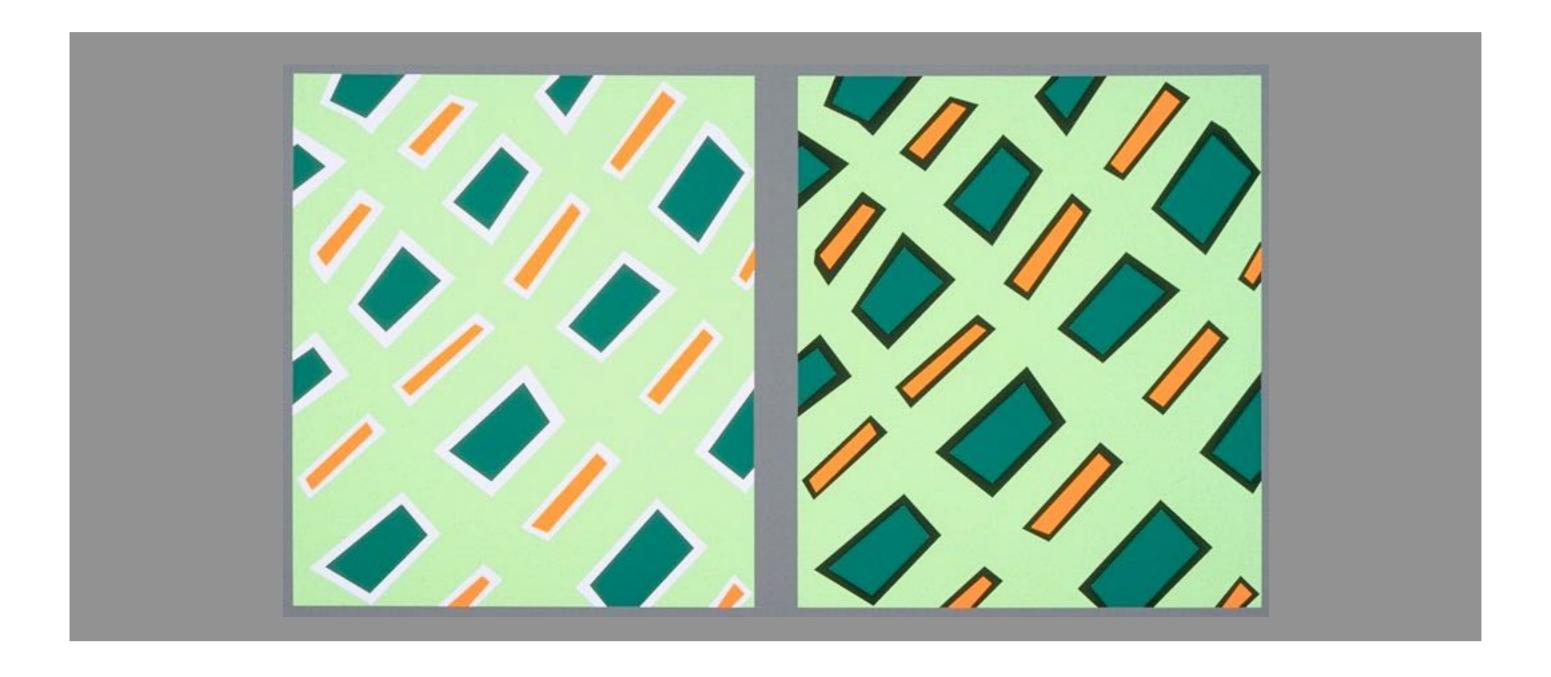


Black and blue? White and gold?

https://imgur.com/hxJjUQB

https://en.wikipedia.org/wiki/The\_dress

#### Bezold Effect: Outlines matter



#### Color Appearance

- given L, a\*, b\*, can we tell what color it is?
  - -no, it depends

- chromatic adaptation
- luminance adaptation
- simultaneous contrast
- spatial effects
- viewing angle
- •







Actual color names if you're a girl ...

Actual color names if you're a guy ...



- nameability affects
  - communication
  - memorability
- can integrate into color models
  - in addition to perceptual considerations

Actual color names if you're a girl ...

Actual color names if you're a guy ...



#### Color is just part of vision system

- Does not help perceive
  - Position
  - -Shape
  - Motion

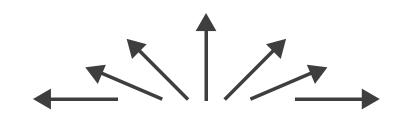
<del>-</del>

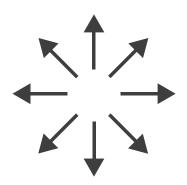
# Map Other Channels

#### Angle / tilt / orientation channel

different mappings depending on range used







Sequential ordered line mark or arrow glyph

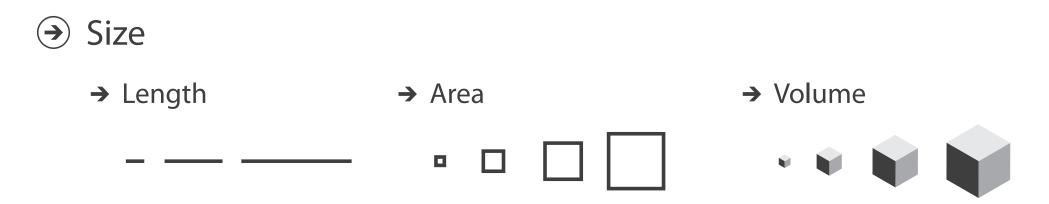
Diverging ordered arrow glyph

Cyclic ordered arrow glyph

- nonlinear accuracy
  - high: exact horizontal, vertical, diagonal (0, 45, 90 degrees)
  - -lower: other orientations (eg 37 vs 38 degrees)

# Map other channels

- size
  - -aligned length best
  - -length accurate
  - -2D area ok
  - -3D volume poor



#### Map other channels

- size
  - -aligned length best
  - -length accurate
  - -2D area ok
  - -3D volume poor
- shape
  - -complex combination of lower-level primitives
  - -many bins

- Size
  - → Length
- → Area
- → Volume

















#### Map other channels

- size
  - -aligned length best
  - –length accurate
  - -2D area ok
  - -3D volume poor
- shape
  - complex combination of lower-level primitives
  - -many bins
- motion
  - highly separable against static
    - great for highlighting (binary)
  - -use with care to avoid irritation

- Size
  - → Length
- → Area
- → Volume



Shape



- Motion
  - → Motion Direction, Rate, Frequency, ...



# Spectral sensitivity to luminance

