CS-5630 / CS-6630 Uisualization for Data Science Perception

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Perception

Identification and interpretation of sensory information

From the physical stimulus to recognizing information

Shaped by learning, memory, expectation

Cognition

The processing of information, applying knowledge

Hear someone speak: Perception

Understand the language and the words: Cognition

Perception vs. Cognition

Perception

Eye, optical nerve, visual cortex

Basic perception

First processing

(edges, planes)

Not conscious

Reflexes

Cognition

Recognizing objects

Relations between objects

Conclusion drawing

Problem solving

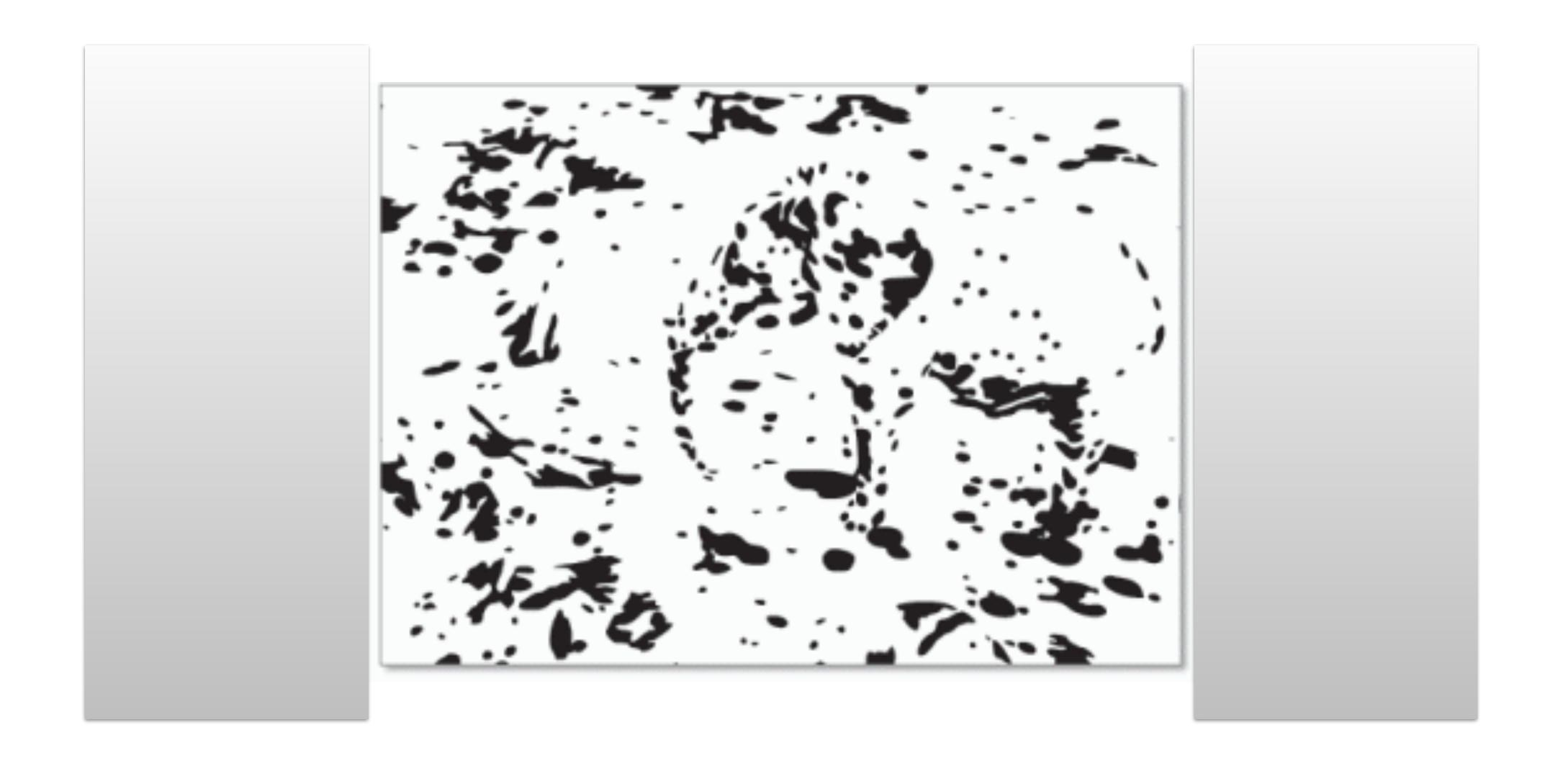
Learning, ...

YELLOW RED ORANGE BLUE WHITE BLUE WHITE YELLOW ORANGE BLUE GREEN BROWN BLUE YELLOW GREEN PINK BLUE YELLOW GREEN RED

What is There vs. What do we See



Emergence Images. perceptual hysteresis



Looking only at patches doesn't work

http://graphics.stanford.edu/~niloy/research/emergence/emergence_image_siga_09.html

Our perception is based on priors

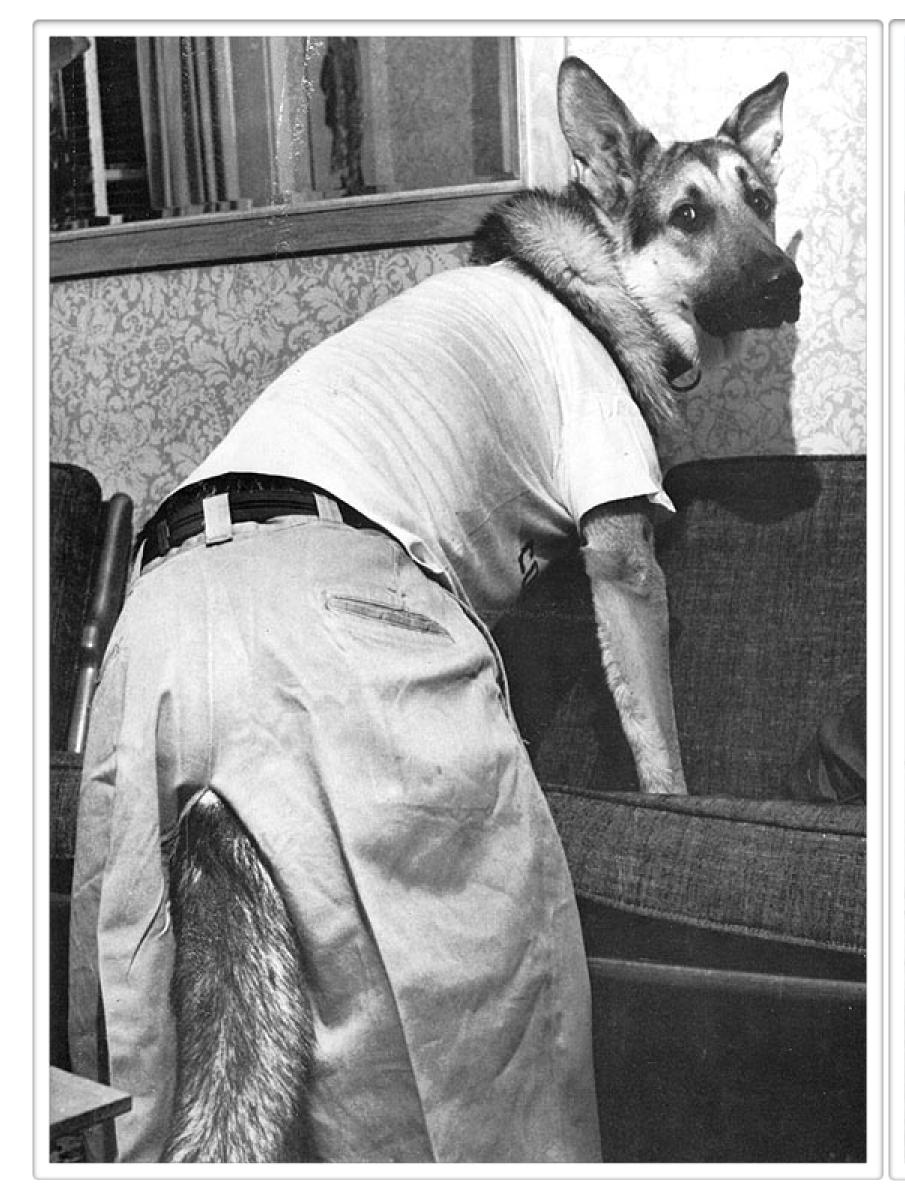
We have a model of the world

We try to fit what we see into this model.





we rely on priors







Pareidolia



Faces in Things @FacesPics · Mar 9
These chairs have seen some terrible things pic.twitter.com/Gjlc9wuP47





Faces in Things @FacesPics · Feb 14

Deep in thought Deep Fryer pic.twitter.com/1Qyqjmslka



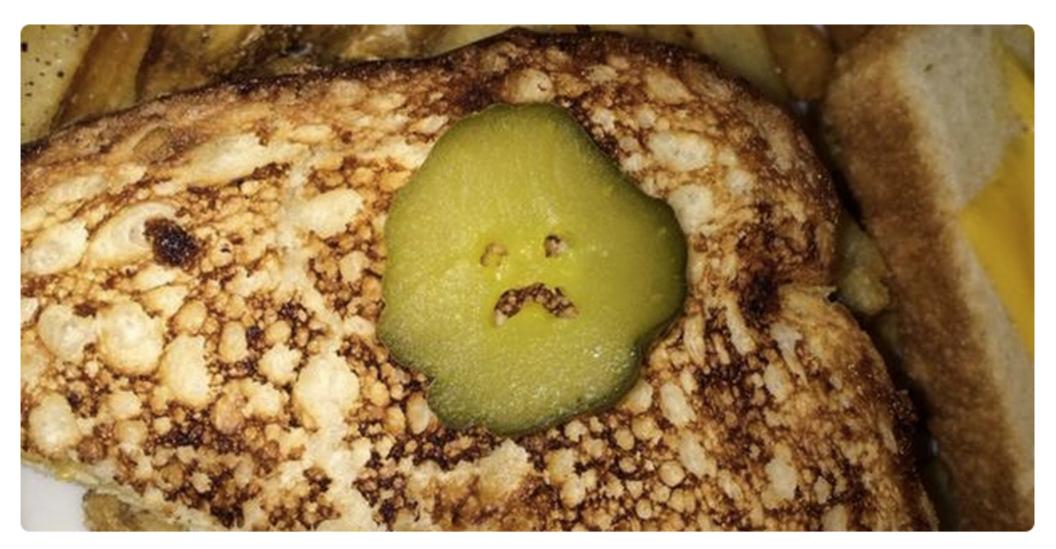


Faces in Things @FacesPics · Mar 22
Hey little guy! pic.twitter.com/nt2BgwZeTR





Faces in Things @FacesPics · Mar 10
A terrified pickle pic.twitter.com/Ffph1wzTyv



Take Home Point

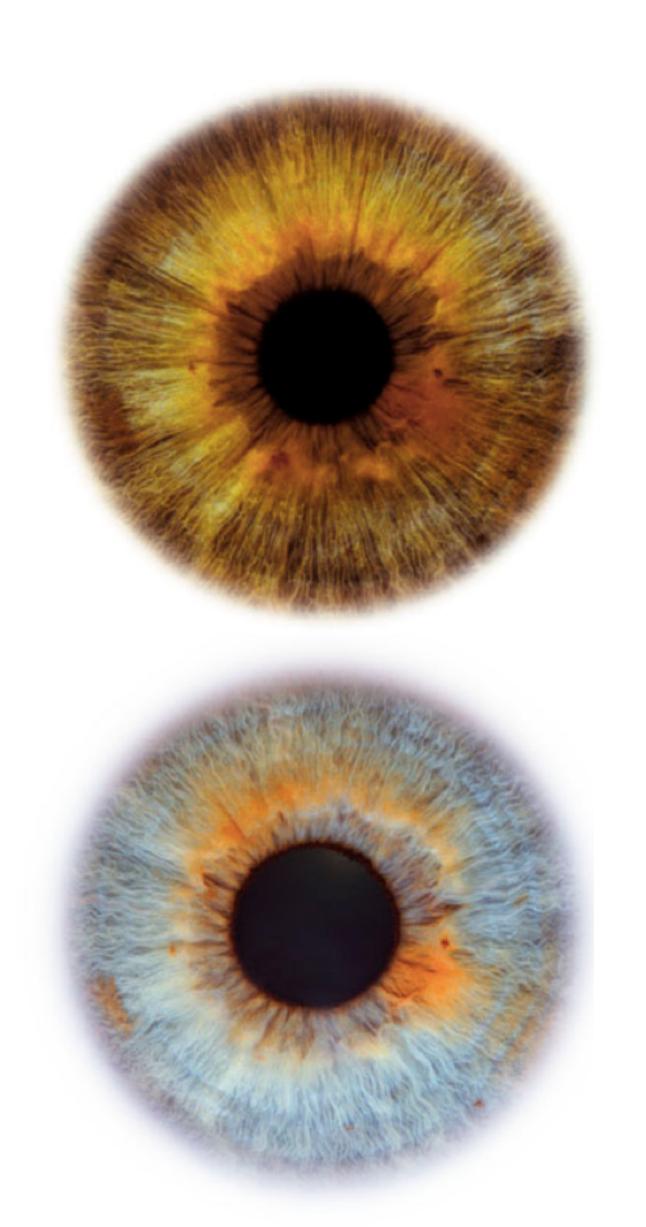
Vision is "constructed" top down from the input

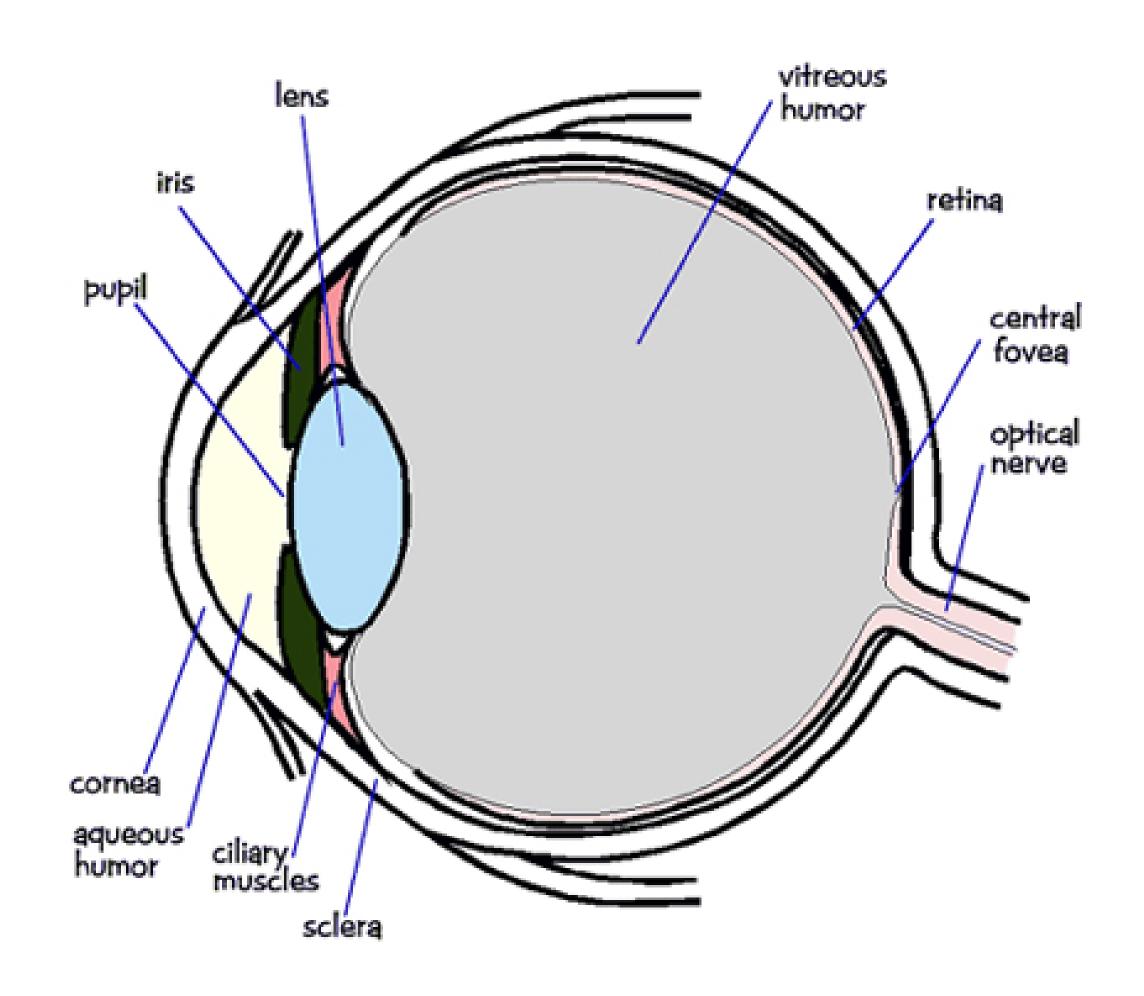
"What you see when you see a thing depends on what the thing is. What you see the thing as depends on what you know about what you are seeing."

Zenon Pylyshyn Canadian Cognitive Scientist and Philosopher









Human Visual System

5-6 mio cones

color vision

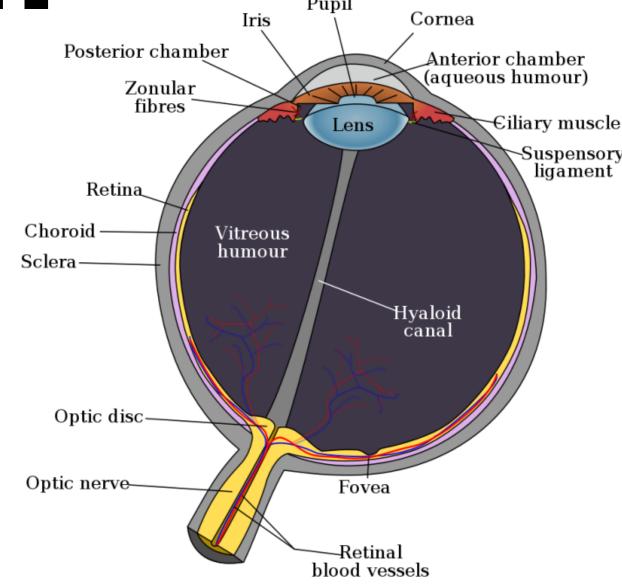
dense in the center

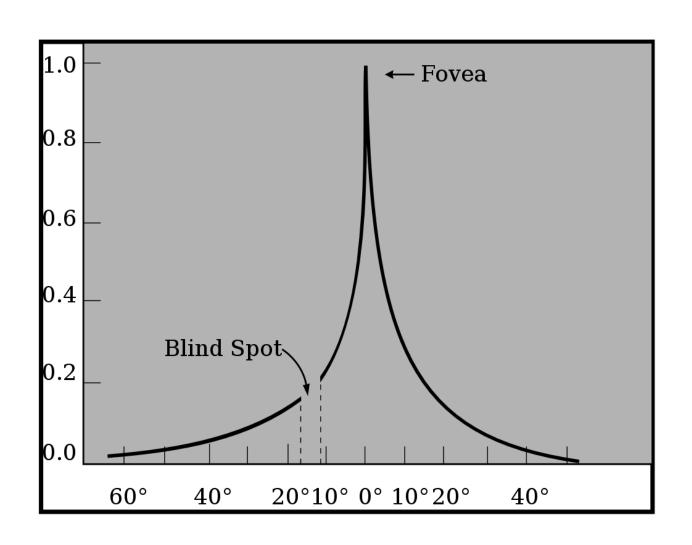
Fovea: 27 times the density

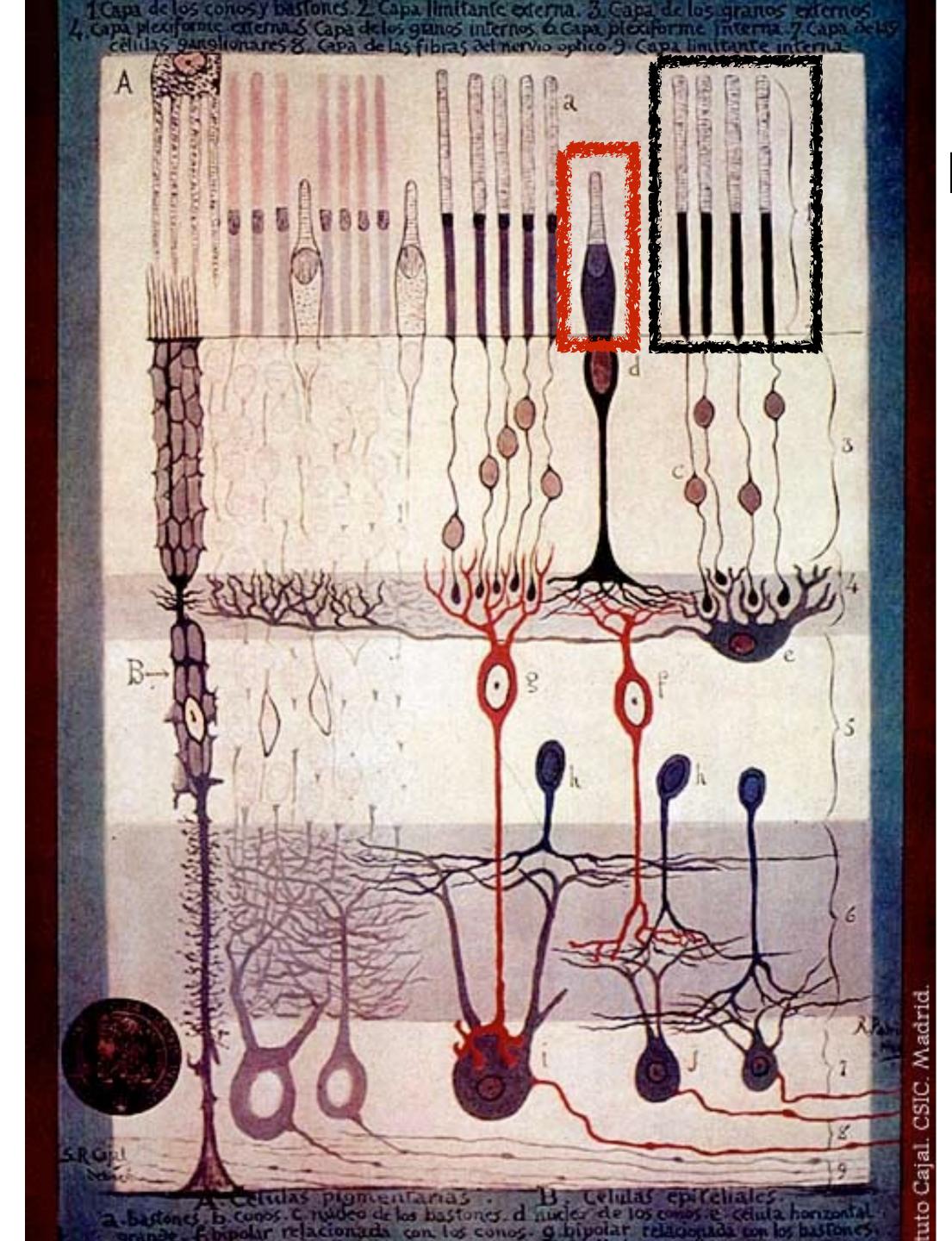
responsible for sharp central vision only cone cells

~120 mio rods

black/white





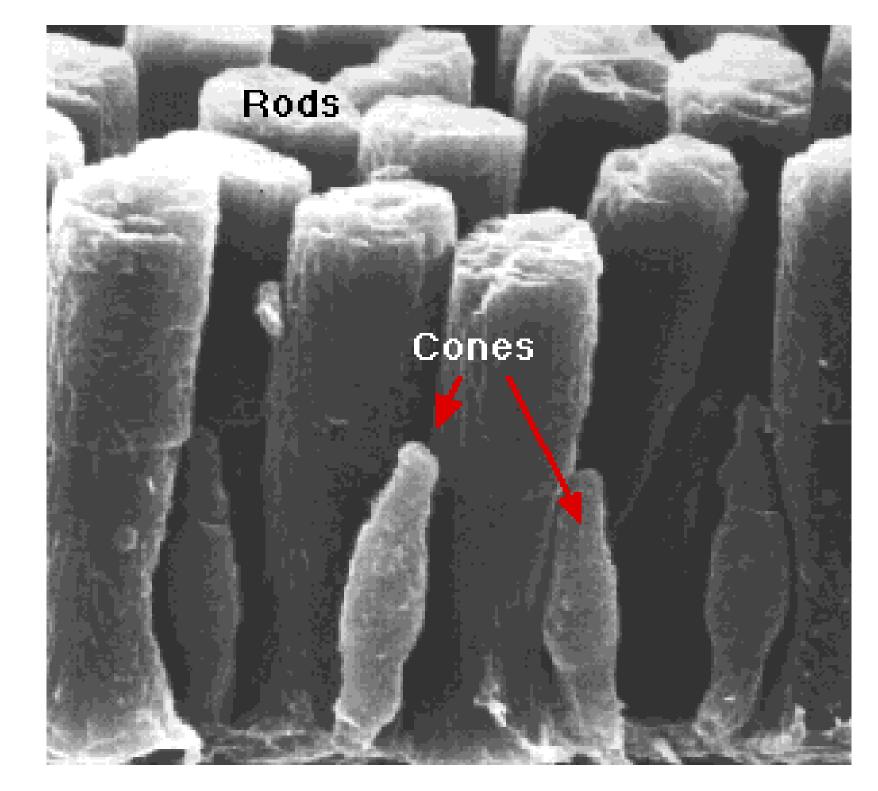


Rods - sensitive black and white

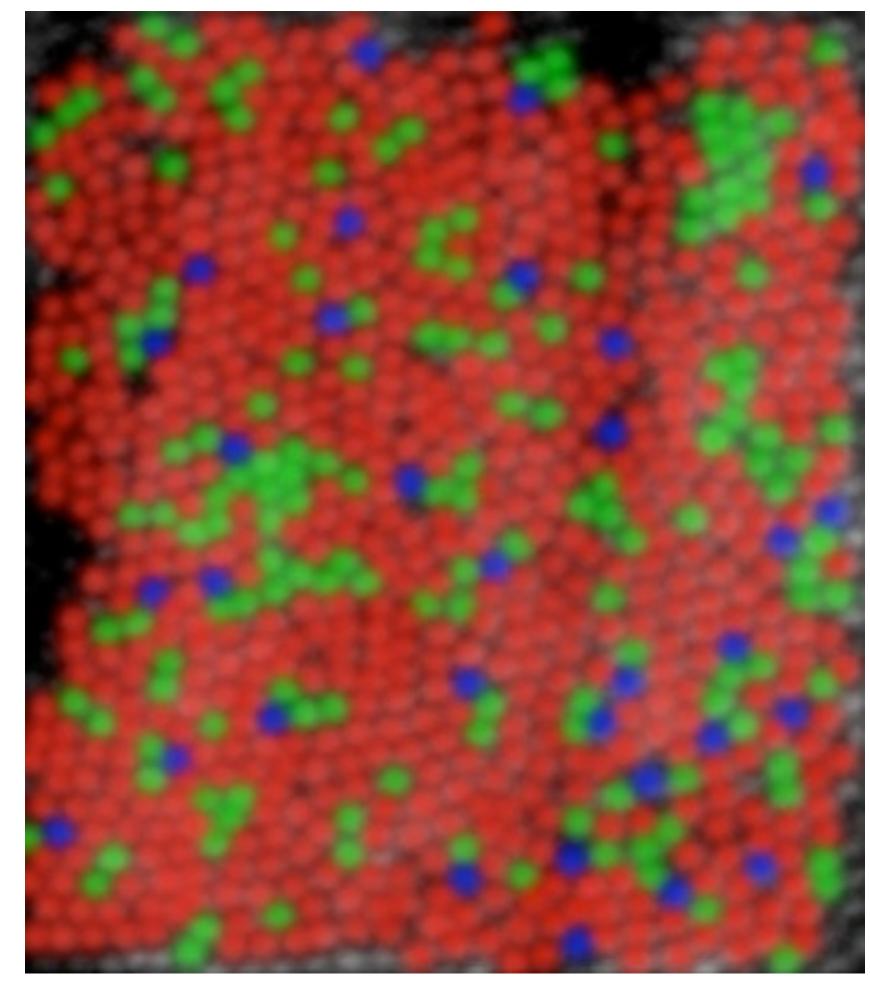
Cones - color vision

Ganglion Cells

"Structure of the Mammalian Retina" c. 1900 By Santiago Ramon y Cajal

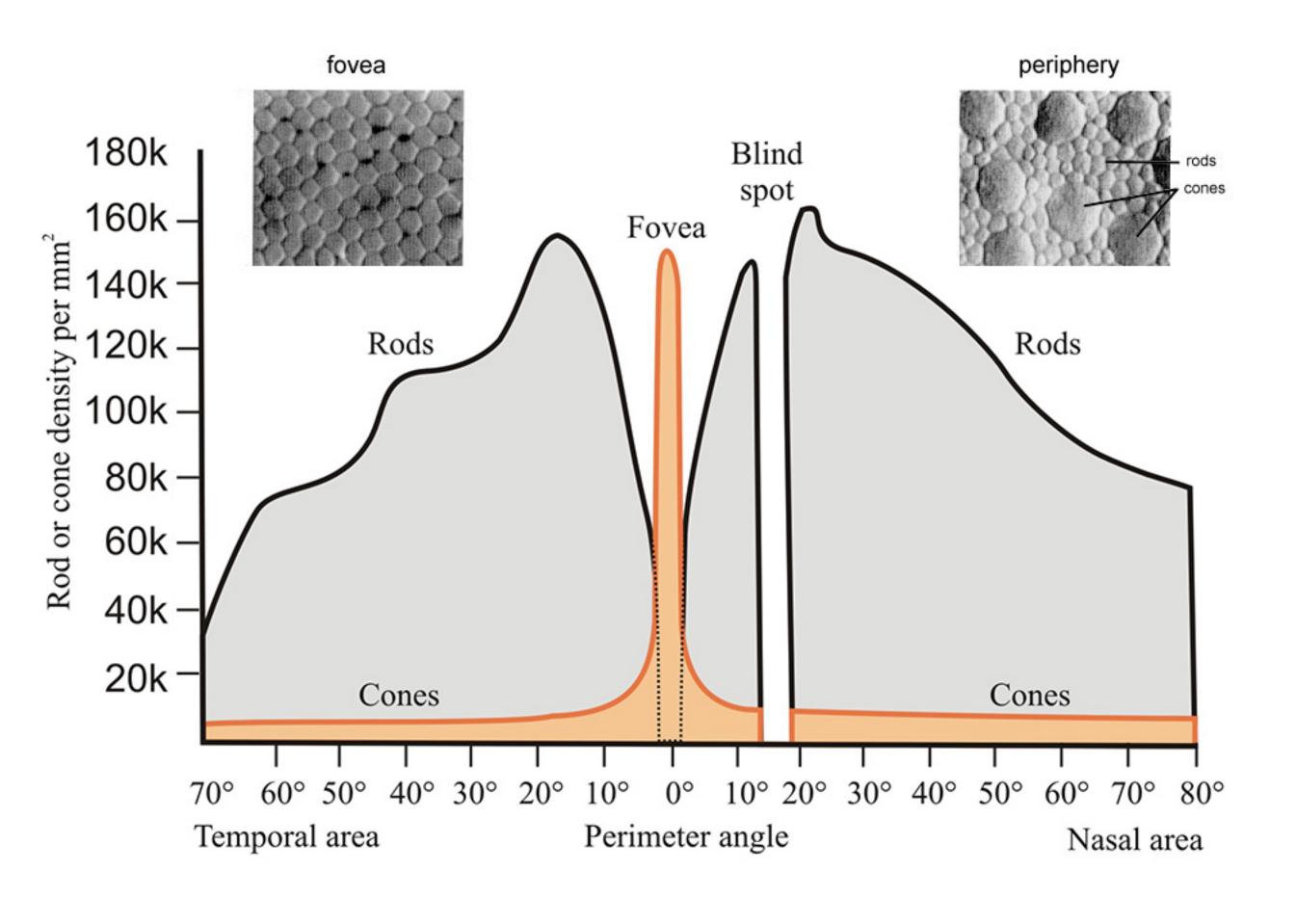


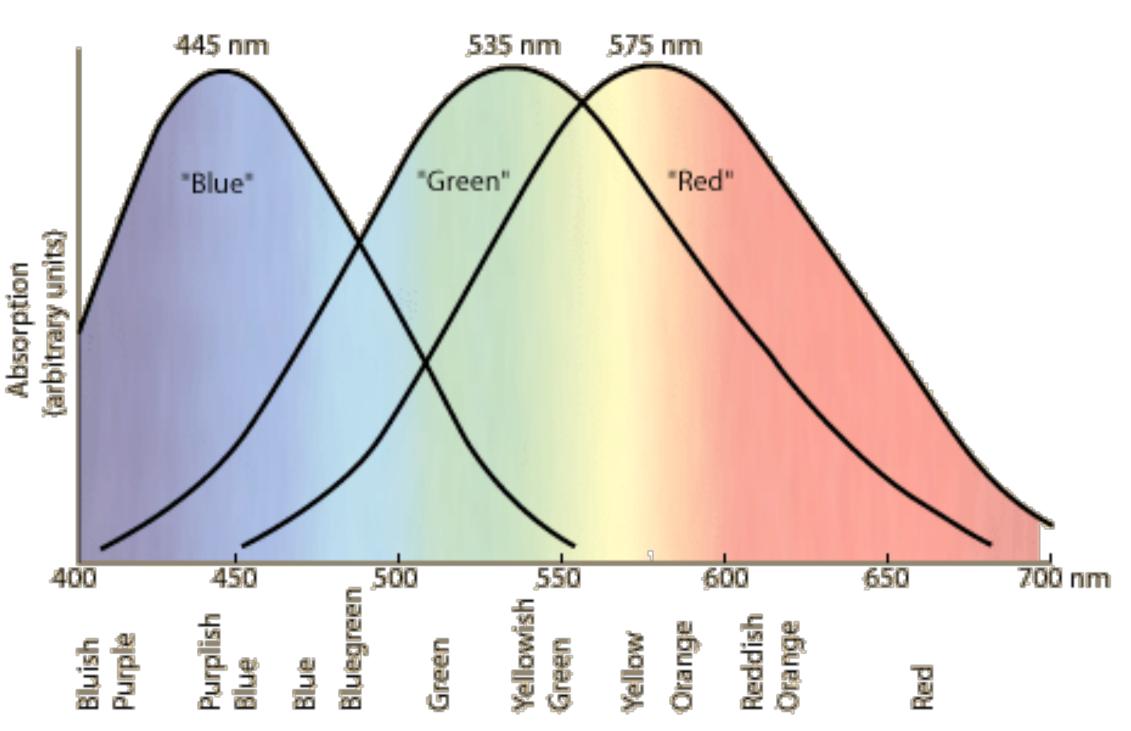
~120 million rods ~5-6 million cones

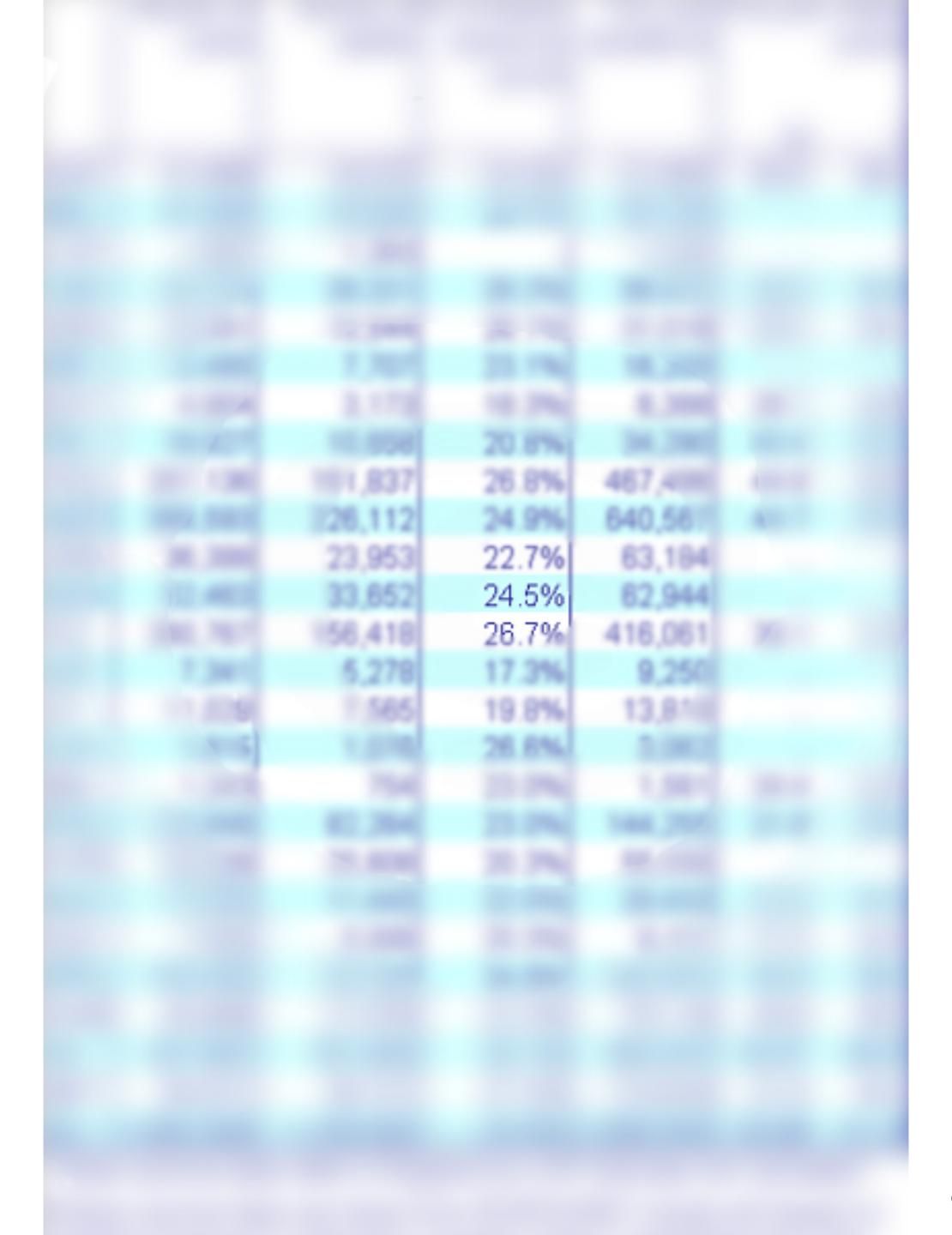


R 63% - G 31% - B 6%

Cone Response







Human Visual System

Vision works as sequence of fixations and saccades

fixations: maintaining gaze on single location (200-600 ms)

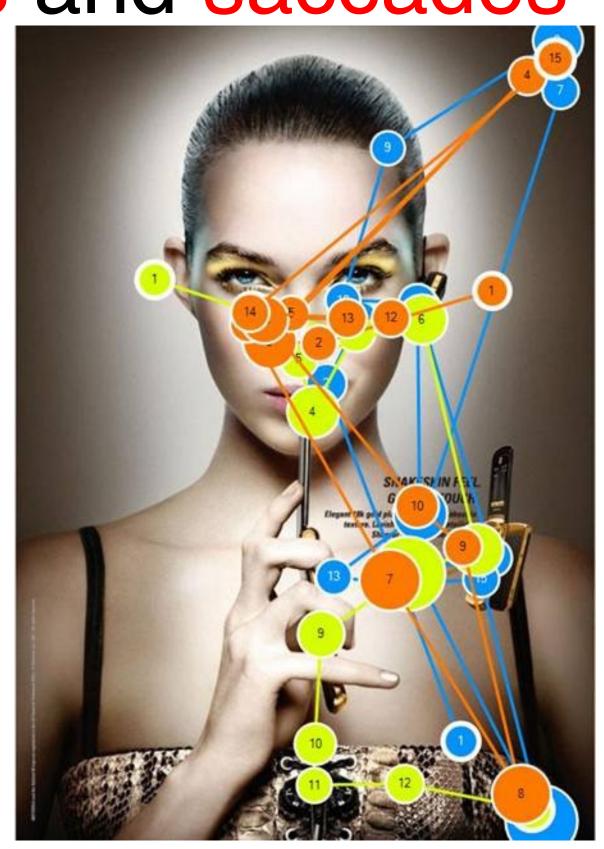
saccades: moving between different

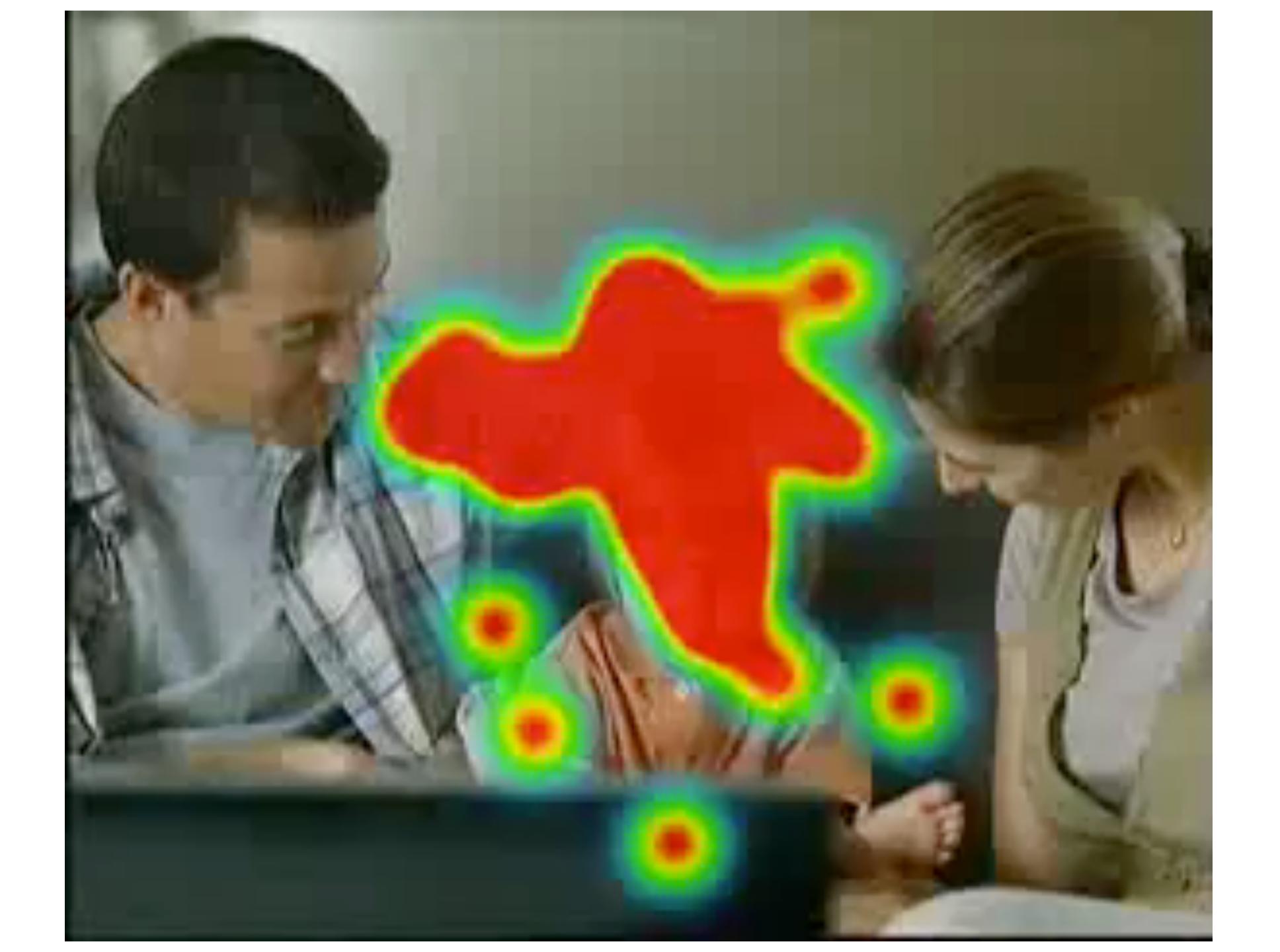
locations (20-100 ms)

Vision not similar to a camera

More similar to a dynamic and ongoing construction project







Eye-tracking Experiment

Eye-tracking control computer

The computer of the co

Visualization display

Infrared camera







Video!

SensoMotoric Instruments presents

Karaoke

Gaze Tracking and User Observation

Human Visual System

No general purpose vision

What we see depends on our goals and expectations

Relative judgments: strong

Absolute judgments: weak



Apparent position of person A

Apparent shape of room Viewing peephole

apparent position

Actual position of

Ames Room

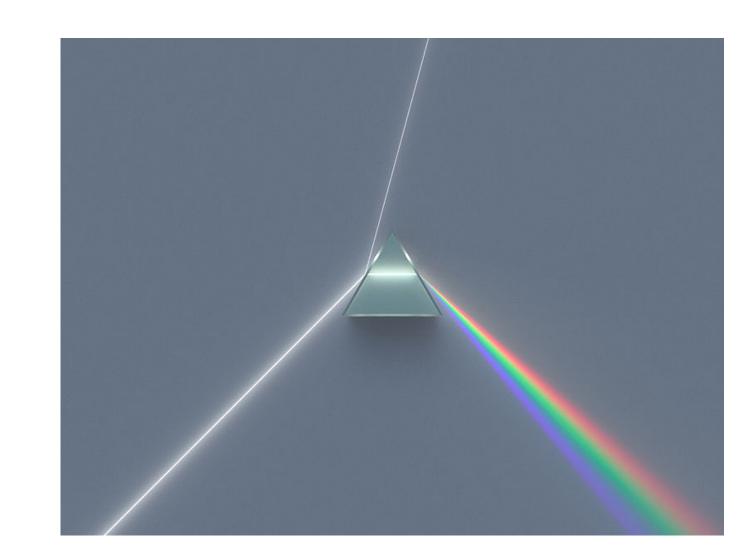


Color

Color Basics

Visible part of the electromagnetic spectrum

390-750 nm

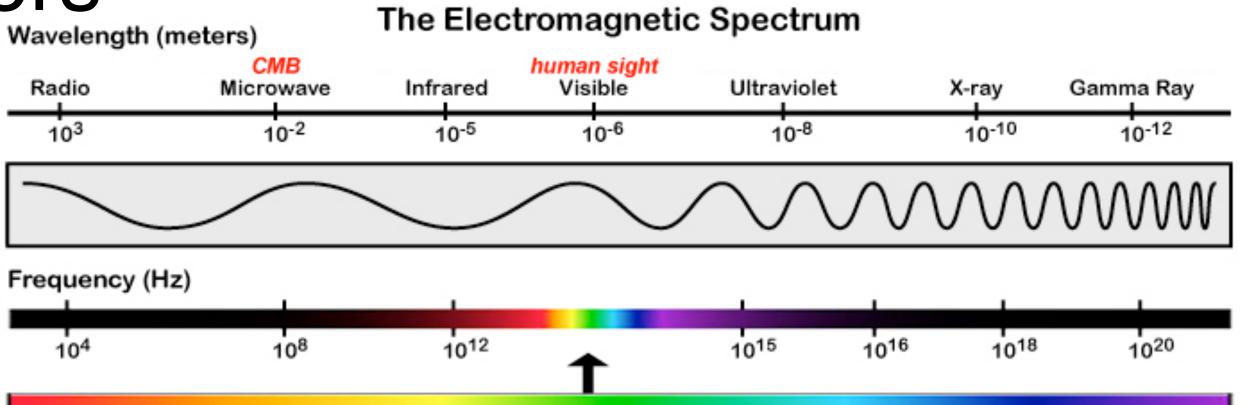


Spectral colors

evoked by a single wavelength (monochromatic colors, rainbow colors), e.g., red, orange, yellow, green, blue, and violet

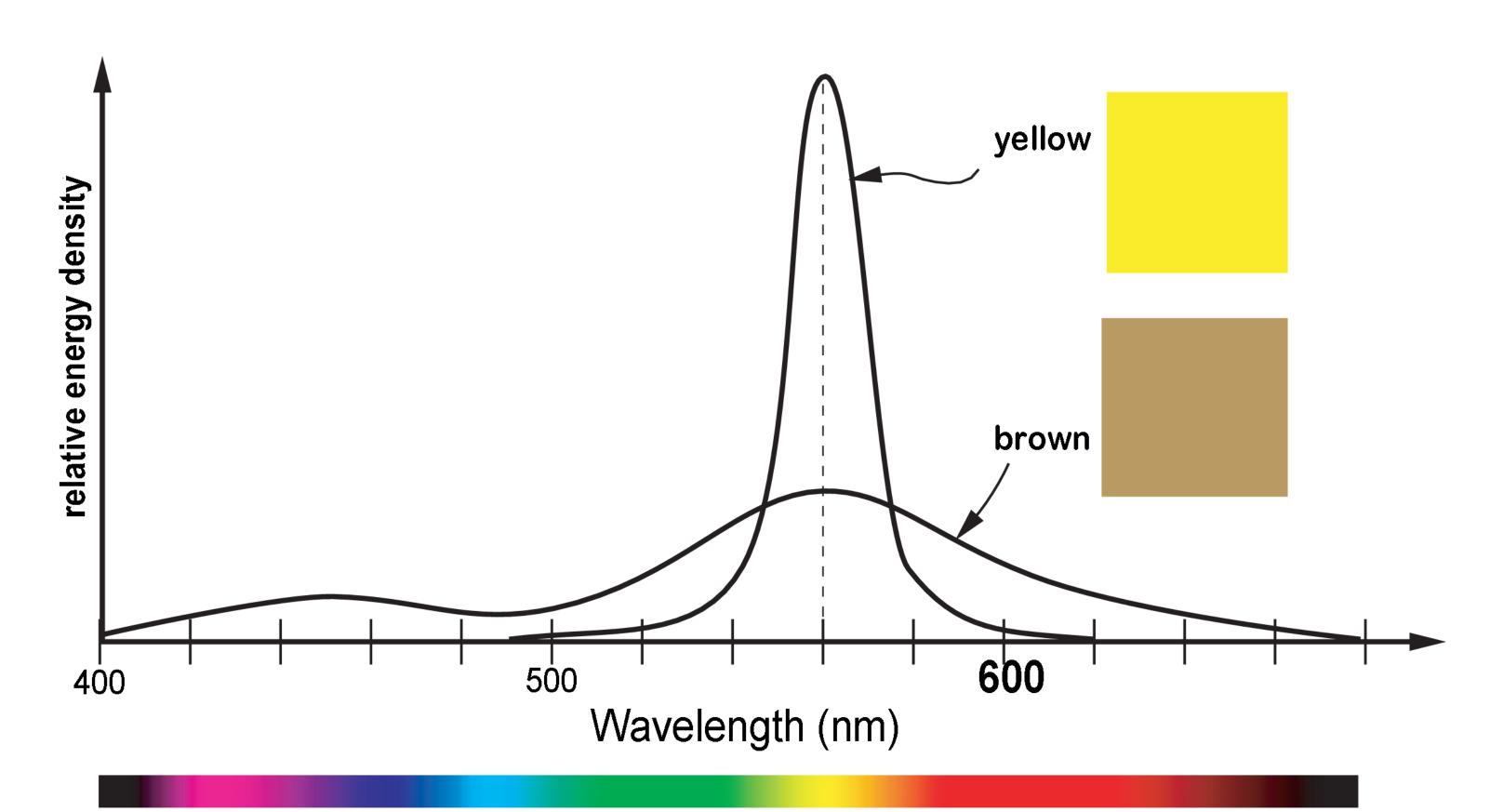
Other colors: unsaturated colors

Mix of multiple wavelengths e.g. purple, magenta, gray scale (achromatic colors) including white

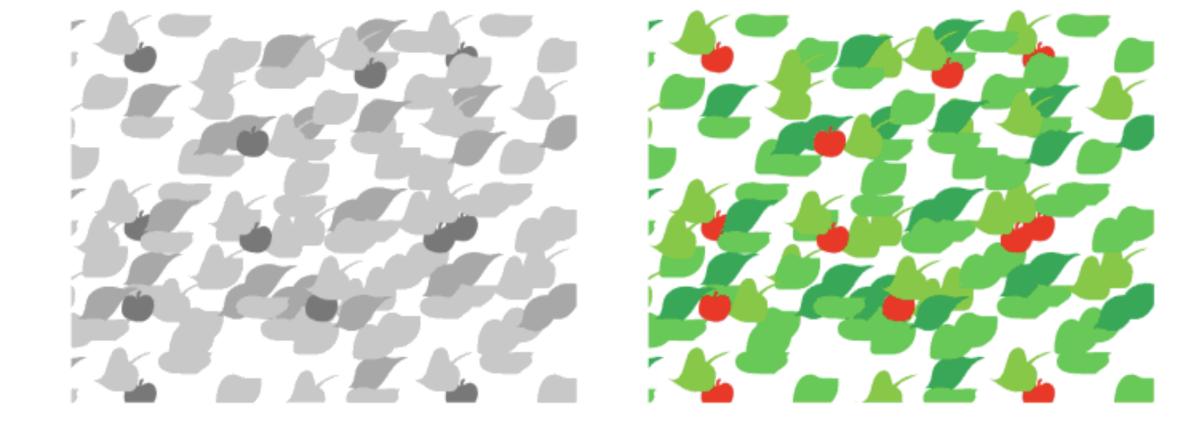


color!= wavelength

but rather, a combination of wavelengths and energy



Color



Color vision is irrelevant to much of normal vision!

does not help to perceive layout of objects

how they are moving

what shape they are

Color breaks camouflage

Tells about material properties (judging quality of food)

Dimensions of Color

Hue

Saturation

The purity of a color

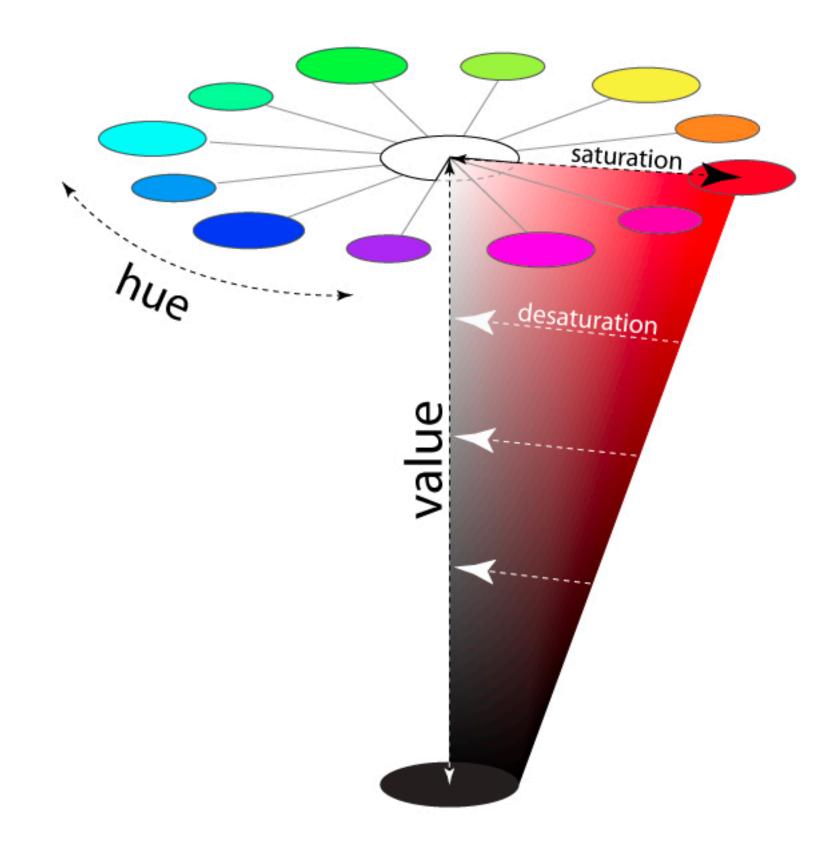
When thinking of pigments: no white/black is added

When thinking of light: what's the ratio of dominant wavelength to others

Value (Luminance, Brightness)

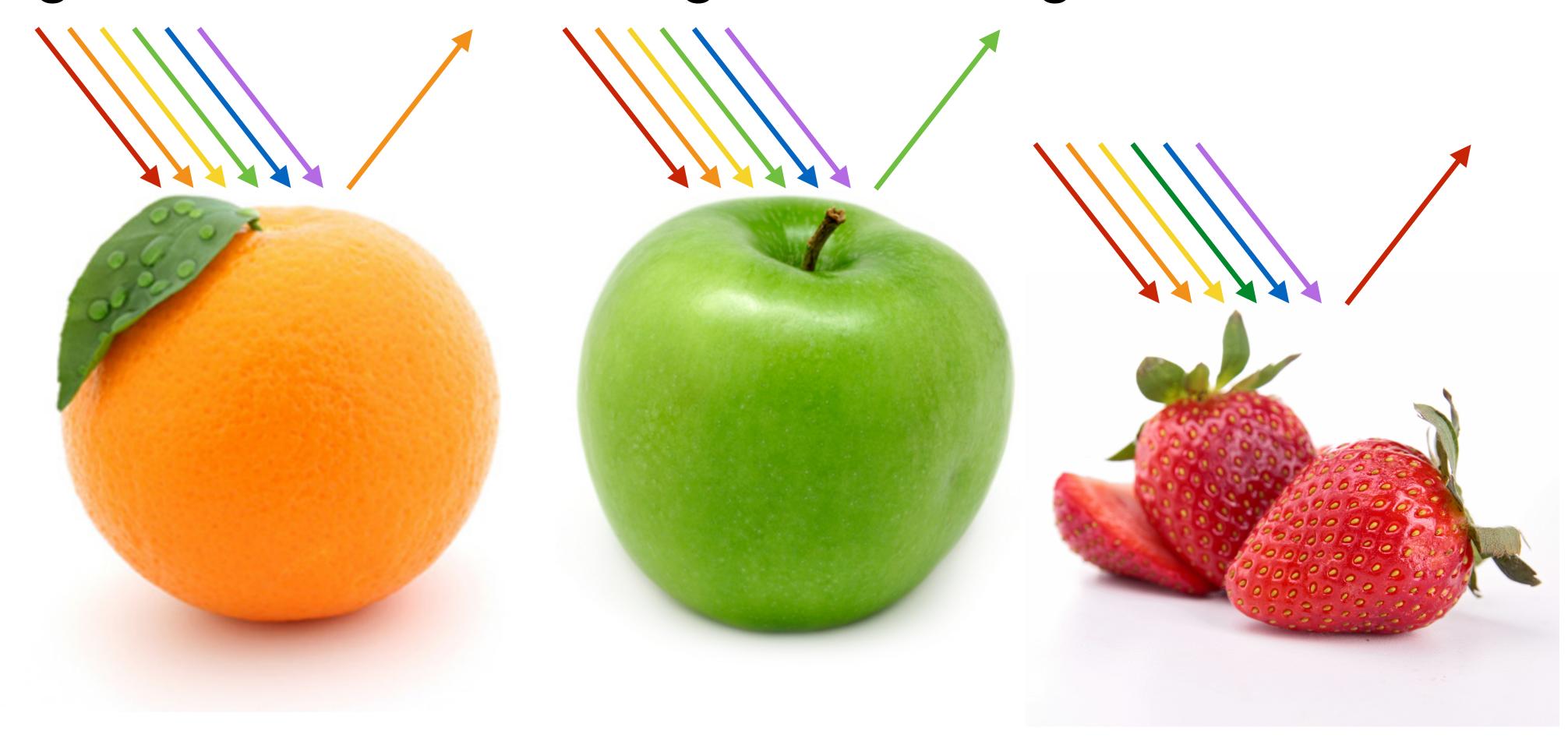
lightness or darkness of a color, i.e., the overall intensity of light





The role of objects

real light is more than a single wavelength:





Hello

9-Volt Nirvana

Roadways You Can Install Like Throw Rugs

poetry out of the heavens.

Jonah Lehrer restores some of the lost magic by way of

https://www.wnycstudios.org/story/211178-rip-rainbow/

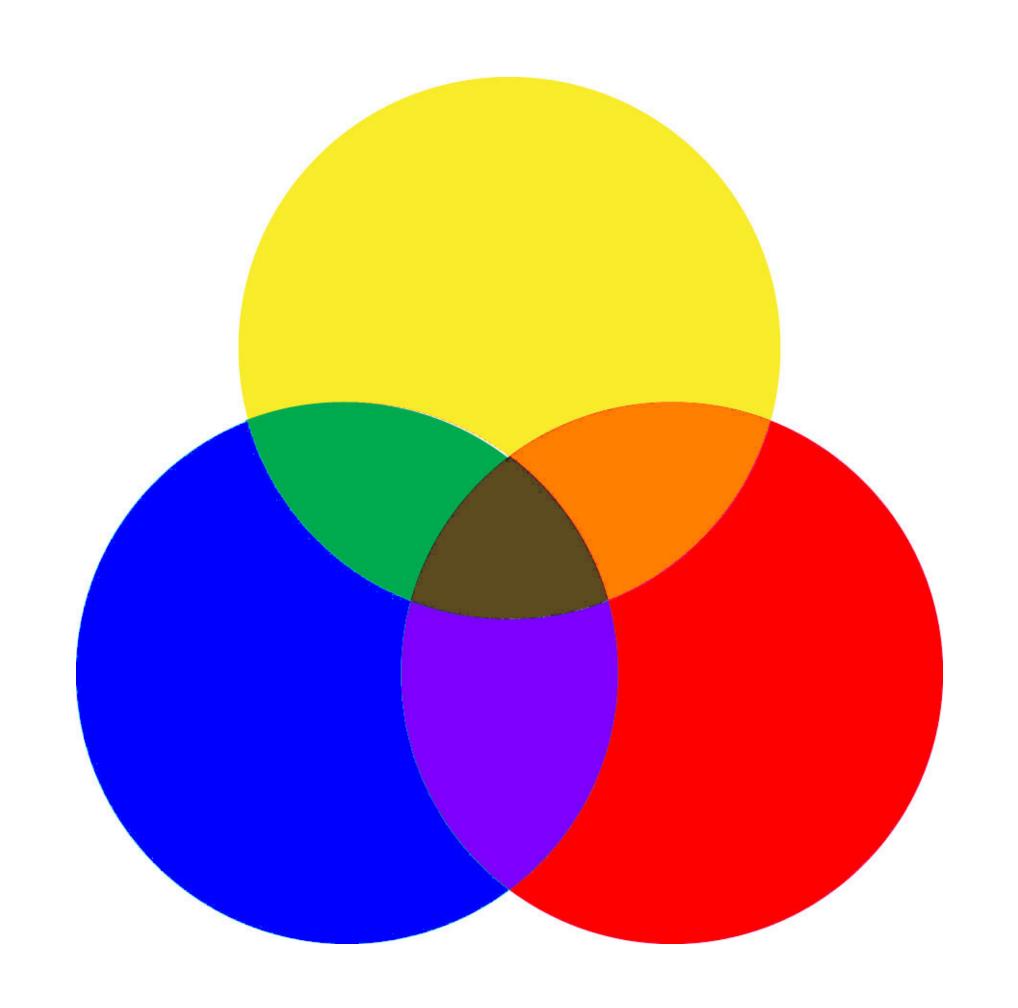
https://www.wnycstudios.org/ story/rippin-the-rainbow-an-evennewer-one/

What are the primary colors?

- 1. red, green, blue
- 2. red, yellow, blue
- 3. orange, green, violet
- 4. cyan, magenta, yellow
- 5. all of the above

Paint mixing

physical mixing of opaque paints primary: Red, Yellow, Blue secondary (mixed): Green, Orange, Purple subtractive



Inkmixing

subtractive mix of transparent inks

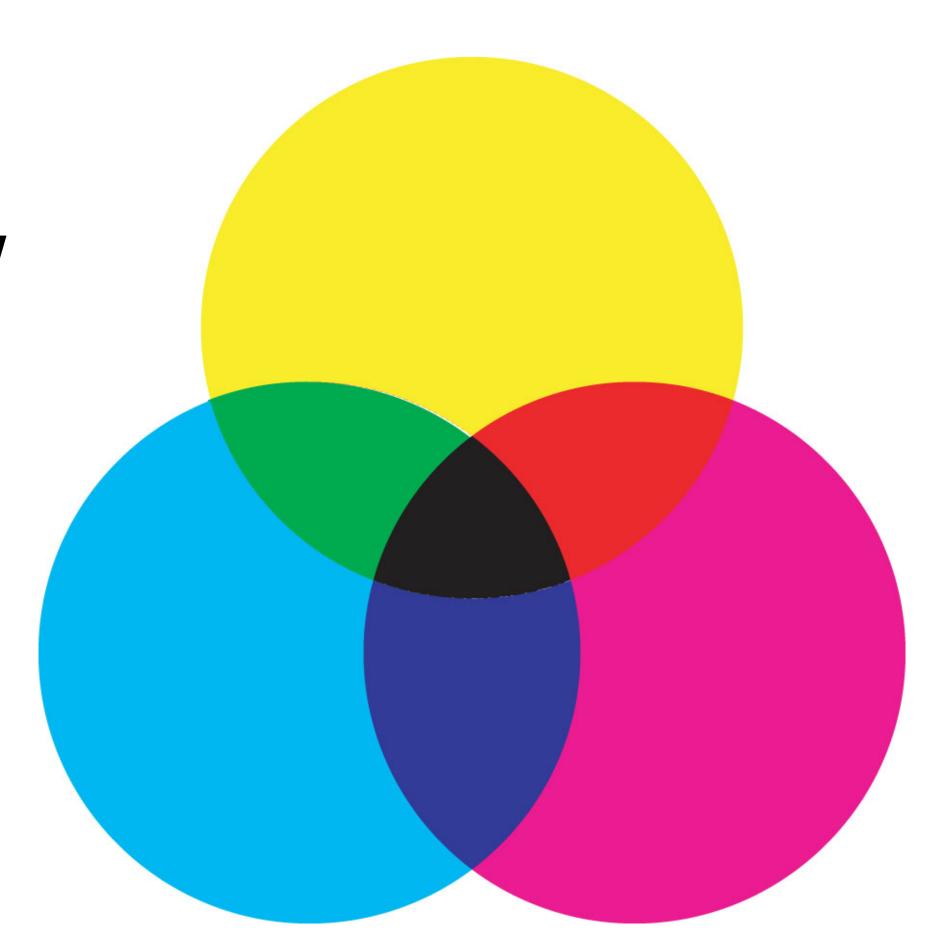
primary: Cyan, Magenta, Yellow

secondary: RGB

approx. black = C+M+Y

true black = C+M+Y+K

subtractive



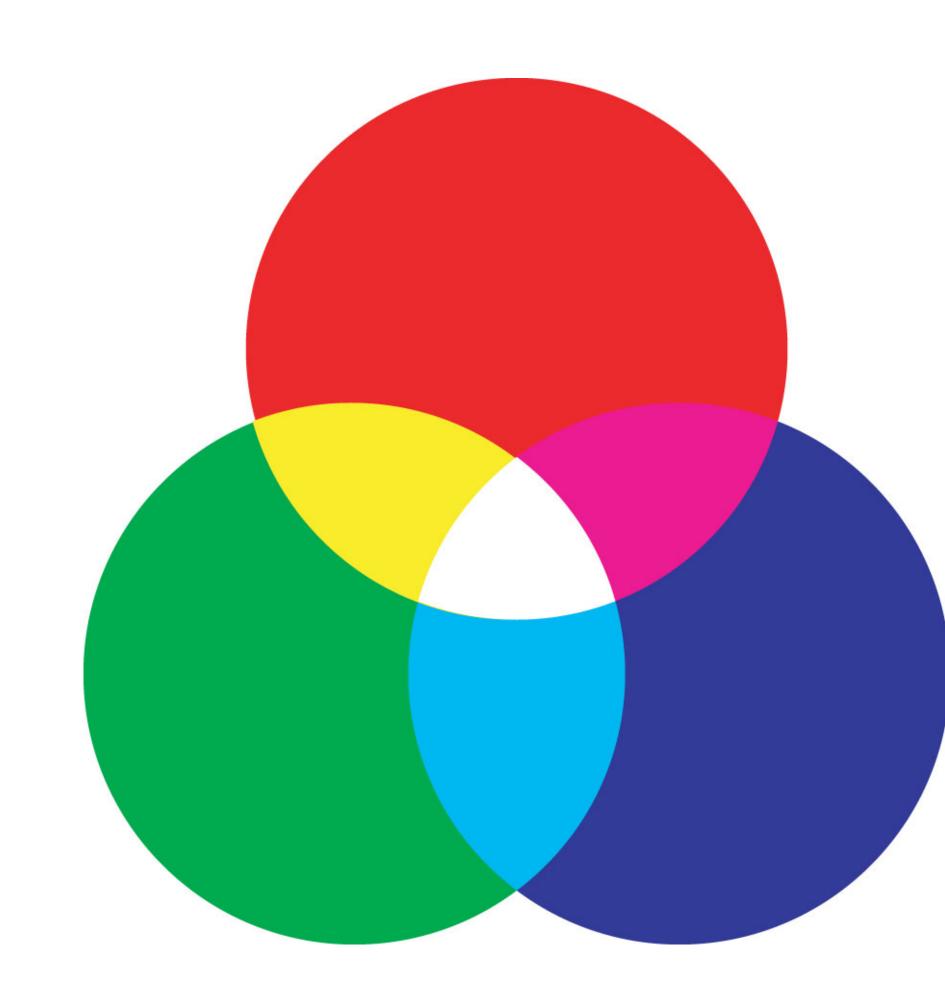
Light mixing

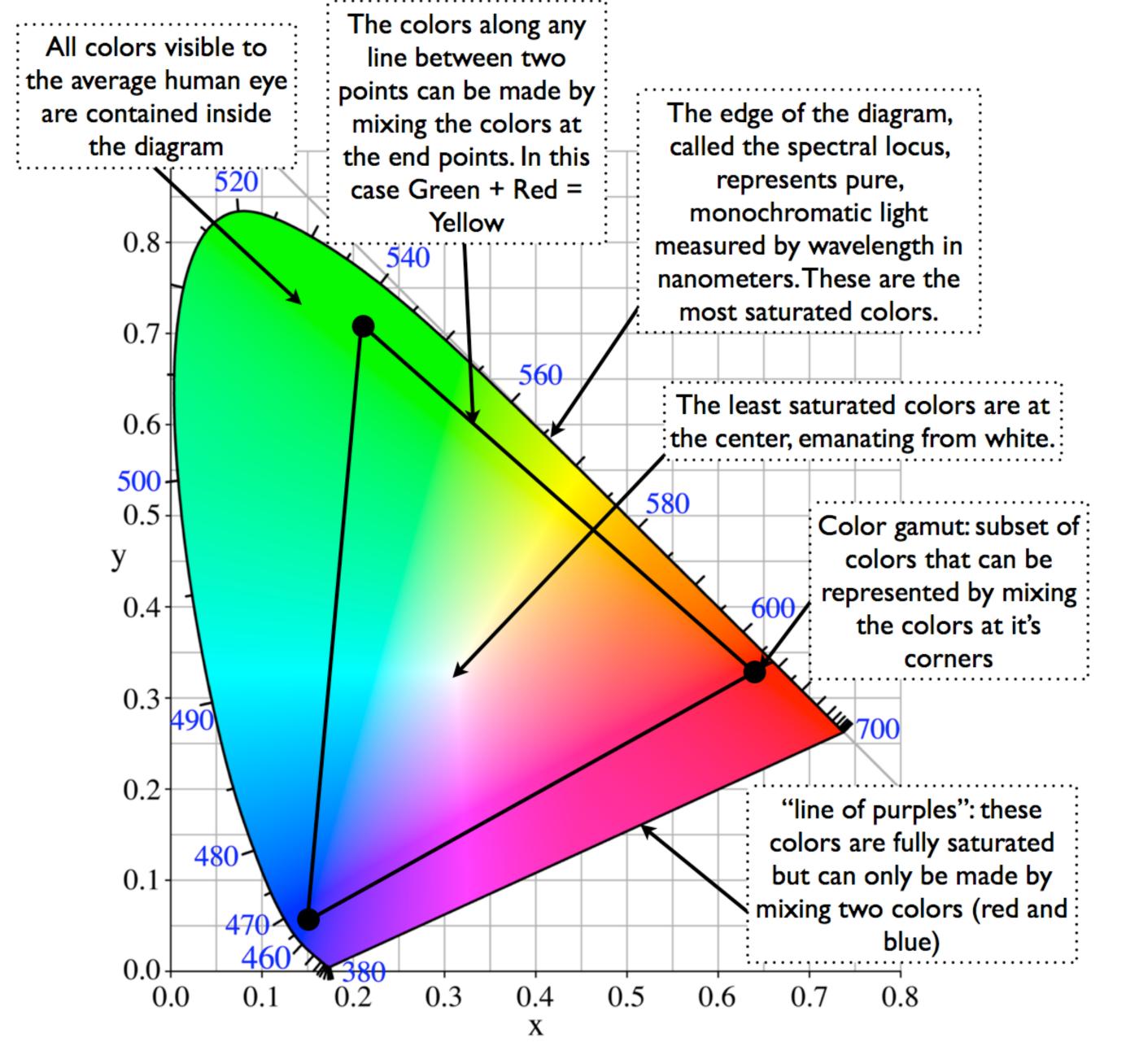
additive mix of colored lights

primary: Red, Green, Blue

secondary: Cyan, Magenta, Yellow

additive





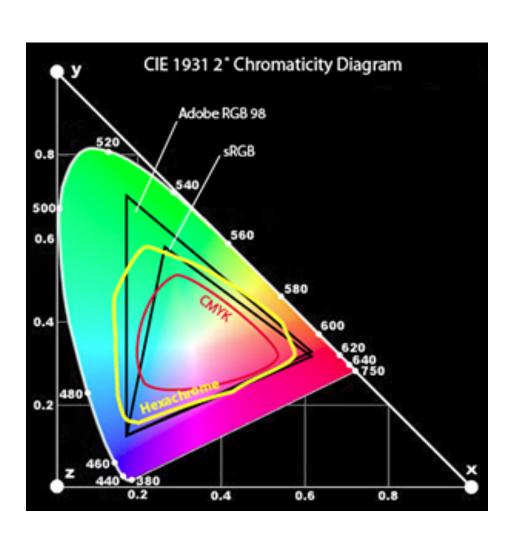
Anatomy of a CIE Chromaticity Diagram

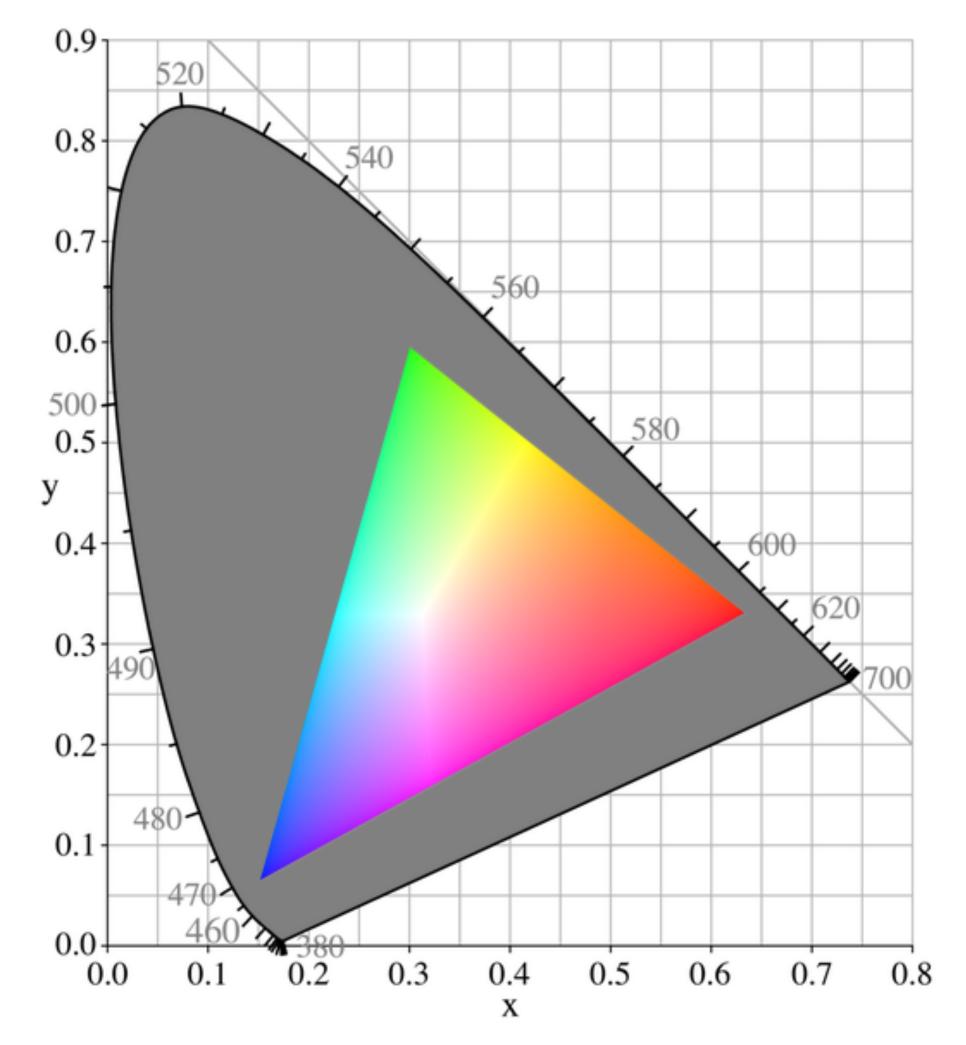
Gamut

Set of all colors that can be produced by a device

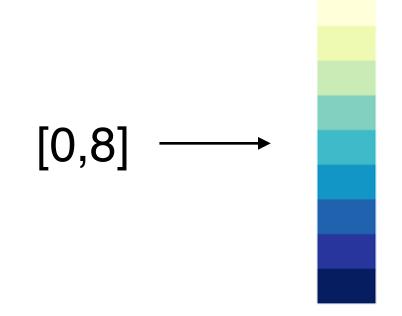
Area between the primary colors used can be shown

Primaries are arbitrary





What is a colormap?



specifies a mapping between color and values

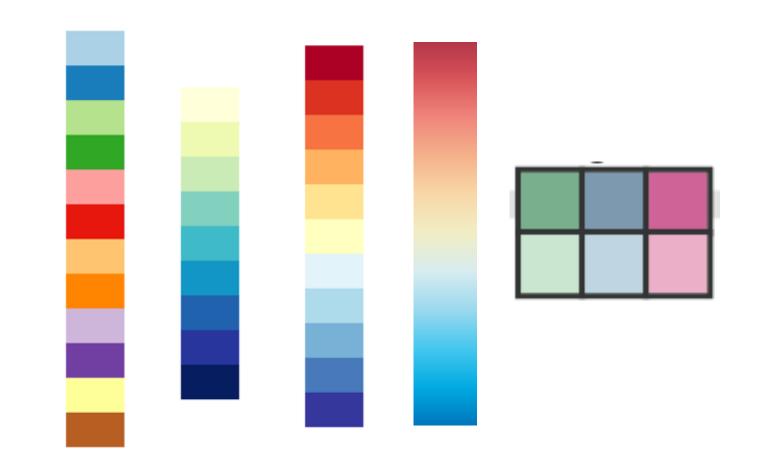
categorical vs ordered

sequential vs diverging

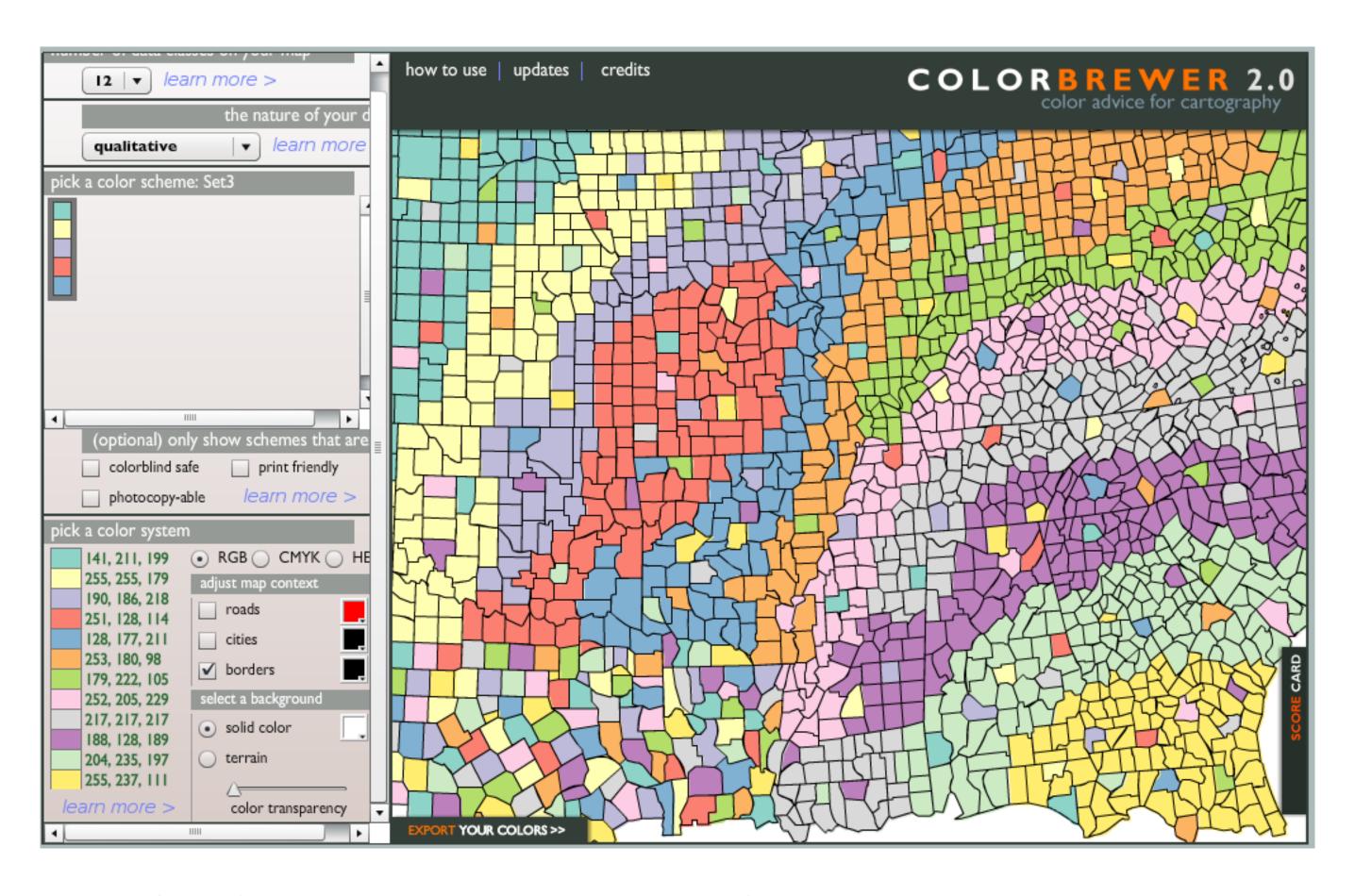
segmented vs continuous

univariate vs bivariate

expressiveness: match colormap to attribute characteristics!



Application: Labeling

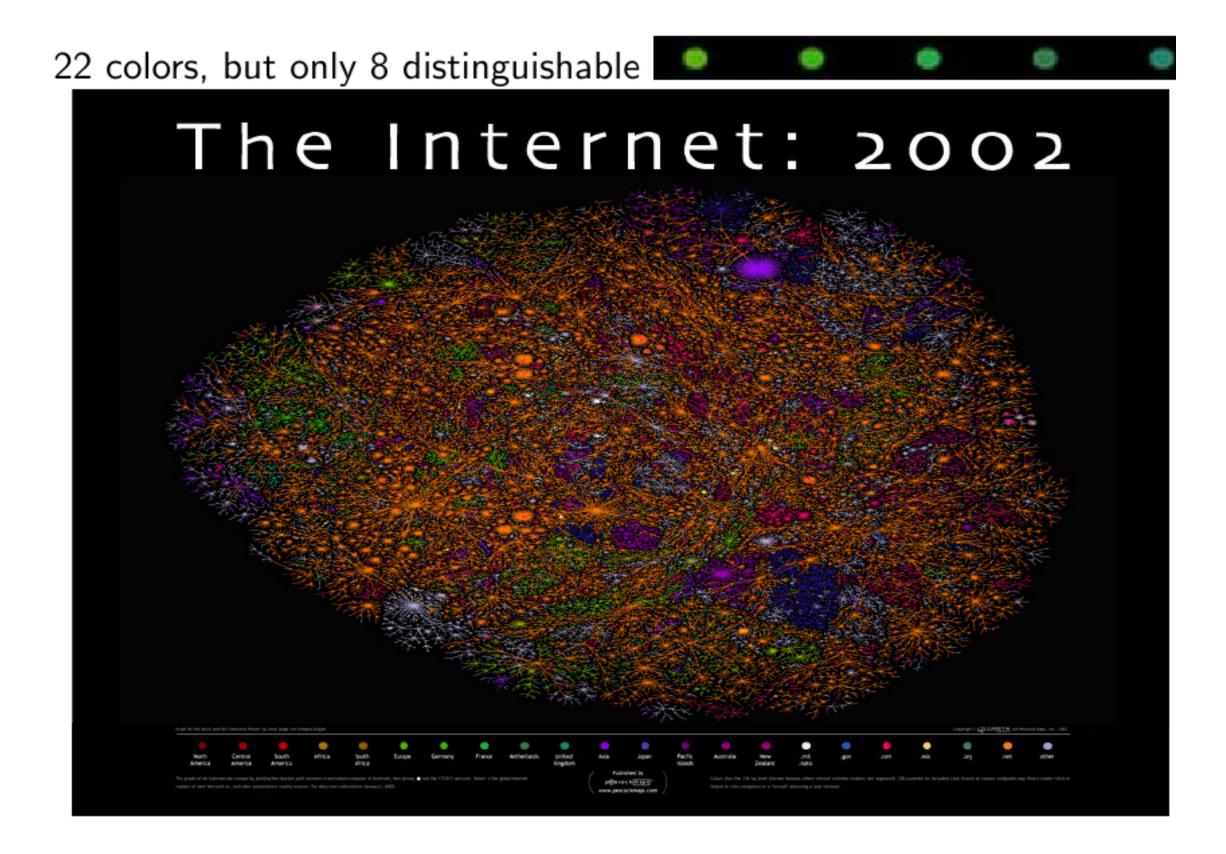


Carefully designed color scheme for 12 colors [colorbrewer]

Color for qualitative data

Color labeling (nominal information coding)

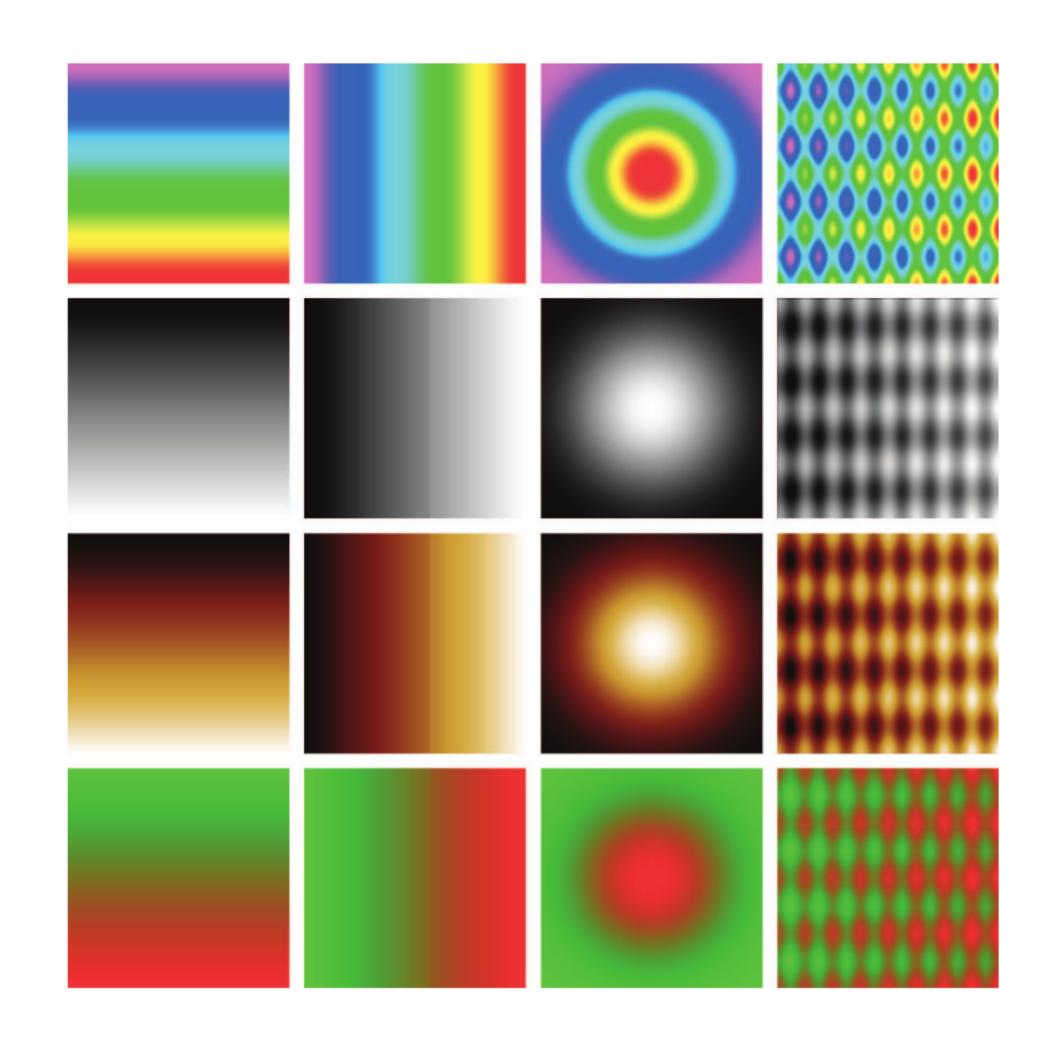
recommended: about 6, no more than 10

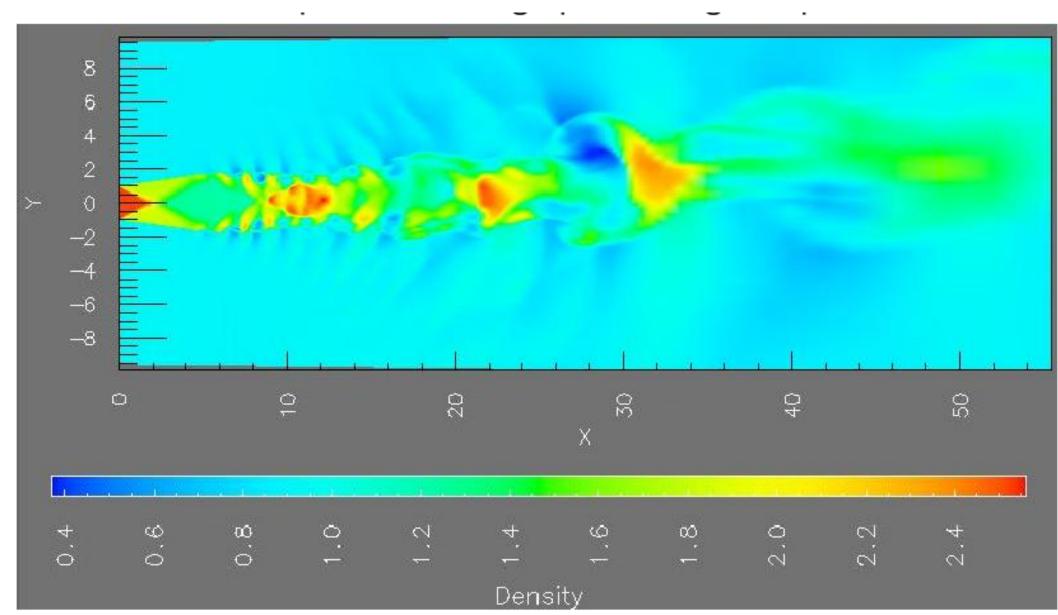


Color for quantitative data

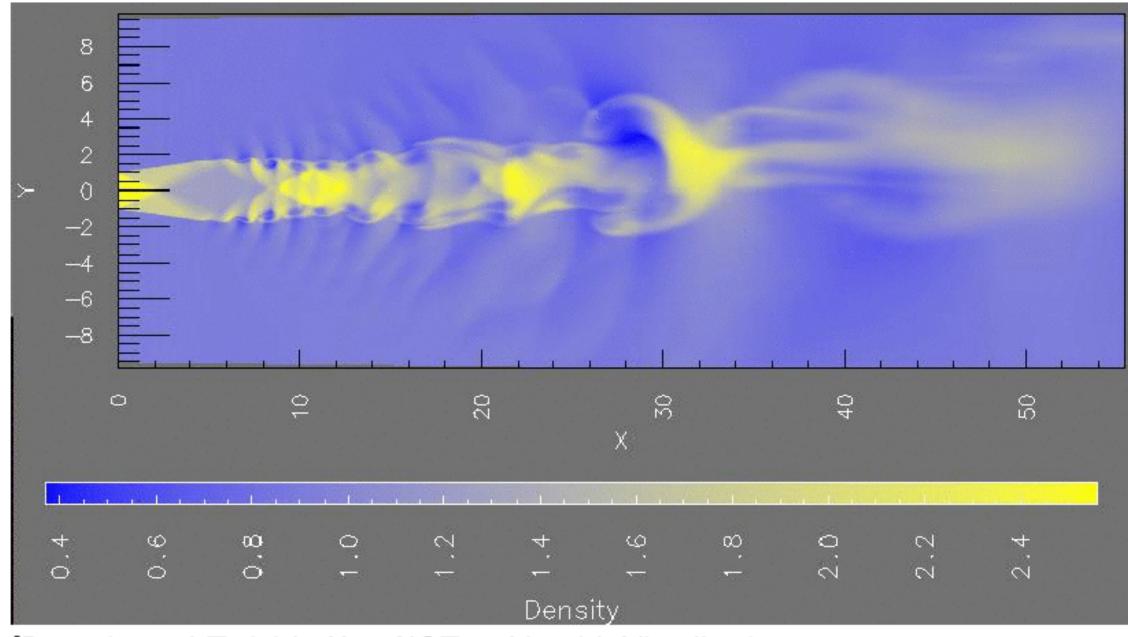
use value saturation works but not as good don't use hue!

Danger: rainbow color map





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



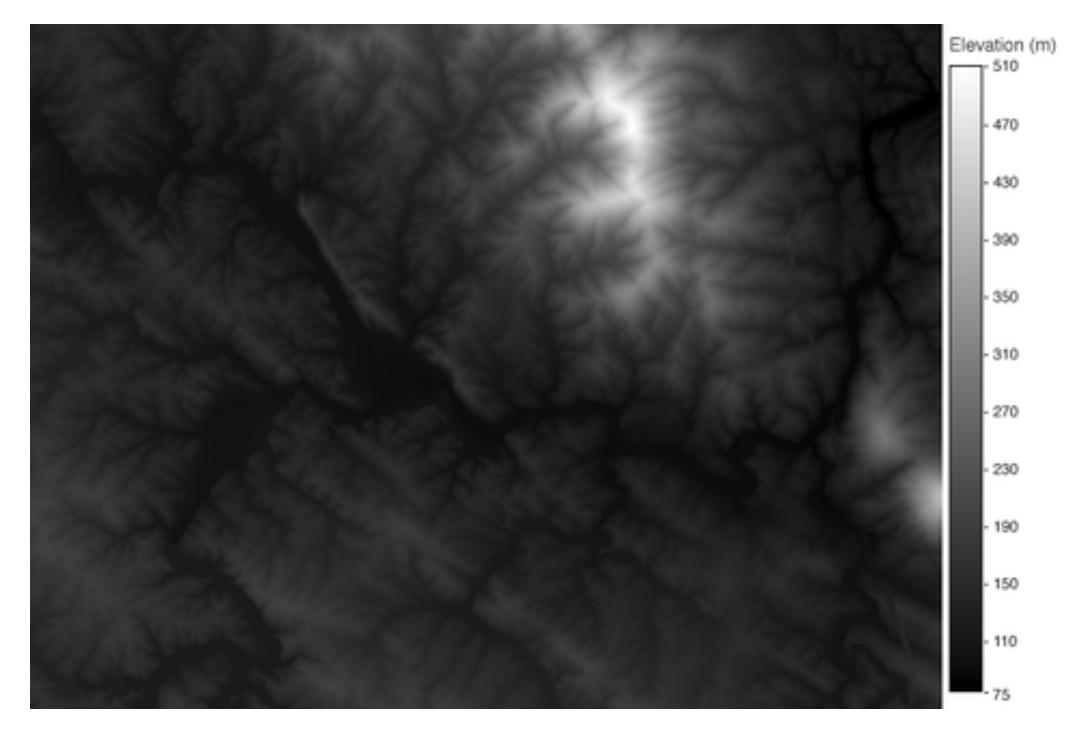
[Rogowitz and Treinish, How NOT to Lie with Visualization, www.research.ibm.com/dx/proceedings/pravda/truevis.htm]

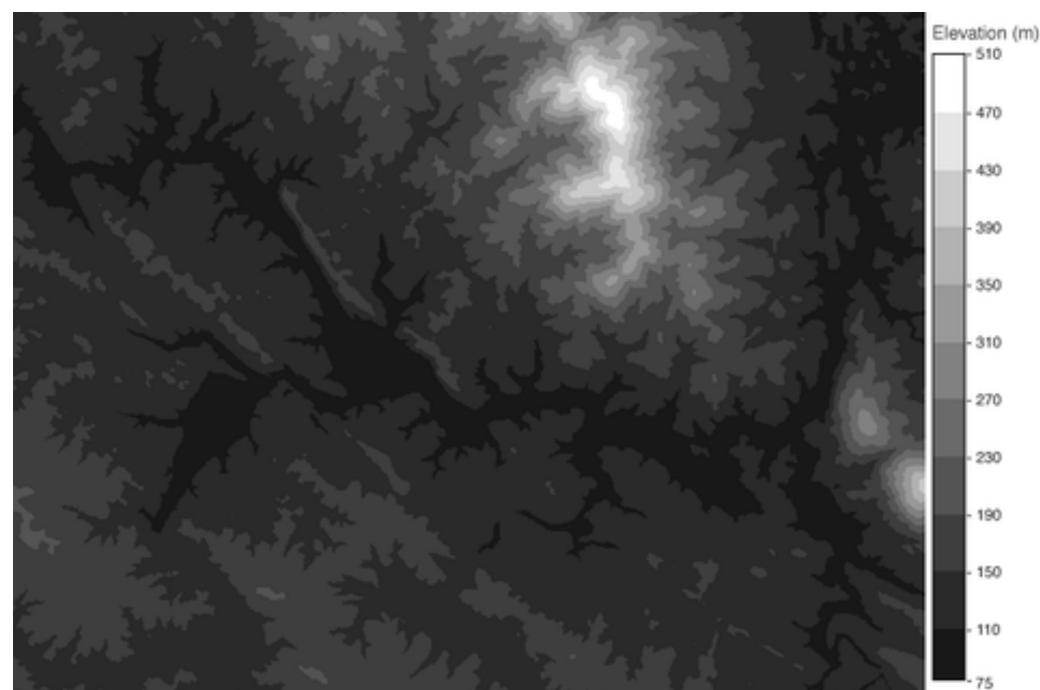
To bin or not to bin?

Study: what is faster? What is more accurate?

Example: Elevation

Continuous was faster
Binned was often more
accurate





Color Blindness

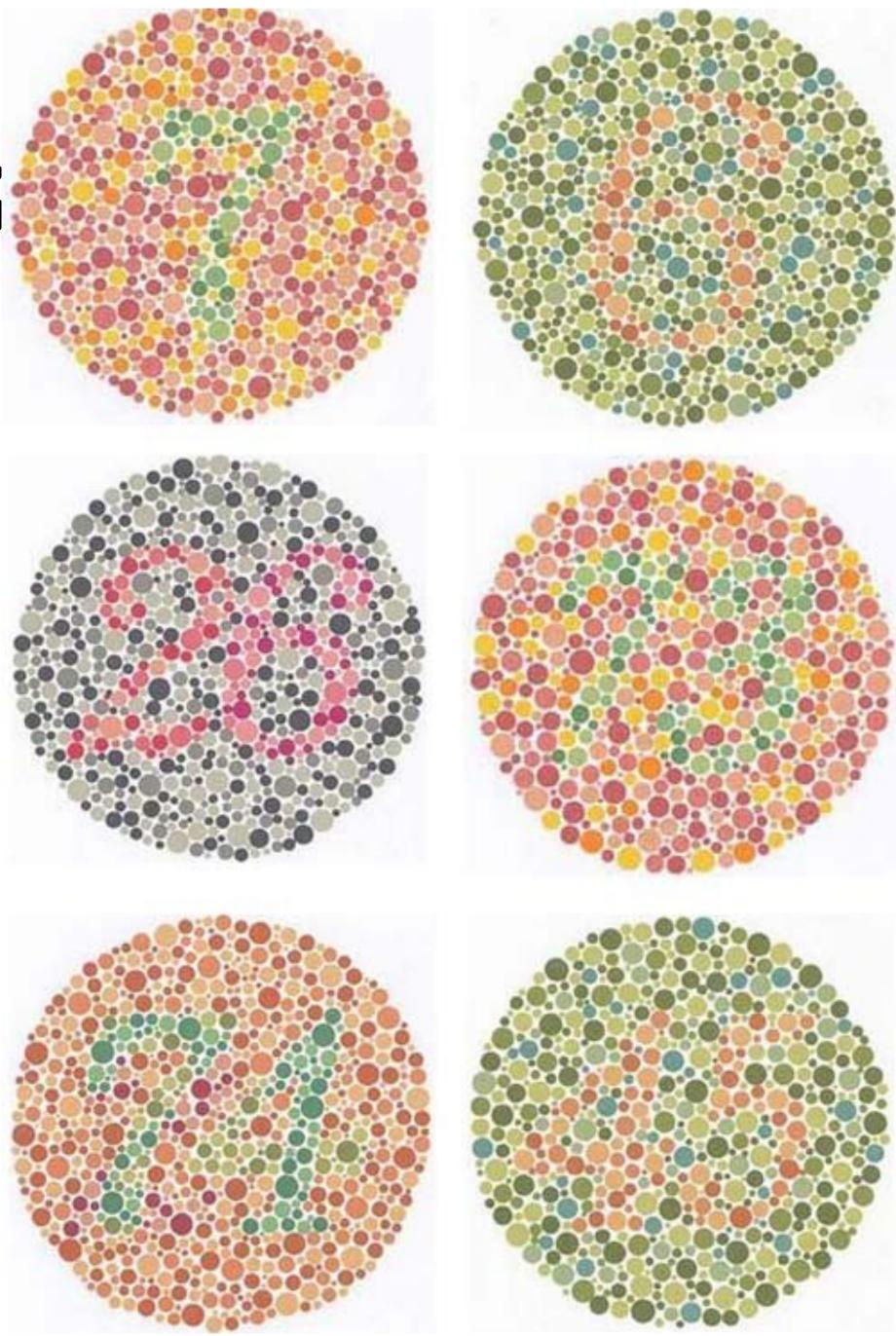
10% of males, 1% of females (probably due to X-chromosomal recessive inheritance)

Most common: red-green weakness / blindness

Reason: lack of medium or long wavelength receptors, or altered spectral sensitivity (most common: green shift)

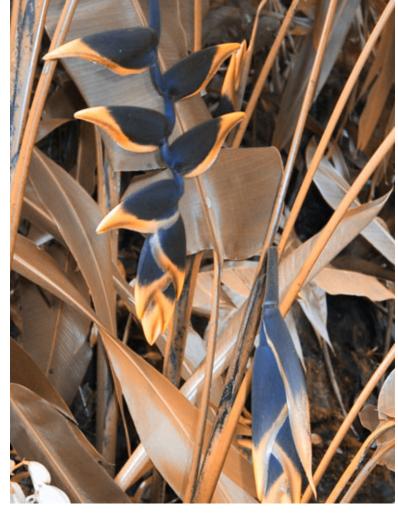


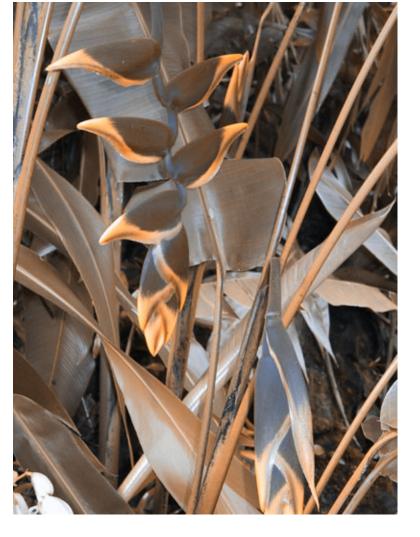




Color Blindness









Protanope

Deuteranope

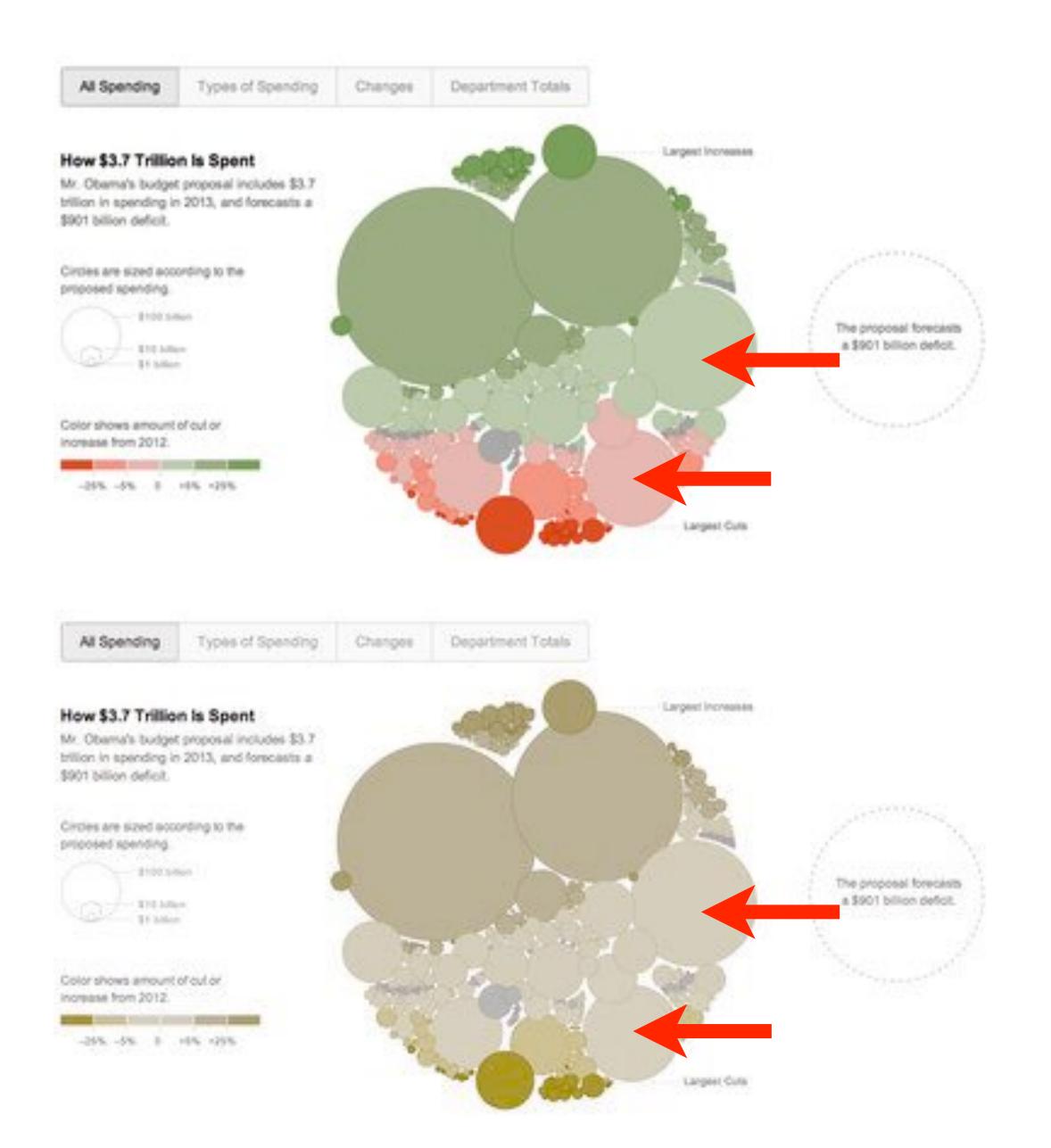
Tritanope

No L cones No M cones

No S cones

Red / green deficiencies

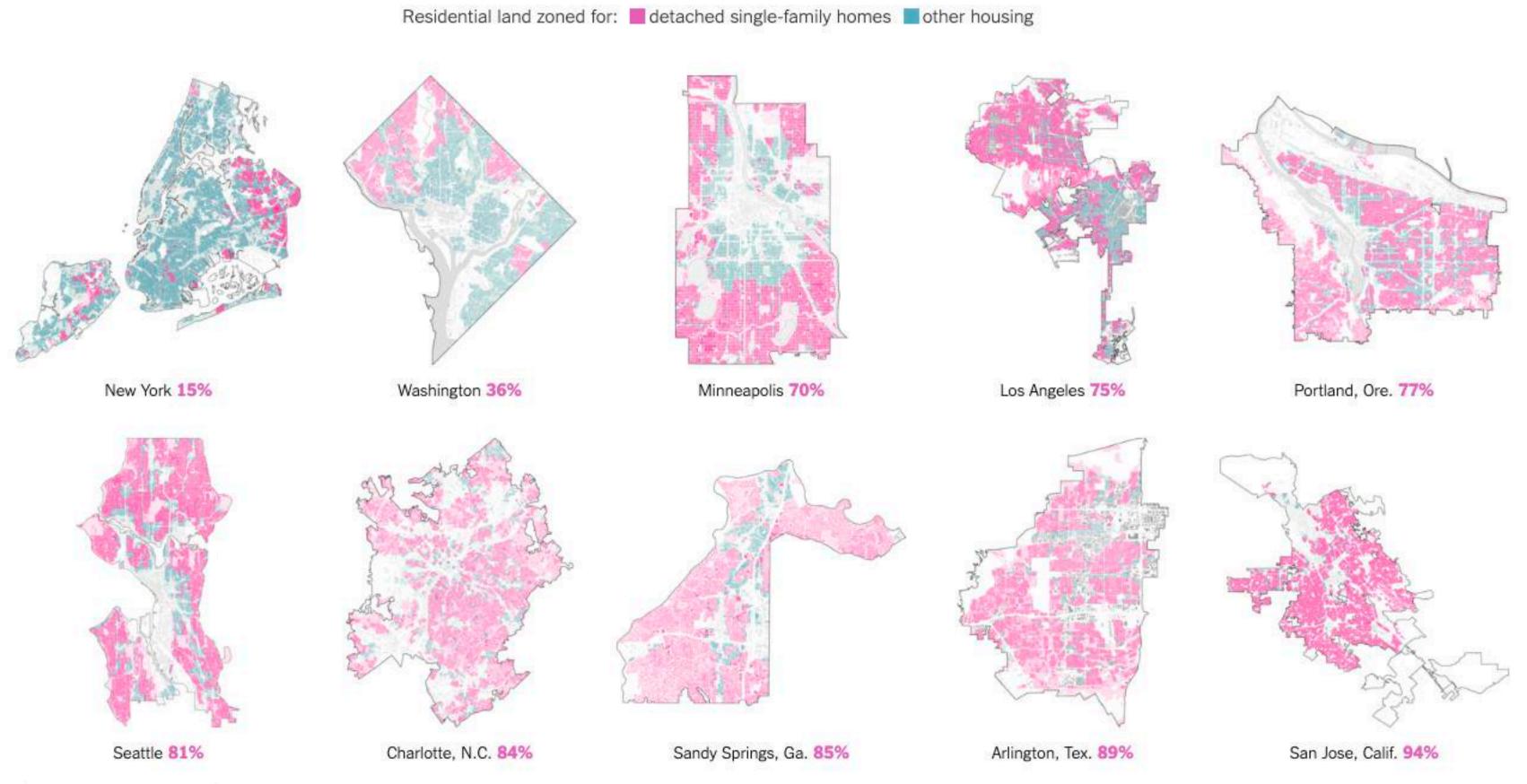
Blue / Yellow deficiency



Simulate Color Vision Deficiencies



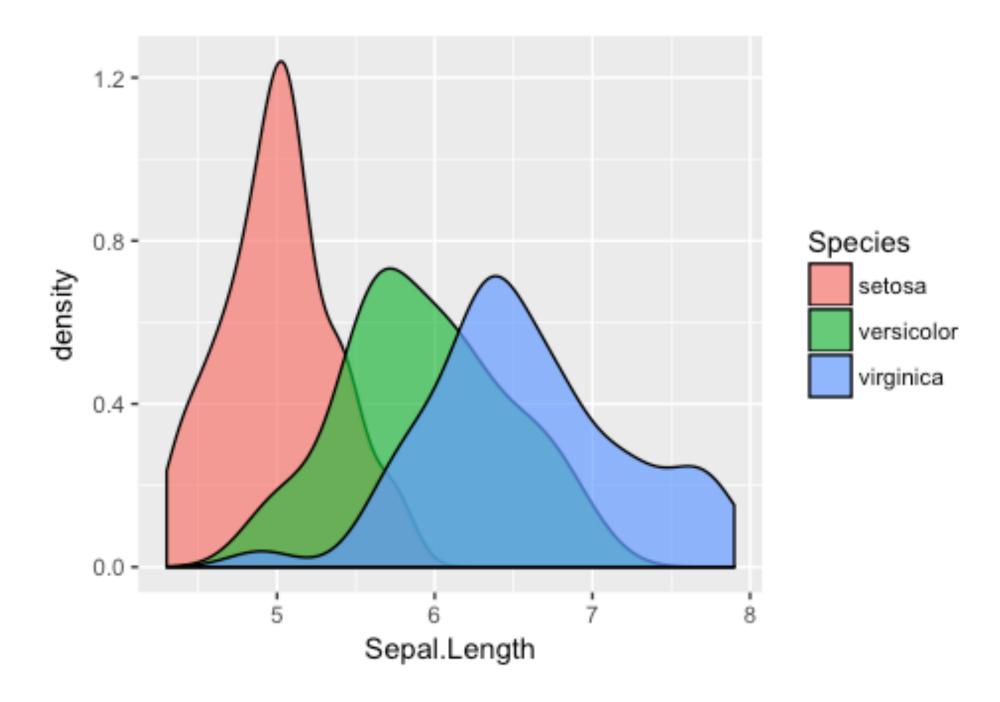
http://www.color-blindness.com/coblis-color-blindness-simulator/

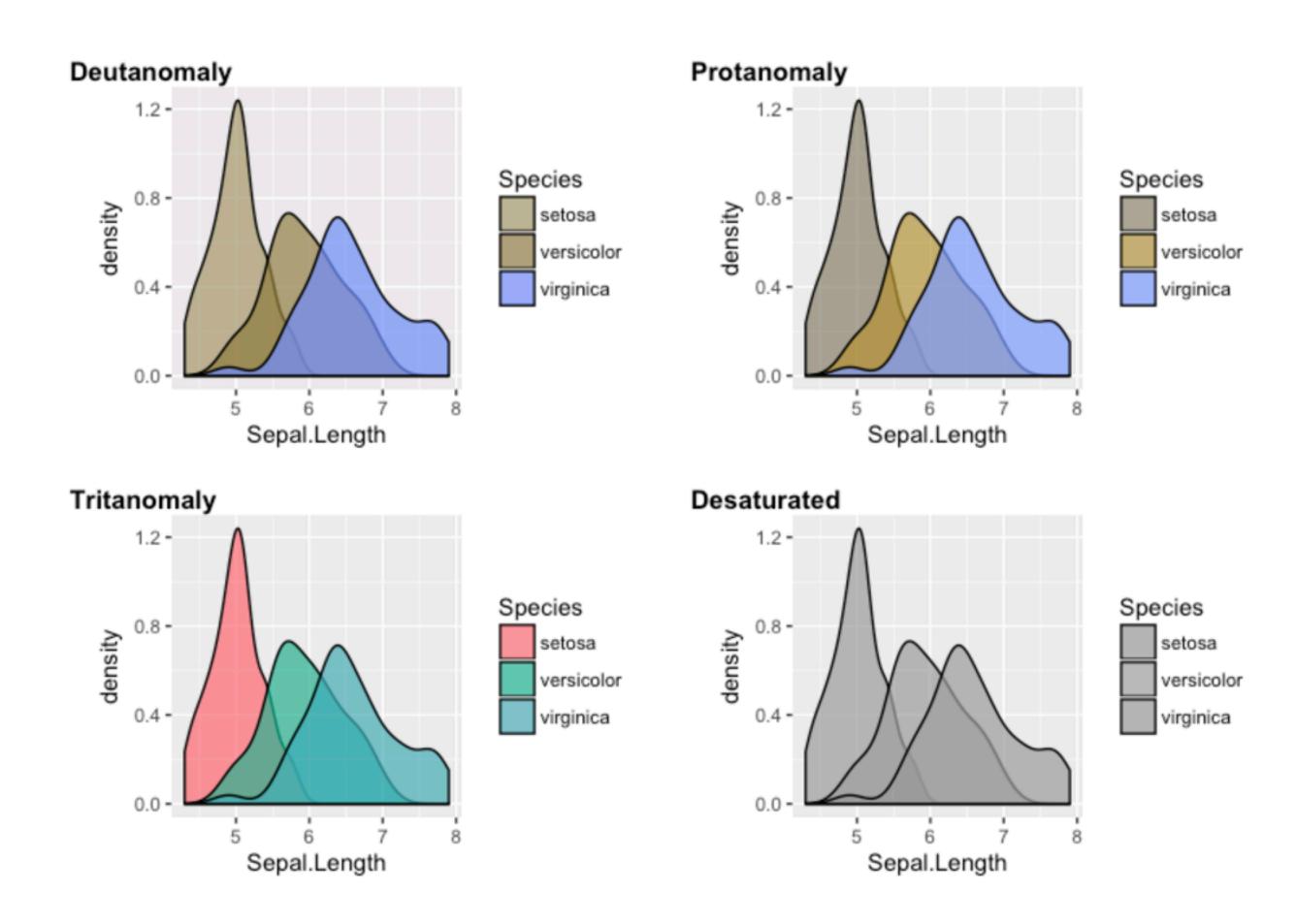


Cities not shown to scale. Source: Zoning data for individual cities from UrbanFootprint

Drag and drop or paste your file in the area below or: Choose File D9WIOrwXsAA4Z07.jpg Monochromatic view: Trichromatic view: Anomalous Trichromacy: Dichromatic view: Red-Weak/Protanomaly Red-Blind/Protanopia Monochromacy/Achromatopsia ○ Normal Green-Weak/Deuteranomaly Green-Blind/Deuteranopia Blue Cone Monochromacy Blue-Weak/Tritanomaly ○ Blue-Blind/Tritanopia Use lens to compare with normal view: ONo Lens Normal Lens Inverse Lens Reset View Open simulated image in new window Residential land zoned for: detached single-family homes other housing Portland, Ore. 77% Los Angeles 75% Minneapolis 70% Charlotte, N.C. 84% Seattle 81% Sandy Springs, Ga. 85% San Jose, Calf. 94% Arlington, Tex. 89% Cities not shown to scale. Source: Zoning data for individual cities from Urban-Footprint

Simulate in R



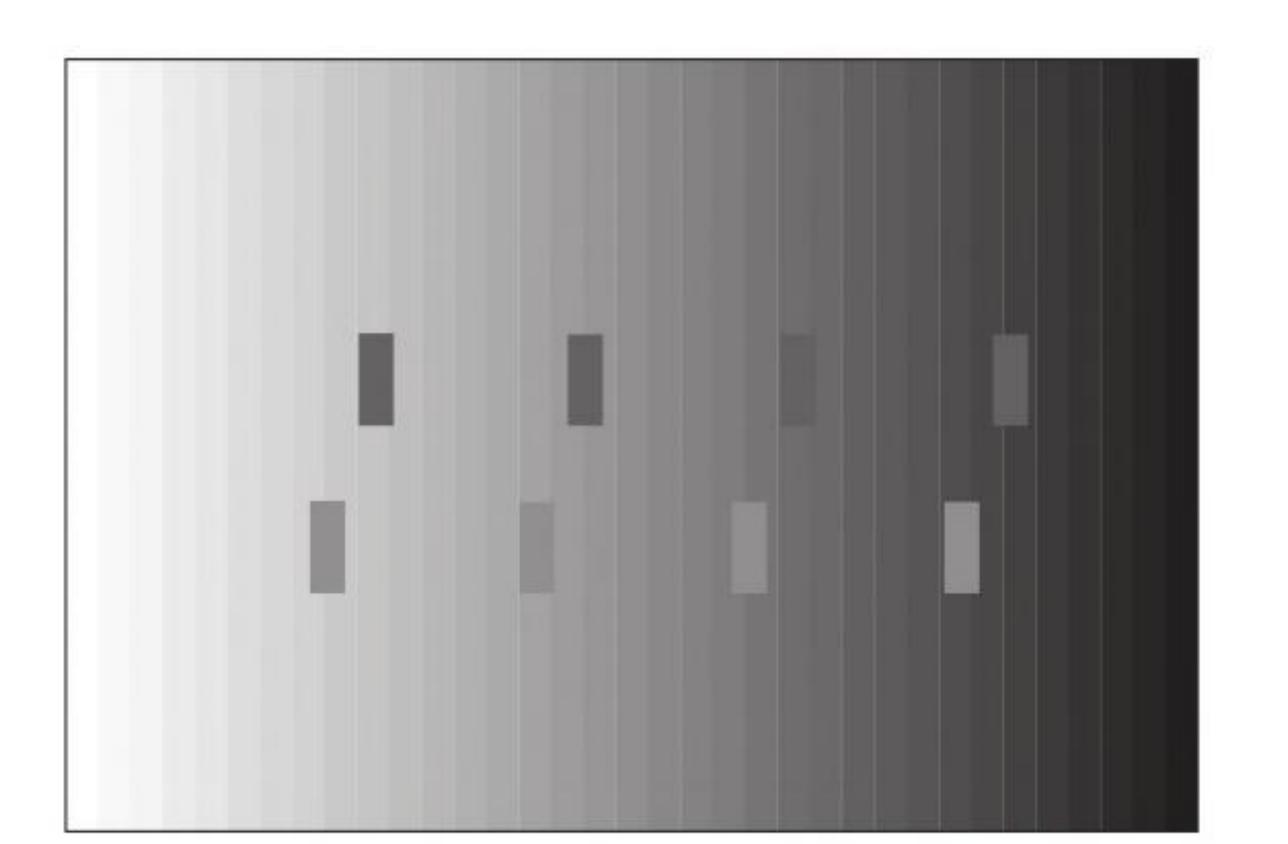


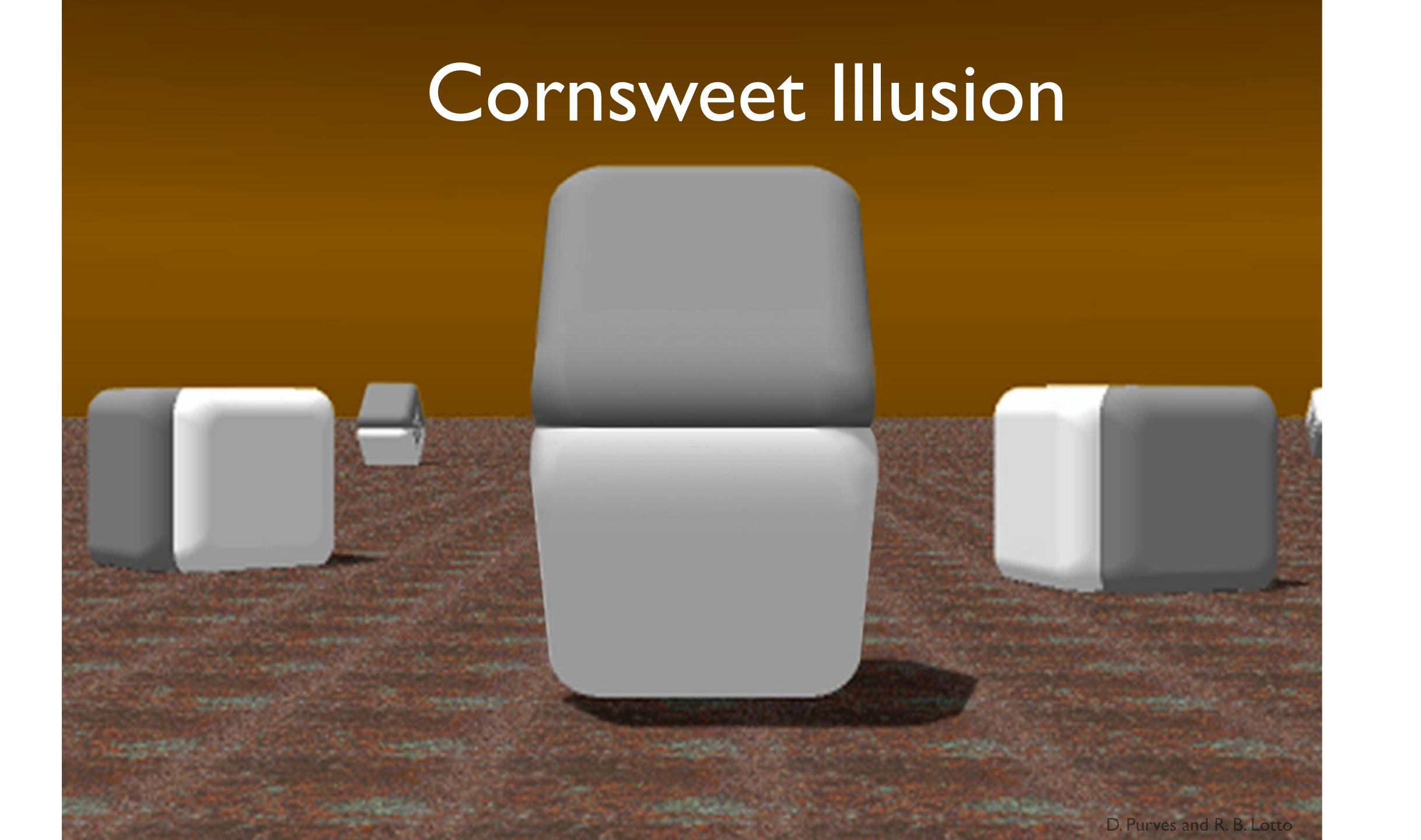
Color / Brightness is Relative!

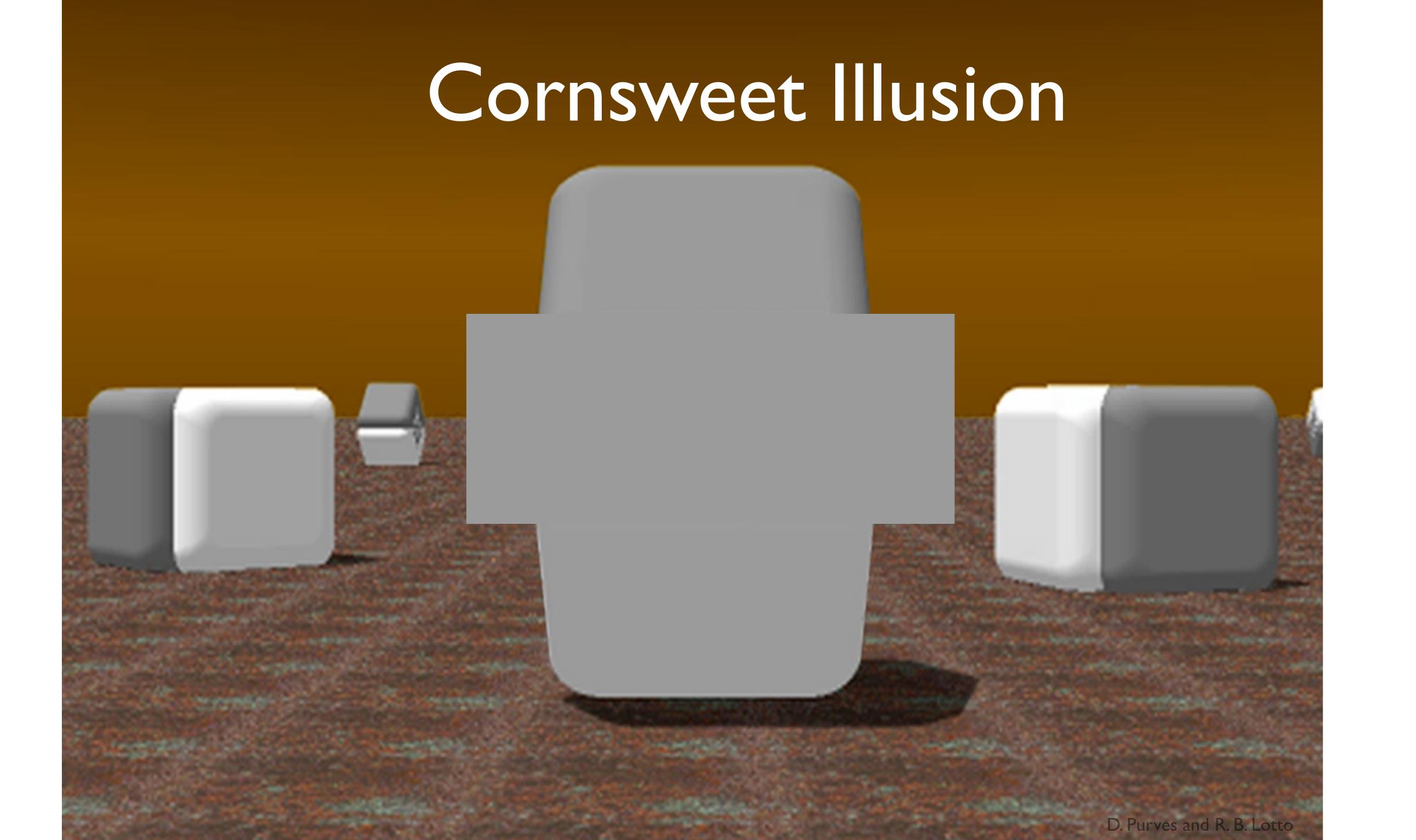
Simultaneous Brightness Contrast

The perceived brightness of an object is relative to it's background



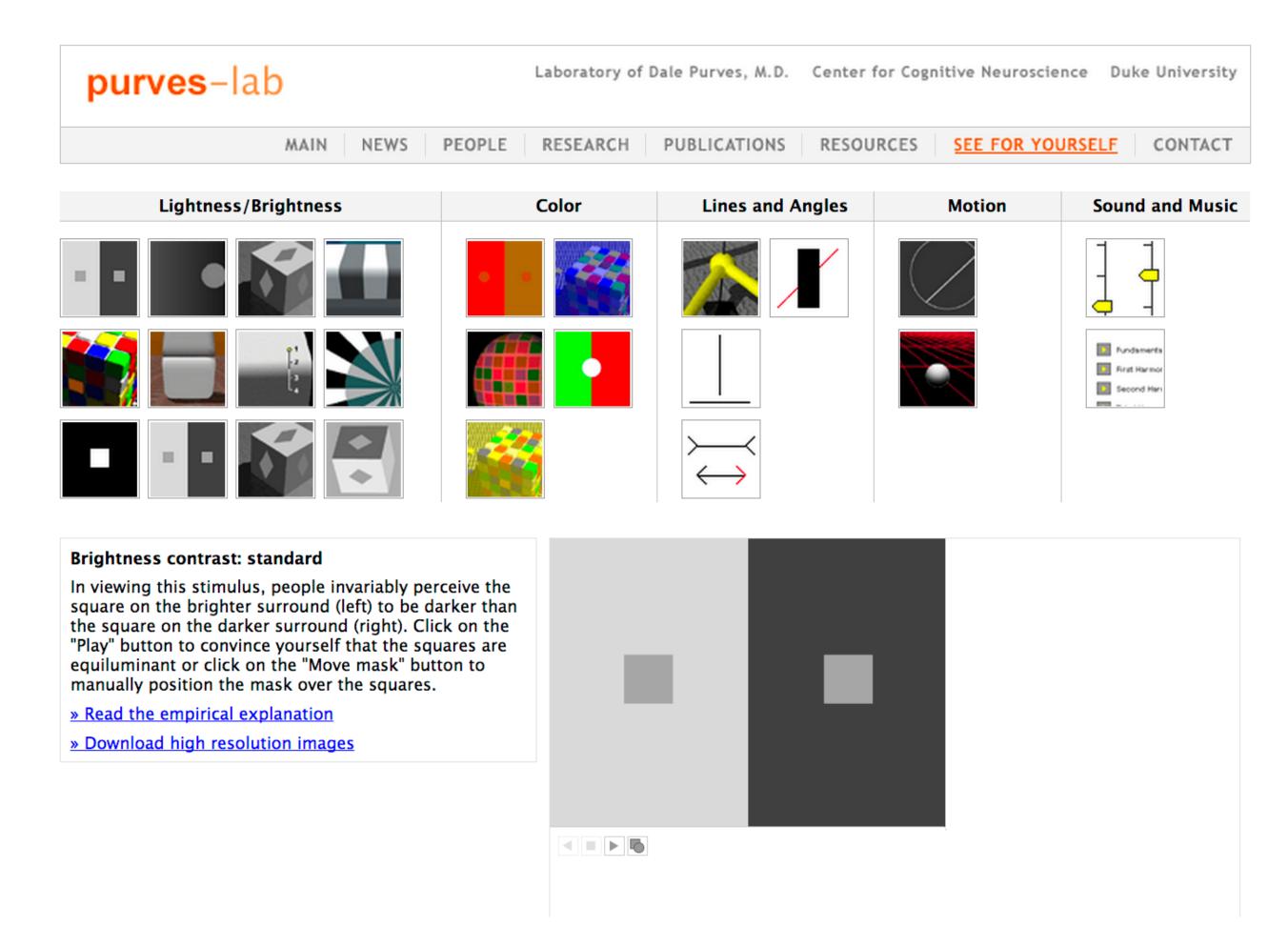






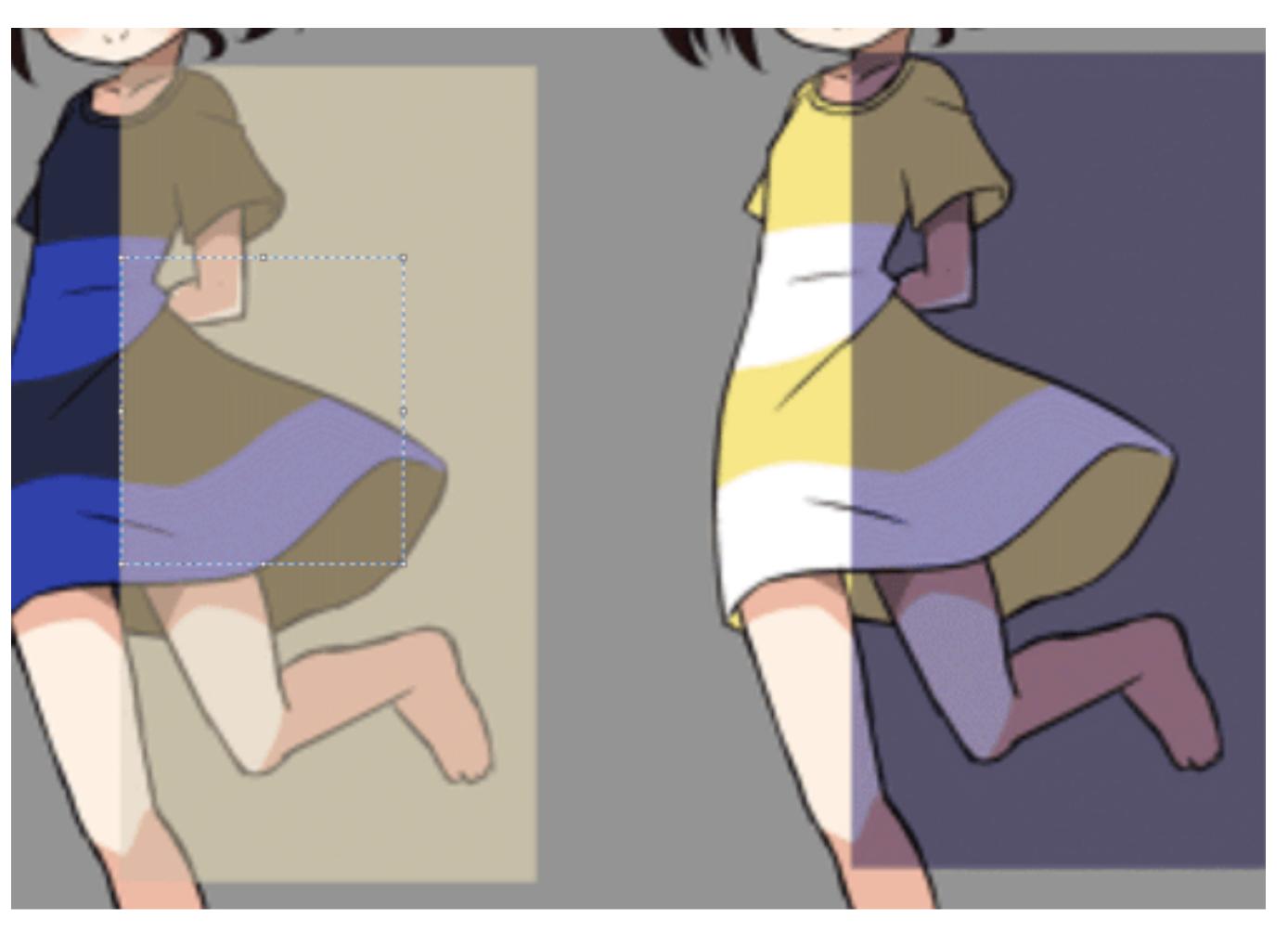
Demo

http://purveslab.net/see-for-yourself/



The Dress Meme



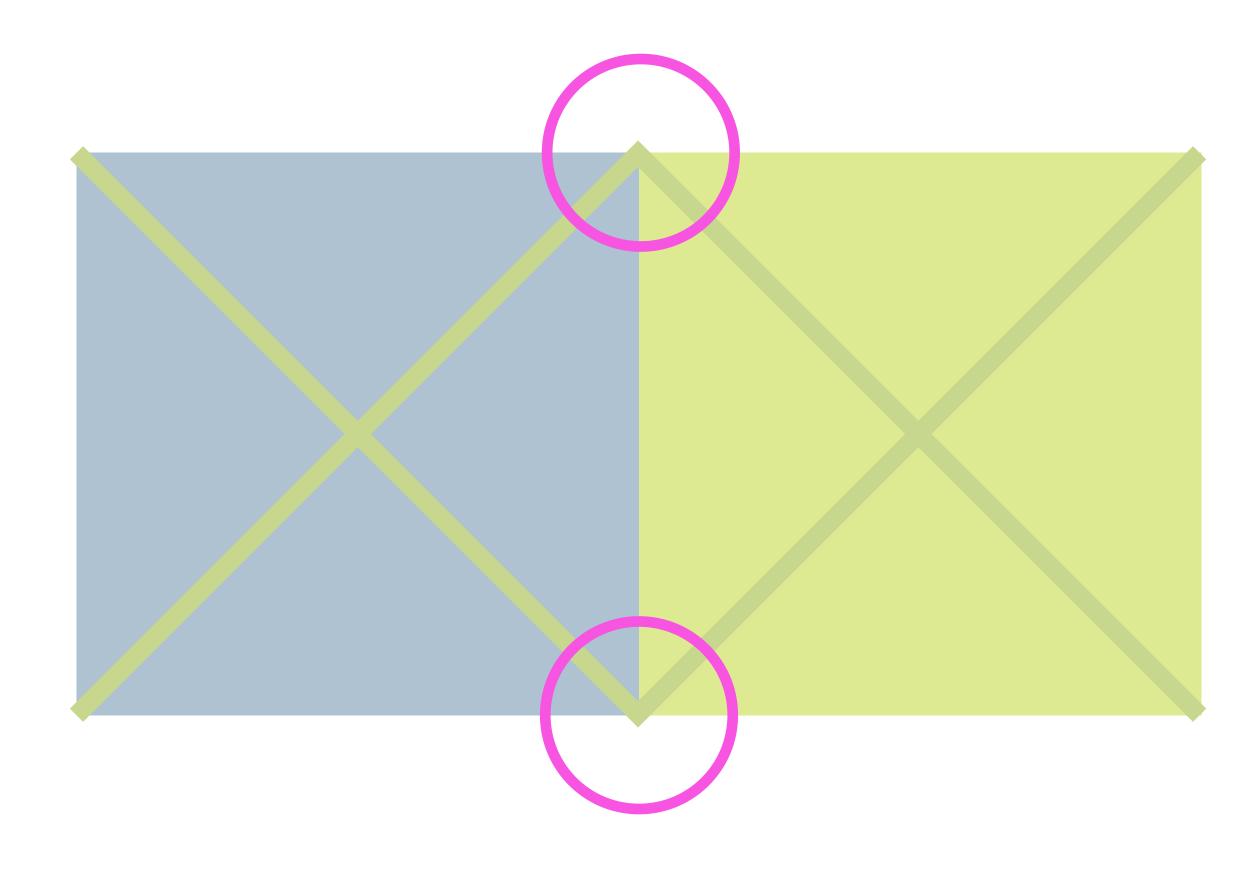


black and blue or white and gold?

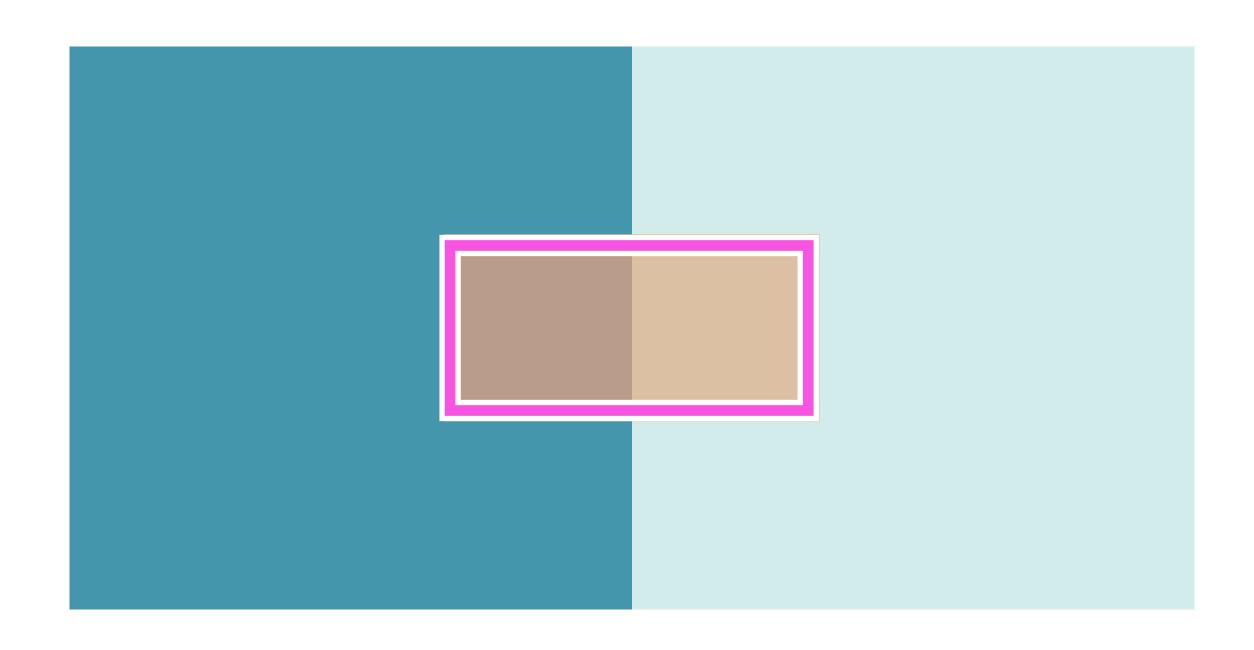
https://imgur.com/hxJjUQB

https://en.wikipedia.org/wiki/The_dress

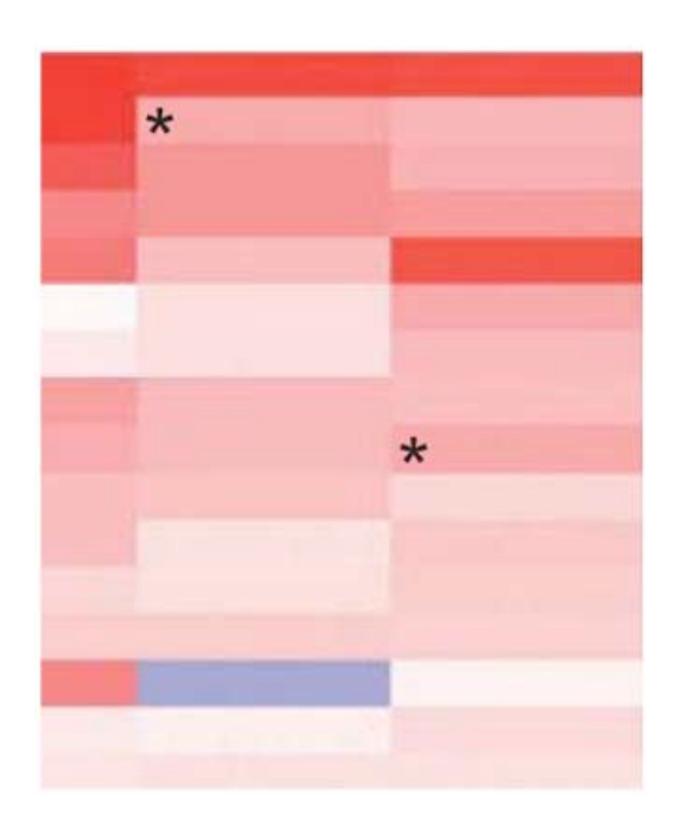
INTERACTION OF COLOR



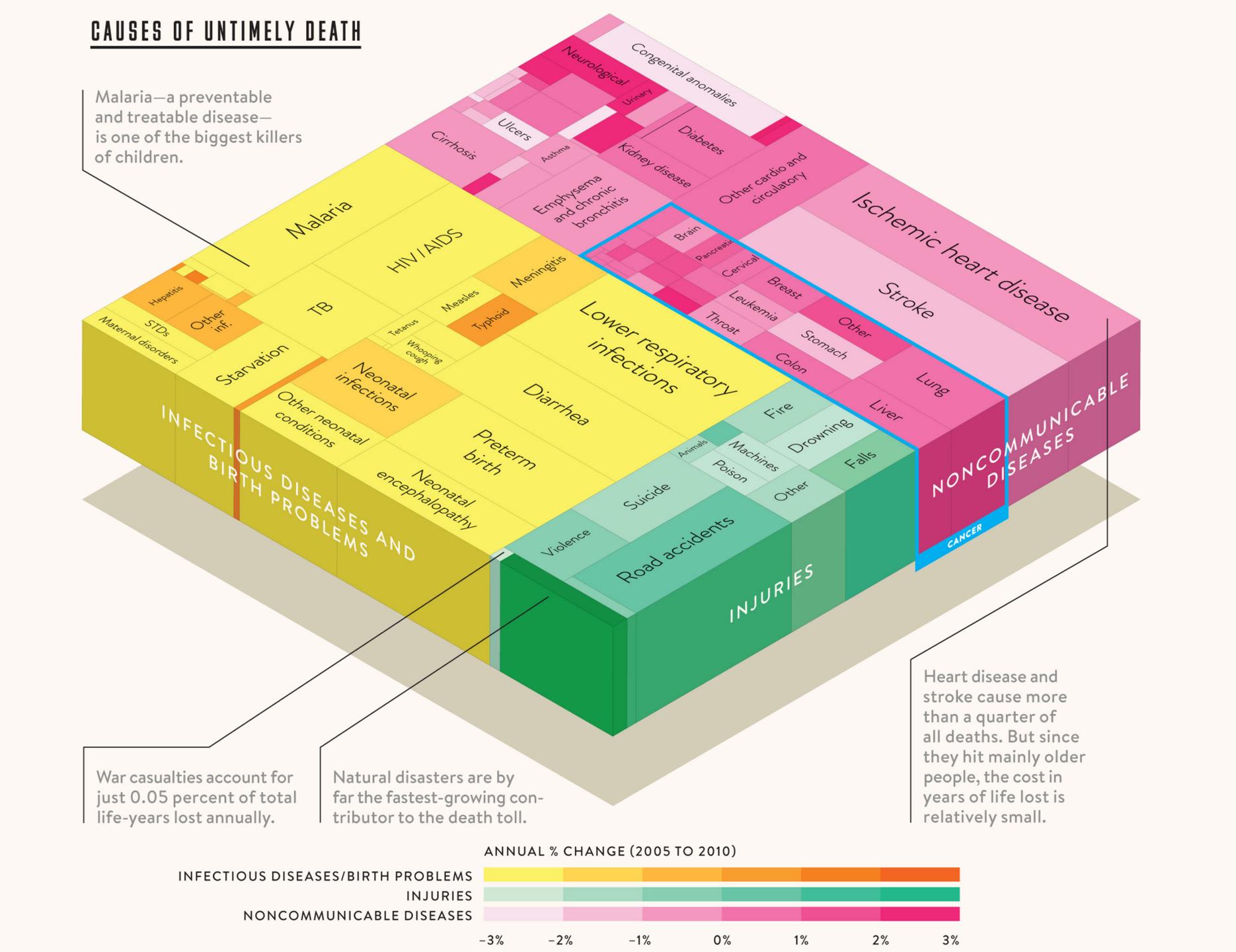
INTERACTION OF COLOR



INTERACTION OF COLOR



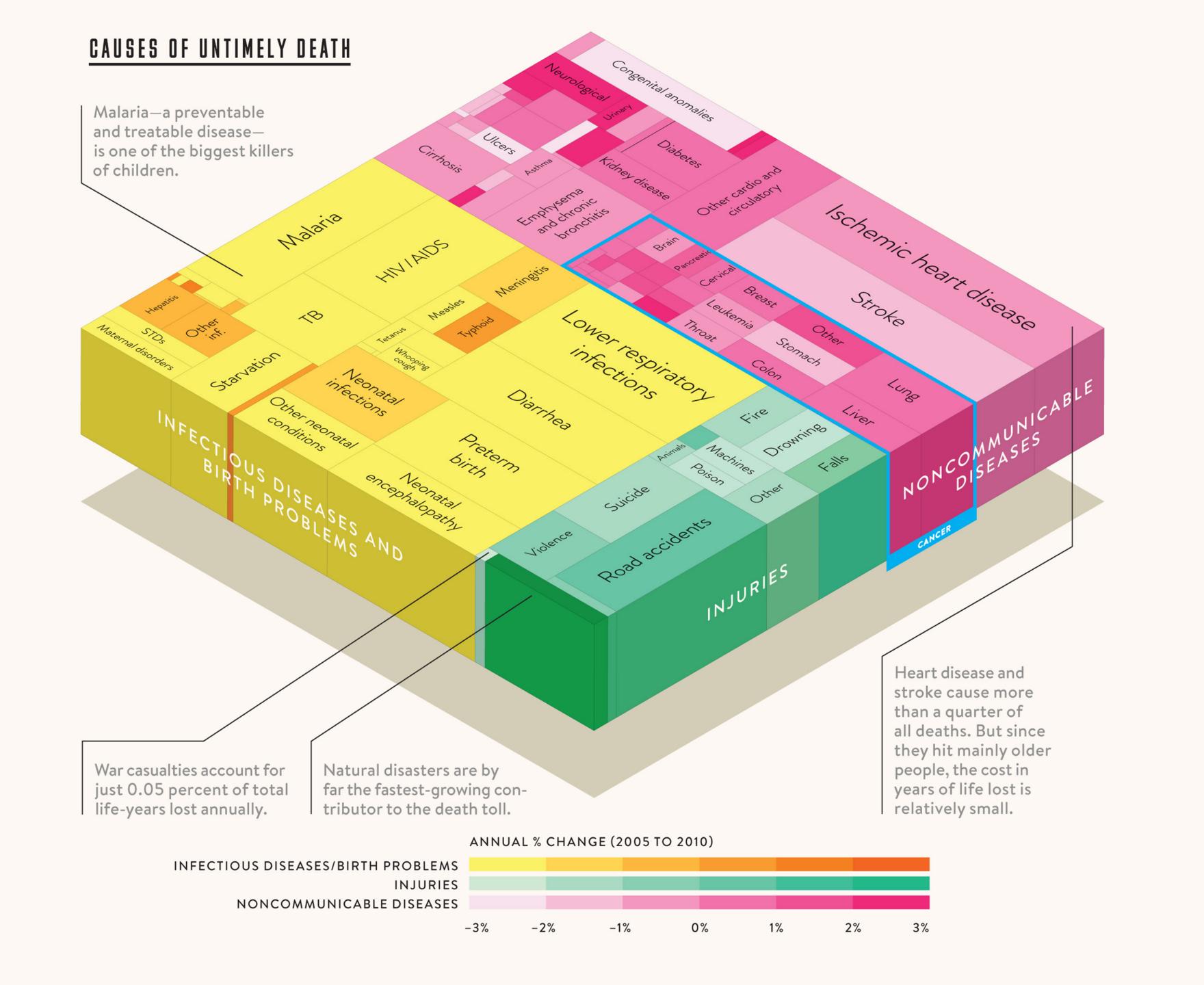
Design Critique



Graph of the Year?

"I love this graph because it shows that while the number of people dying from communicable diseases is still far too high, those numbers continue to come down. [...] But there remains much to do to cut down the deaths in that yellow block even more dramatically. We have the solutions. But we need to keep up the support where they're being deployed [...]"

-Bill Gates



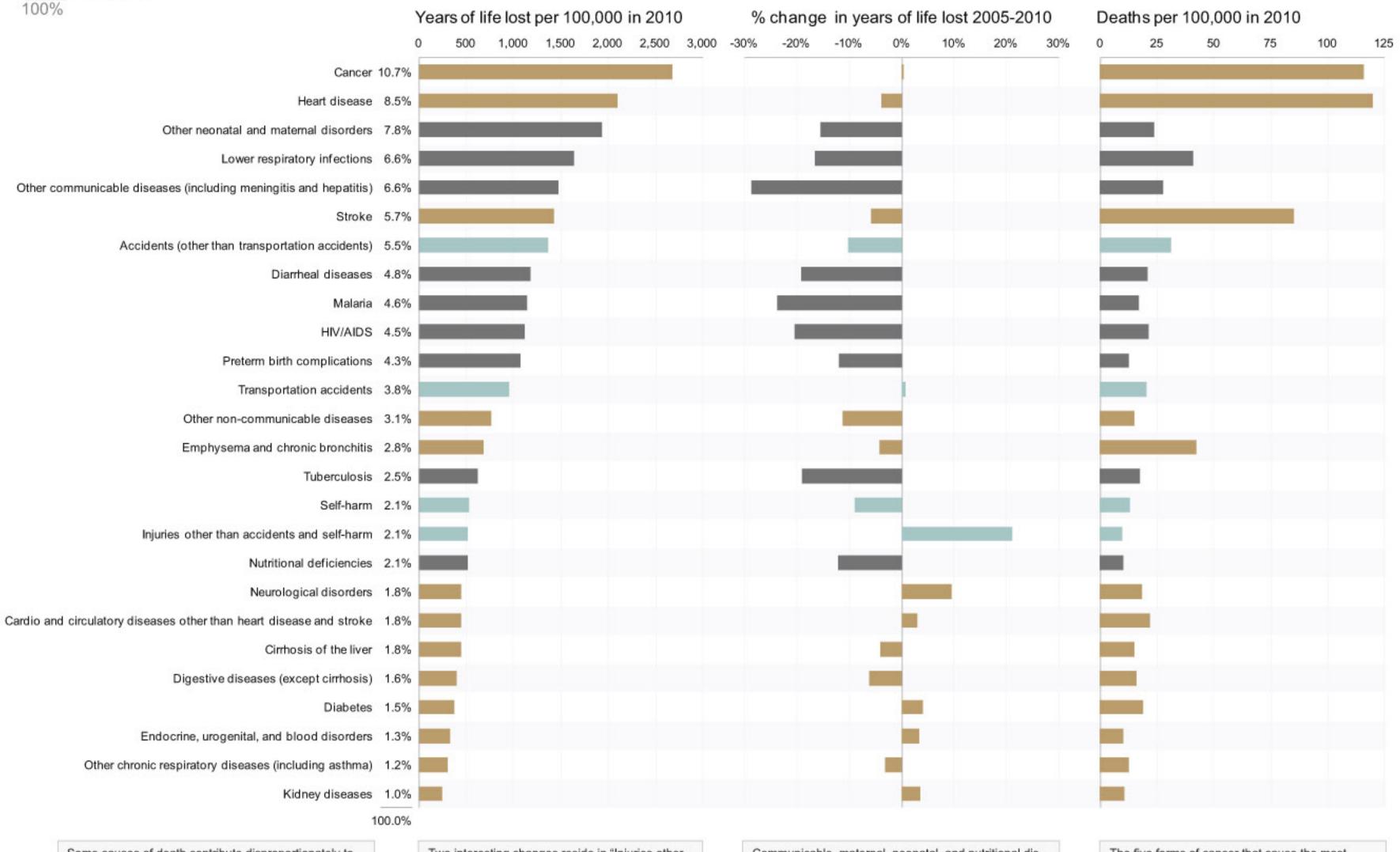
Global Causes of Lost Life

44% Communicable, maternal, neonatal, and nutritional disorders

43% Non-communicable diseases

13% ■ Injuries

Comparing the number of deaths alone, as shown in the rightmost graph below, doesn't tell the entire story. Some causes of death have a greater effect on the young, which can be seen when comparing years of life lost in the leftmost graph.



Some causes of death contribute disproportionately to years of life lost because of their effect on the young. For example, malaria, while not huge in the number of deaths, is much more signficant in the number of years

Two interesting changes reside in "Injuries other than accidents and self-harm." War, which accounted for only 0.05% of years of life lost, decreased since 2005 by 31.5% in years of life lost per 100,000 people. Natural disasters, which accounted for 0.65% of years of life lost, increased by 217% in years of life lost per 100,000.

Communicable, maternal, neonatal, and nutritional disorders (the gray bars) are often easier to prevent through healthcare than other causes of death. This reveals itself in the graph above by the fact that all of these disorders have decreased during this five year period.

The five forms of cancer that cause the most deaths are trachea/bronchus/lung (2.9%), stomach (1.4%), liver (1.4%), colon/rectum (1.4%), and breast (0.8%).

All cardiovascular and circulatory diseases combined account for 30% of deaths.

Redesign by Perceptual Edge

Popout

Popout

Properties detected by the low-level visual system

very rapid - 200-250 milliseconds

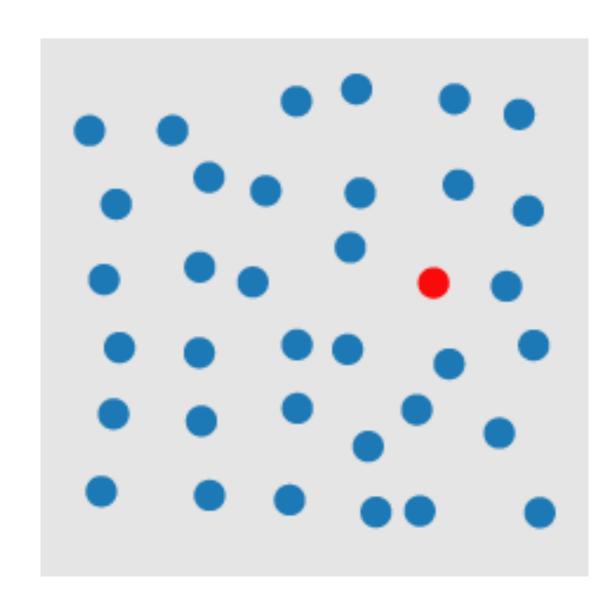
very accurate

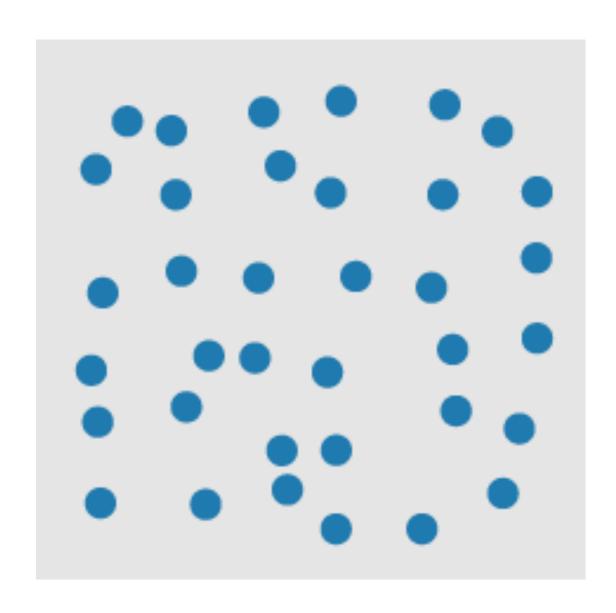
processed in parallel

happens before focused attention -> "pre"attentive attention is very important for cognition Independent of the number of distractors!

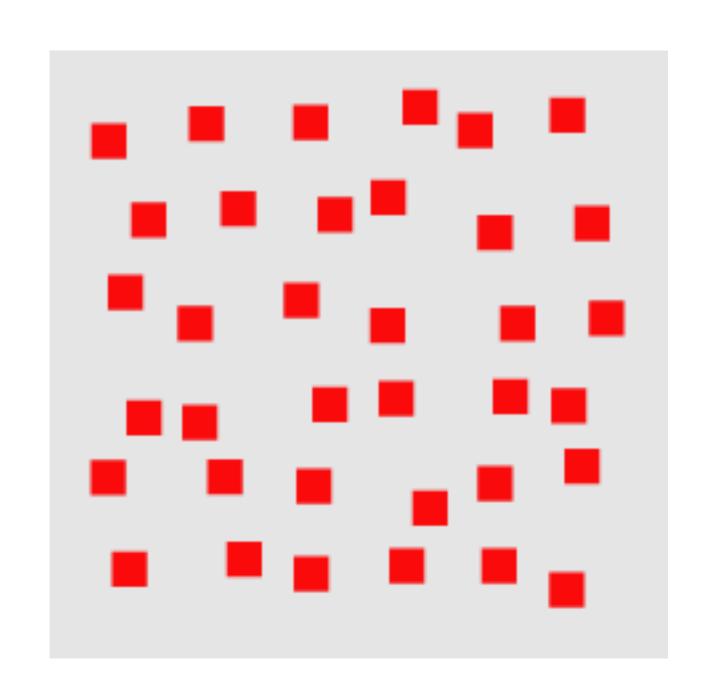
Opposite: sequential search (processed serially)

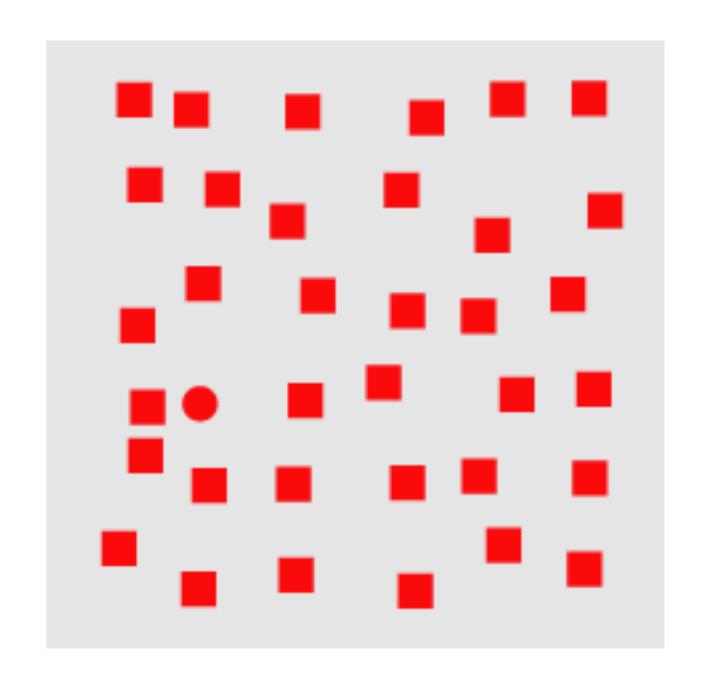
Difference in Hue



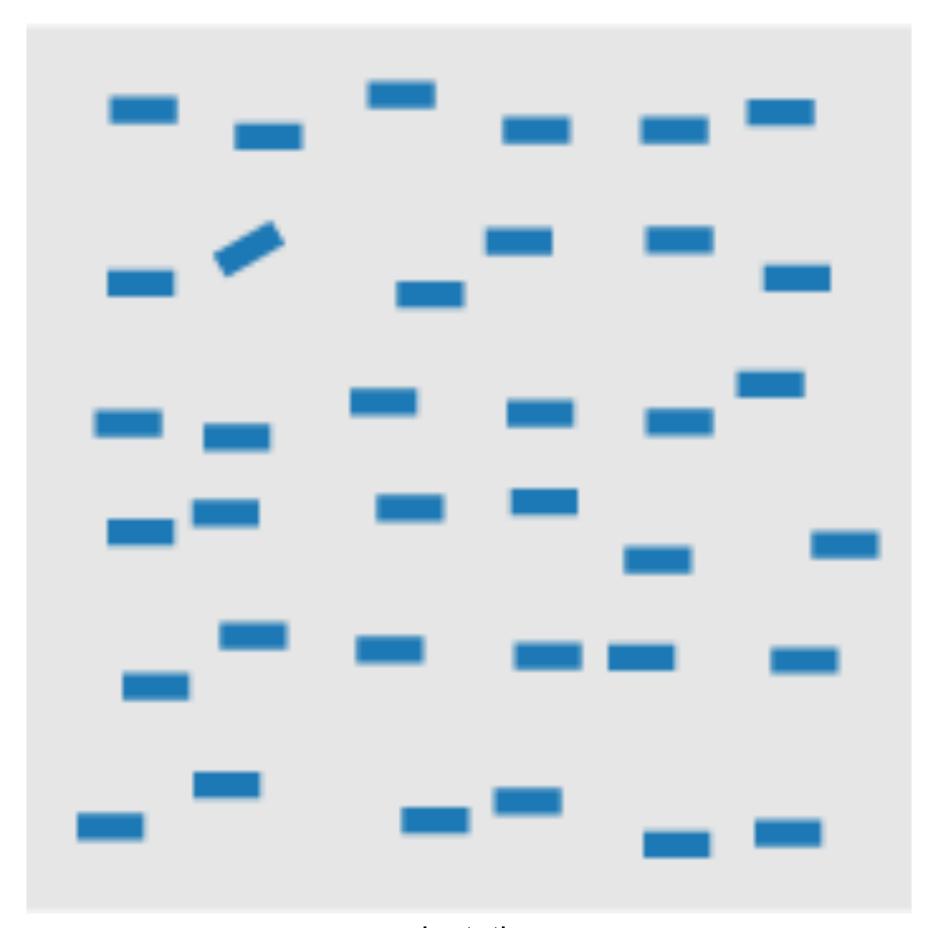


Difference in Curvature / Form

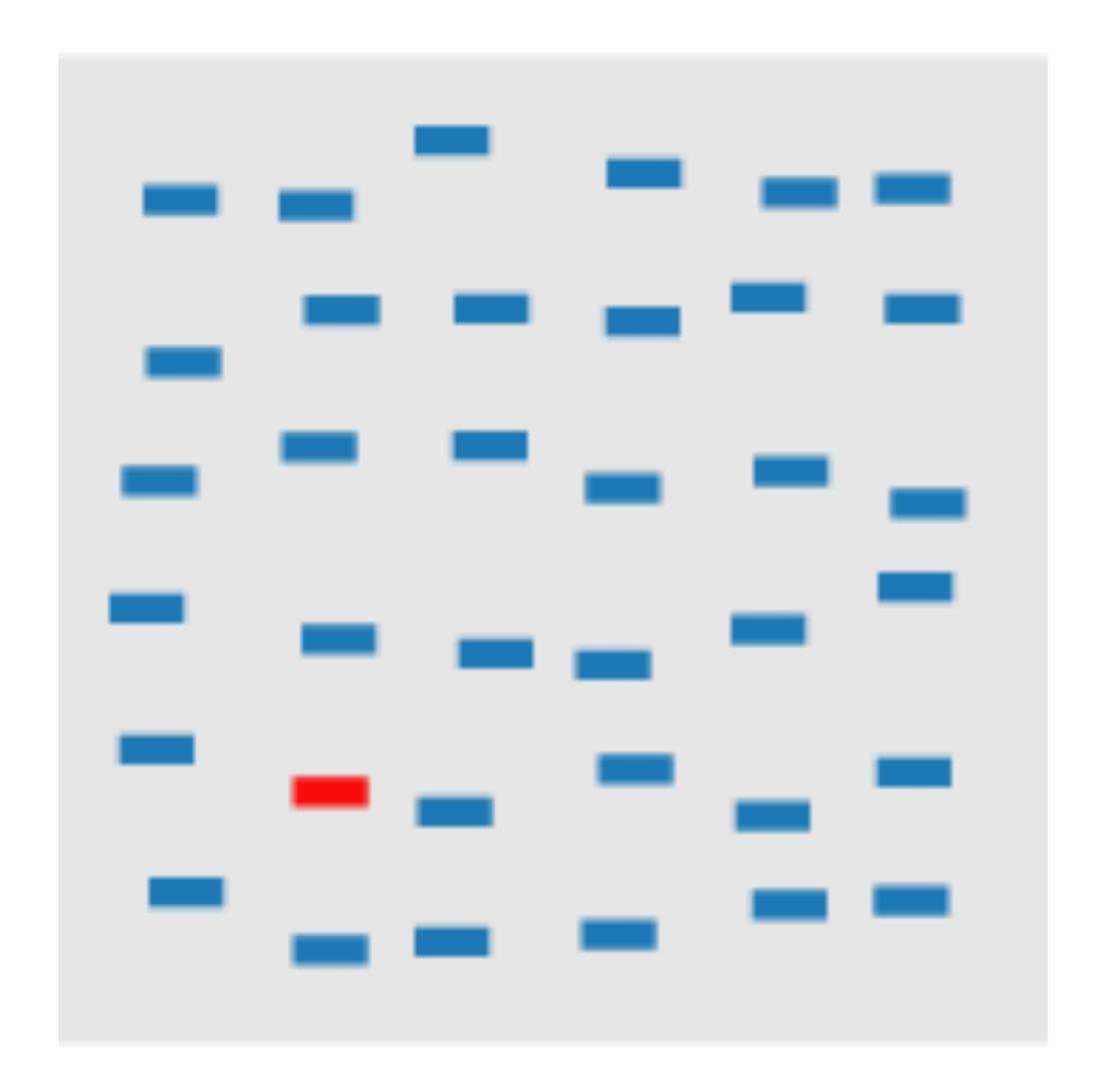




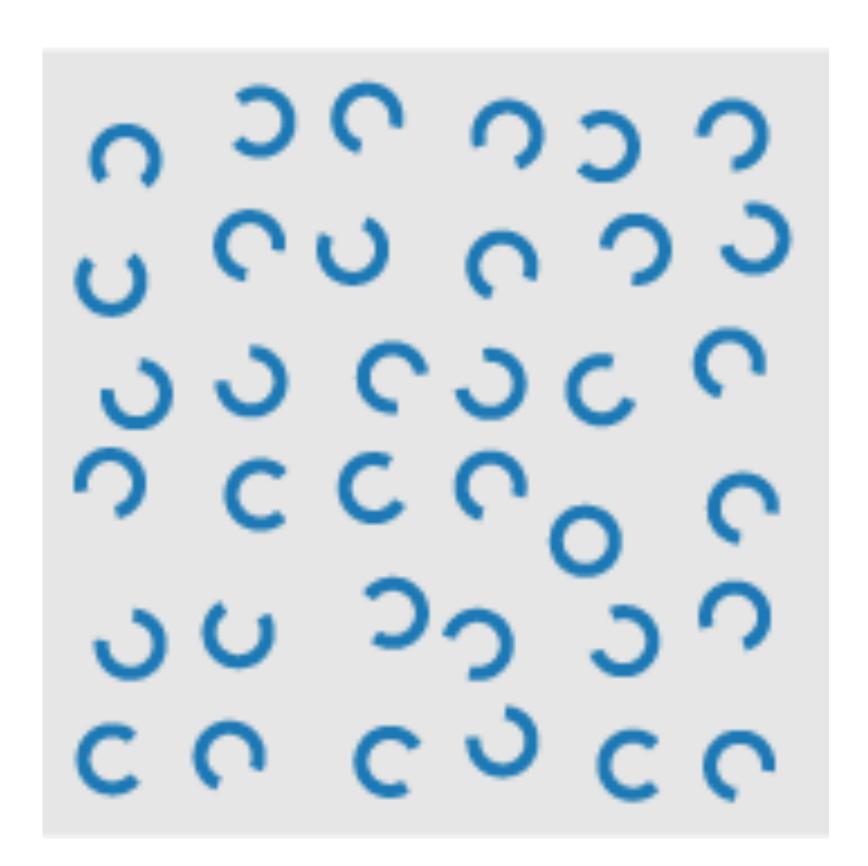
Clap when you spot the odd one!



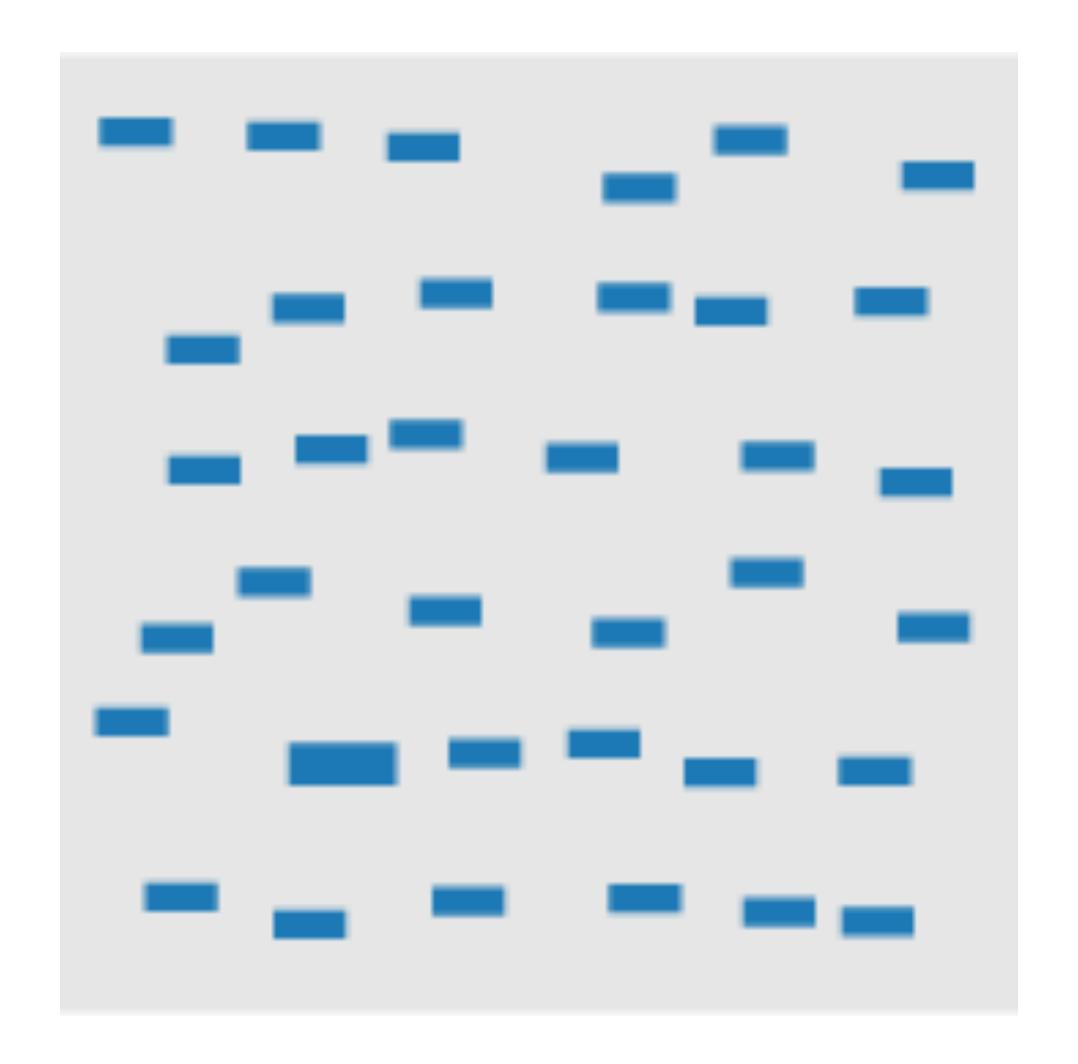
orientation

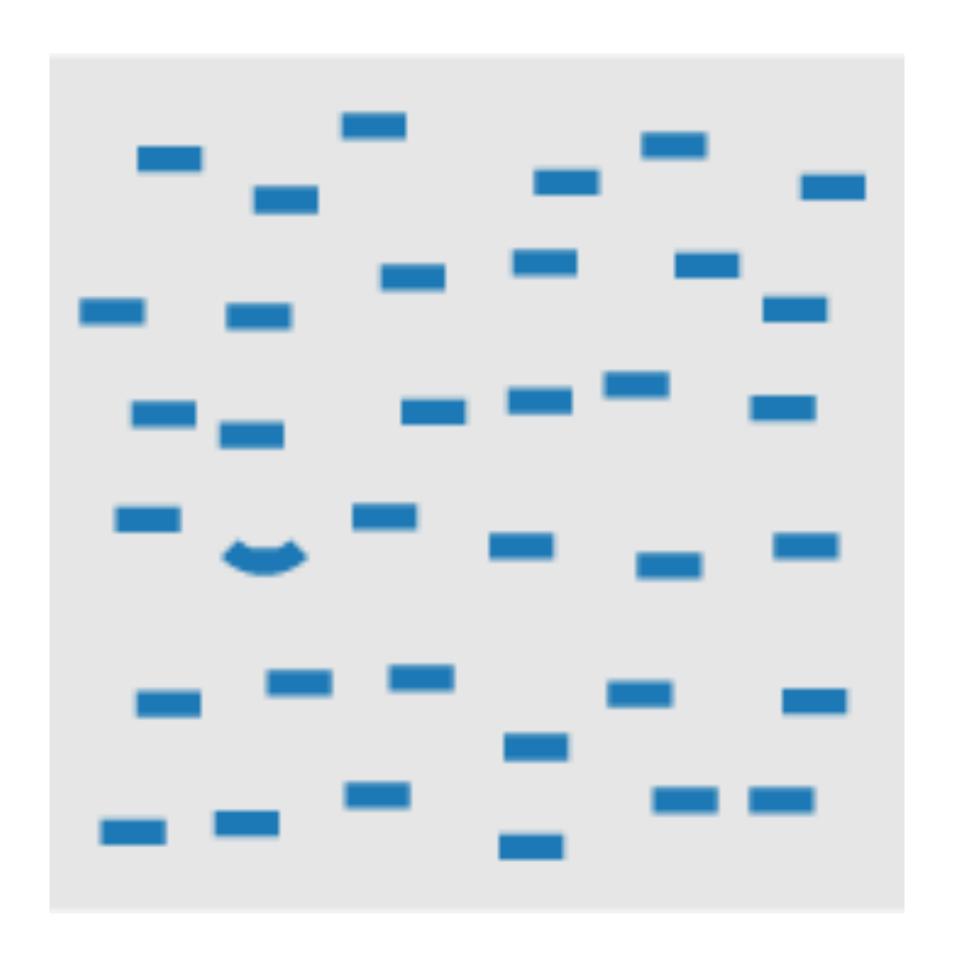


hue

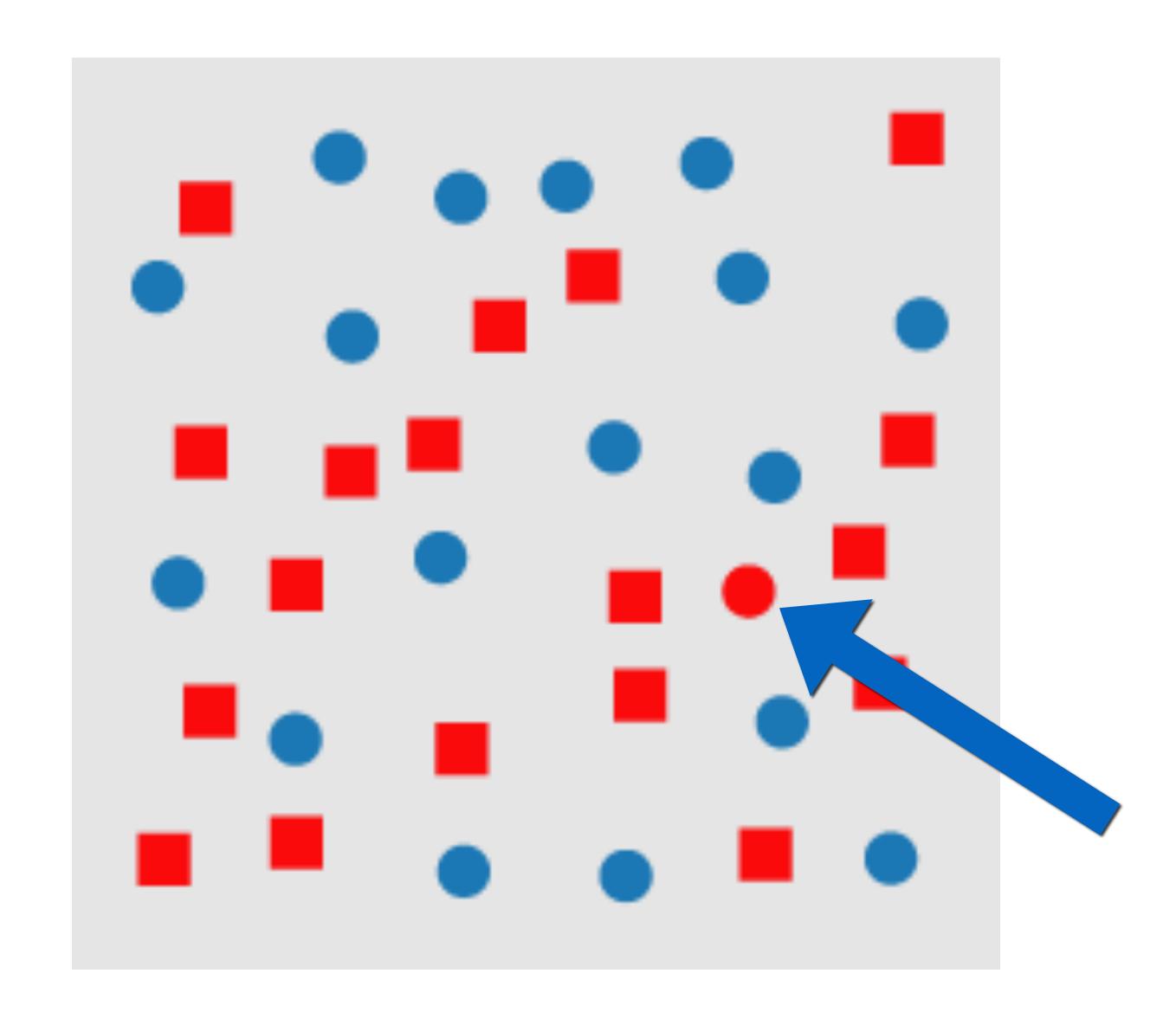


closure

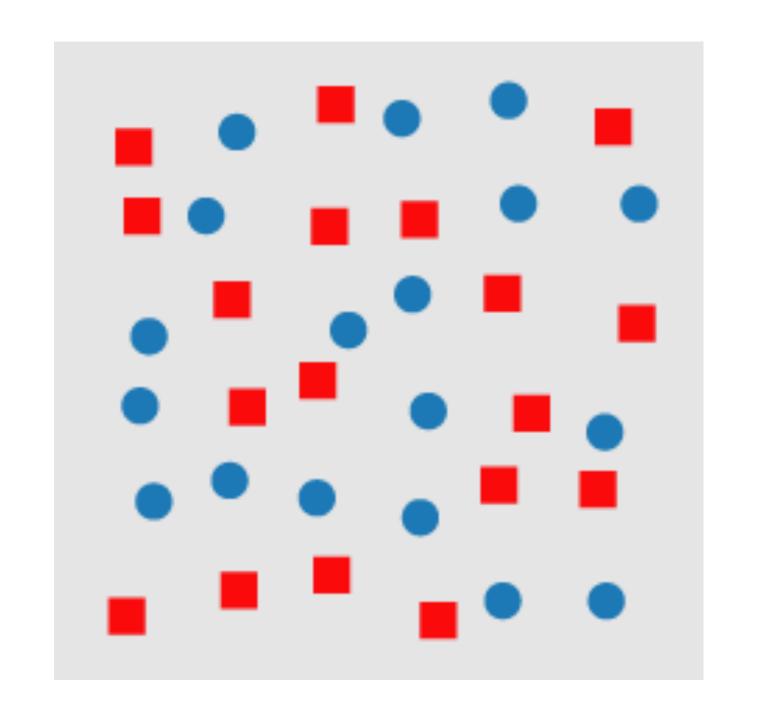


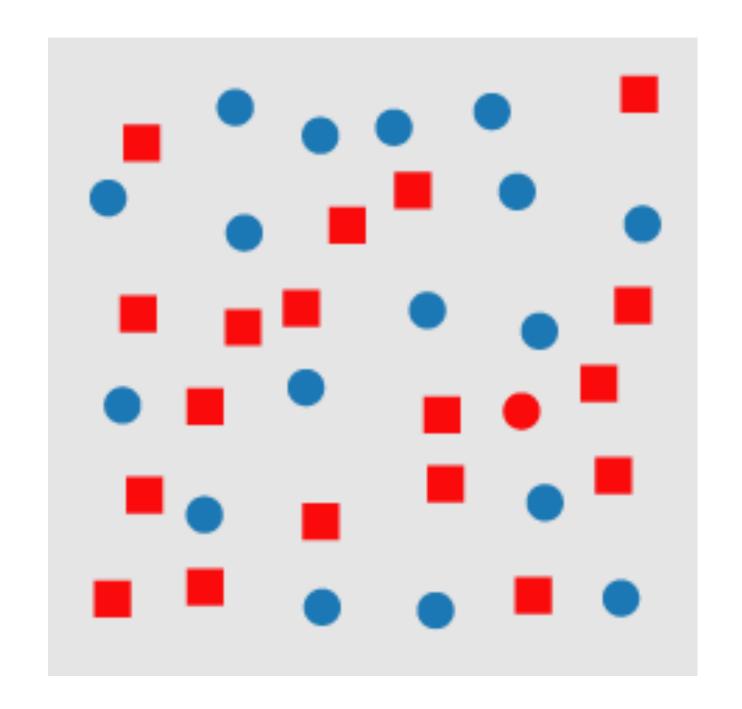


curvature



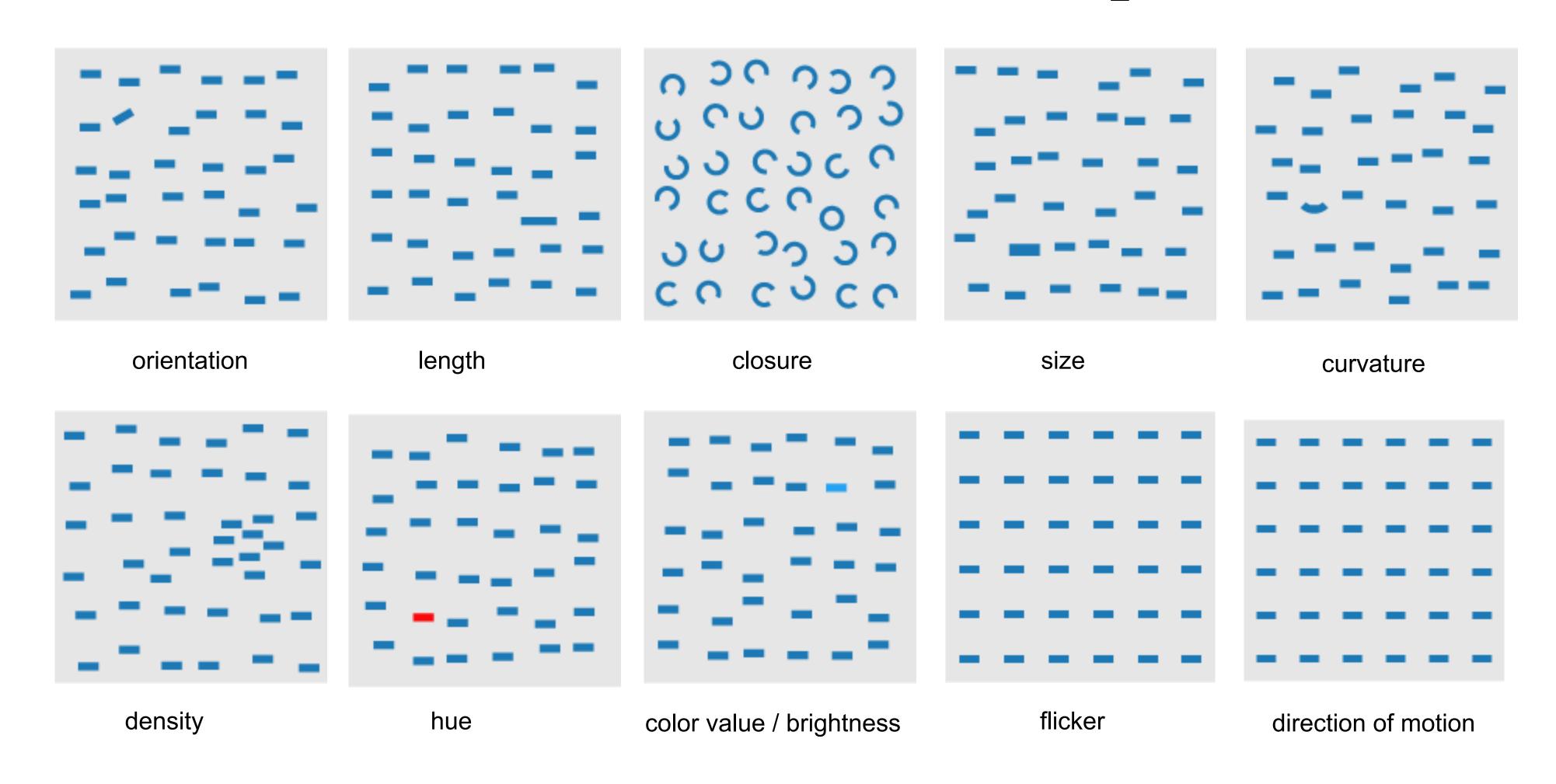
Not Valid for Combinations





Conjunction Targets – no unique visual property target: red, circle distractor objects have both properties

Some Preattentive Properties



Tasks

target detection

detect the presence or absence of a target

boundary detection

detect a texture boundary between two groups of elements, where all of the elements in each group have a common visual property

region tracking

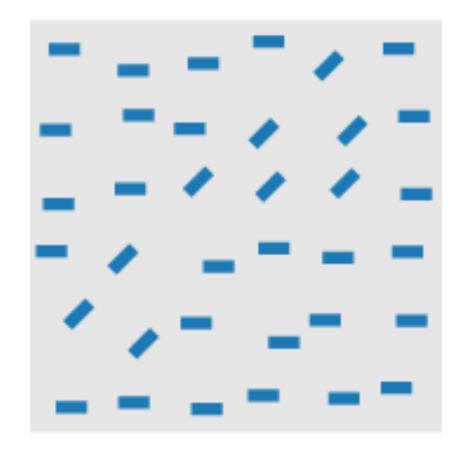
track one or more elements with a unique visual feature as they move in time and space

counting and estimation

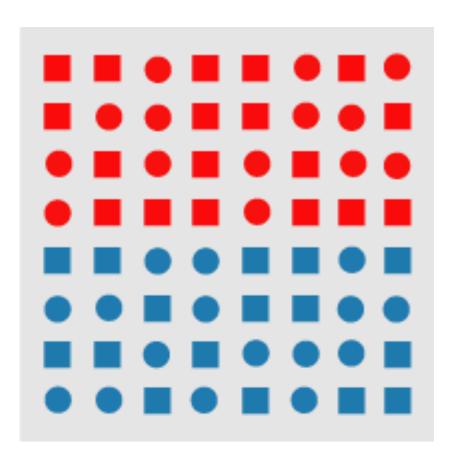
users count or estimate the number of elements with a unique visual feature.

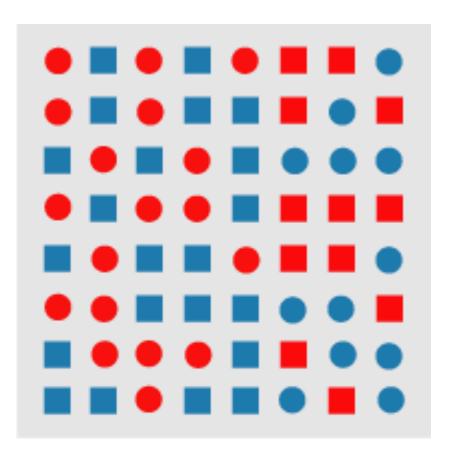
Tasks

Number Estimation

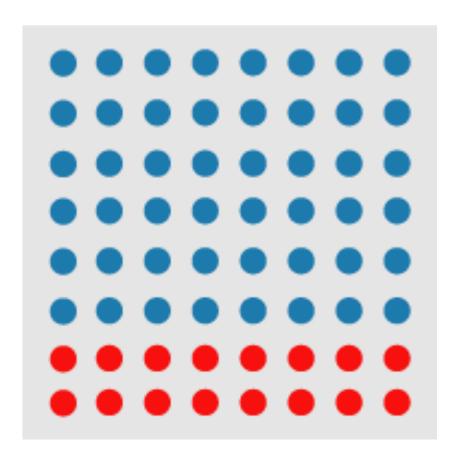


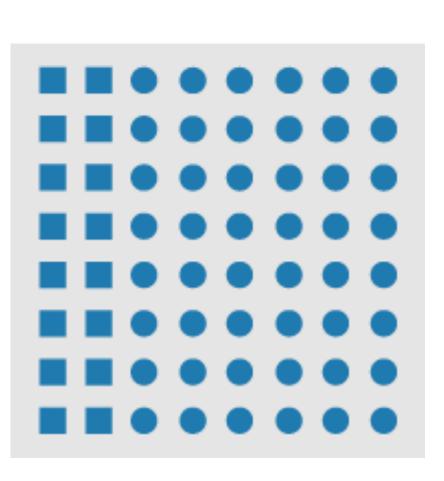
Boundary Detection

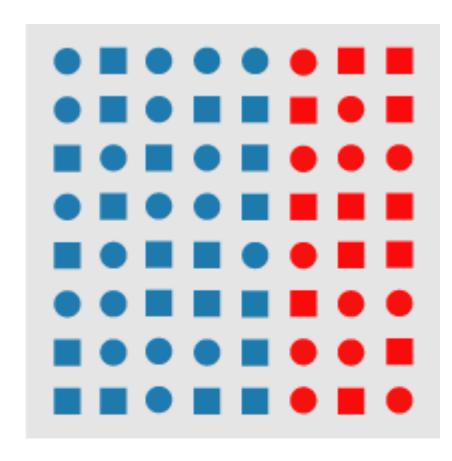


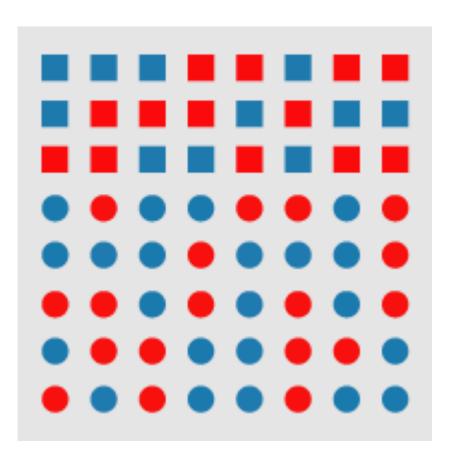


Hierarchy of Preattentive Features









Theories of Preattentive Processing

Not known for sure how it works

Several theories:

http://www.csc.ncsu.edu/faculty/healey/PP/index.html

Preattentive Processing in Vis

Can be used to draw attention to areas of interest
Can be used to express similarity/group memberships
Visual features must be carefully designed
Conjunctions must be avoided

Examples are "Cues" (Focus and Context technique)

Change Blindness

Change Blindness

Details of an image cannot be remembered across separate scenes

except in areas with focused attention

Interruption (e.g. a blink, eye saccade or blank screen) amplifies this effect

Not failure of vision system

failure due to inappropriate attentional guidance



Ron Rensink 2002





Ron Rensink 2002



Ron Rensink 2002



Change Blindness

Various theories about causes

Overwriting: Information that was not abstracted is lost

First Impression: Only initial view is abstracted

Nothing is Stored: Only abstract concepts are committed to memory

Everything is Stored, Nothing is Compared: We compare only when we are forced to

Feature Combination: scenes are combined as long as they make sense

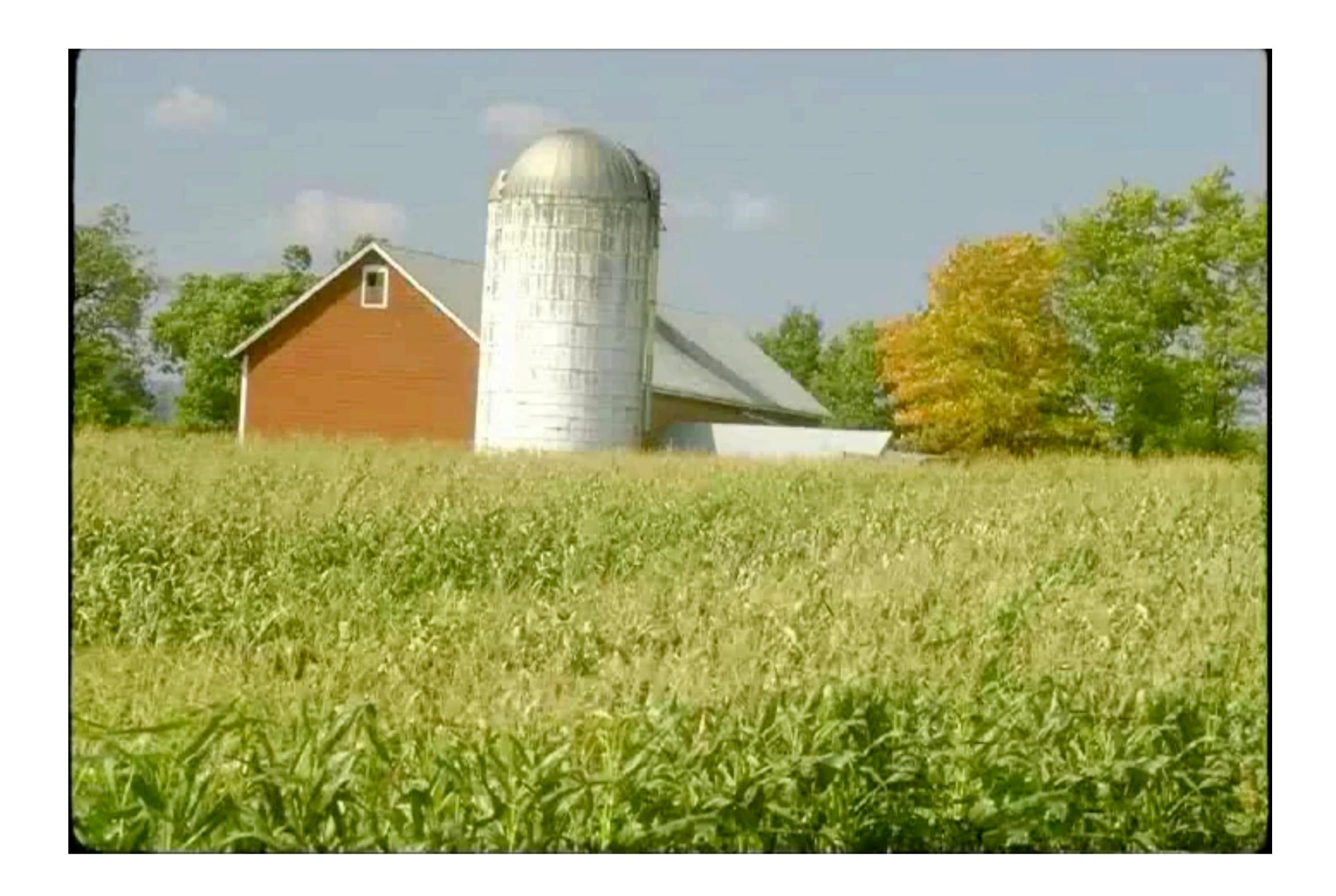
Influencing factors

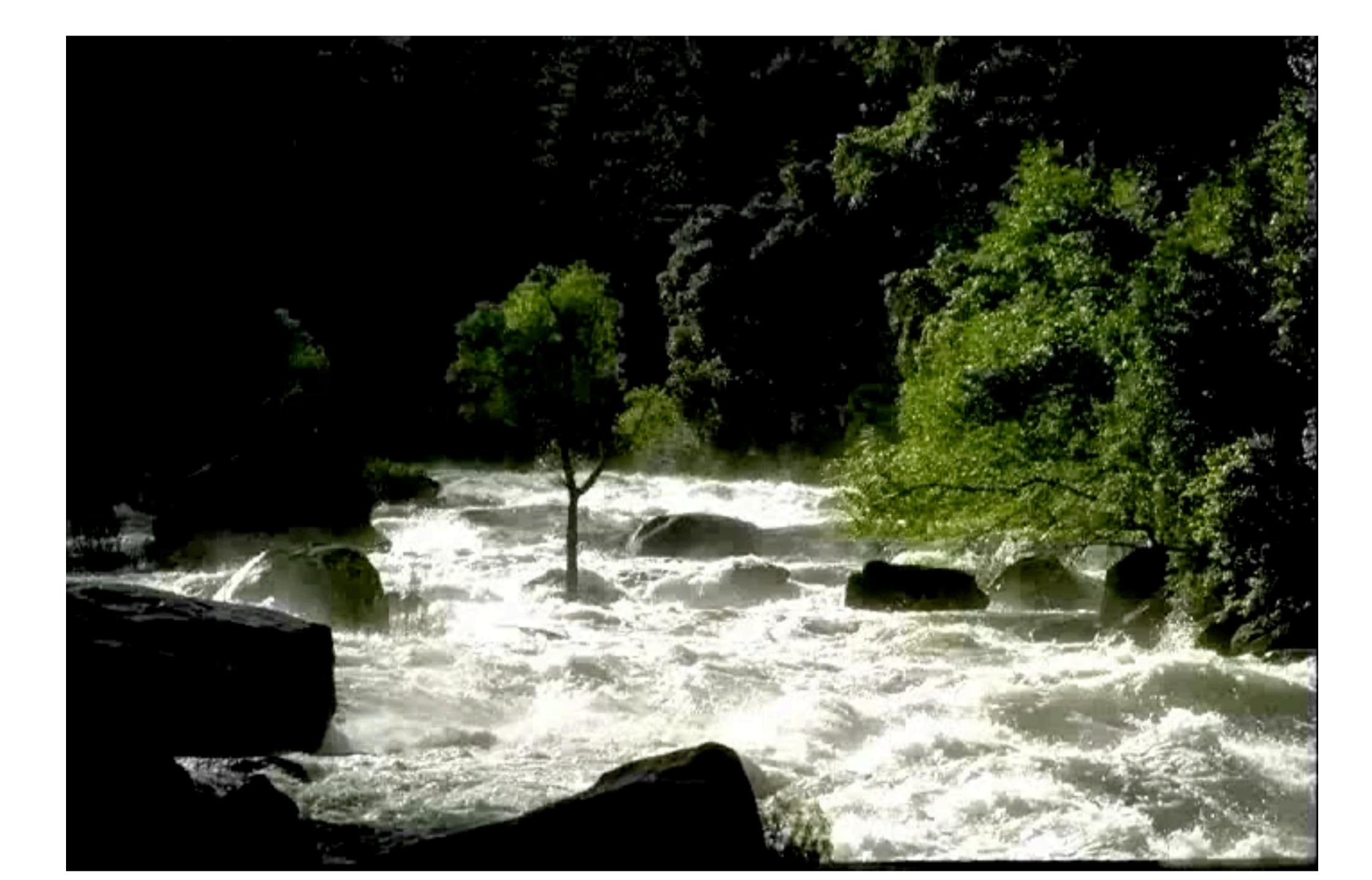
attention

expectation (knowing something will change)

semantic importance of changed object

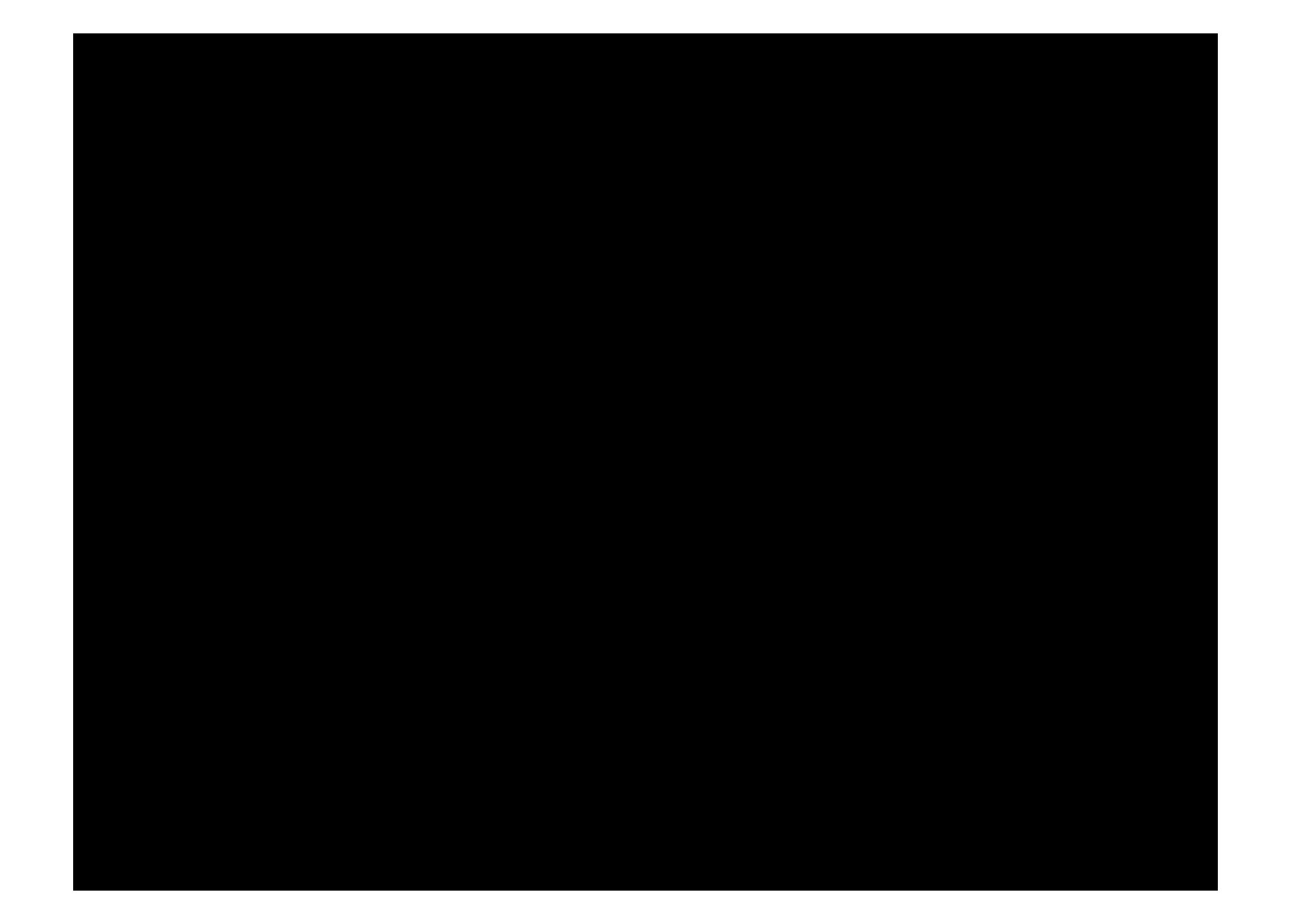
low level object properties overlooked more easily







Attention Blindness





Transport for London

Take Home Points

To find meaning in what we see we must selectively pay attention to what is important

Low-level vision is driven by object features rather than a conscious effort where to look (e.g., pre-attentive processing)

Attention is driven by preexisting knowledge, expectations, and goals stored in long-term memory

Gestalt Principles

Wertheimer, 1923, and recent extensions

Gestalt Principles

Patterns that transcend the visual stimuli that produced them

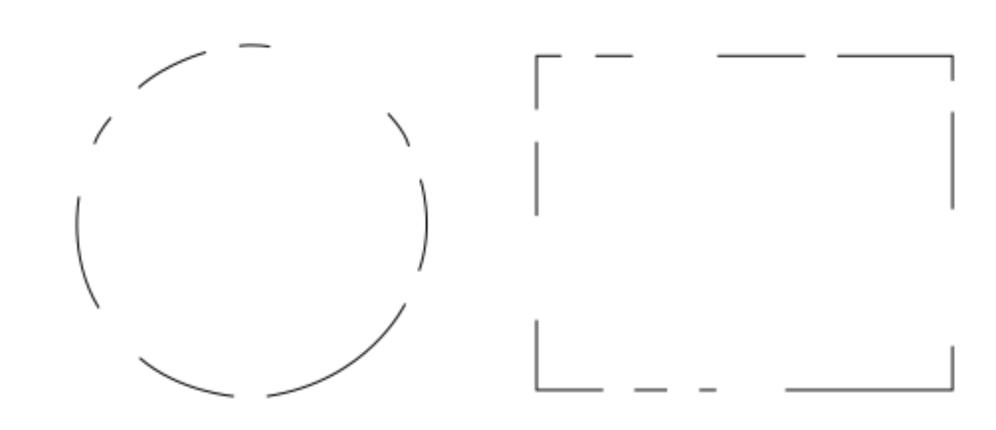
- Das Ganze ist etwas anderes als die Summe seiner Teile.
- The whole is something else than the sum of its parts.

Kurt Koffka

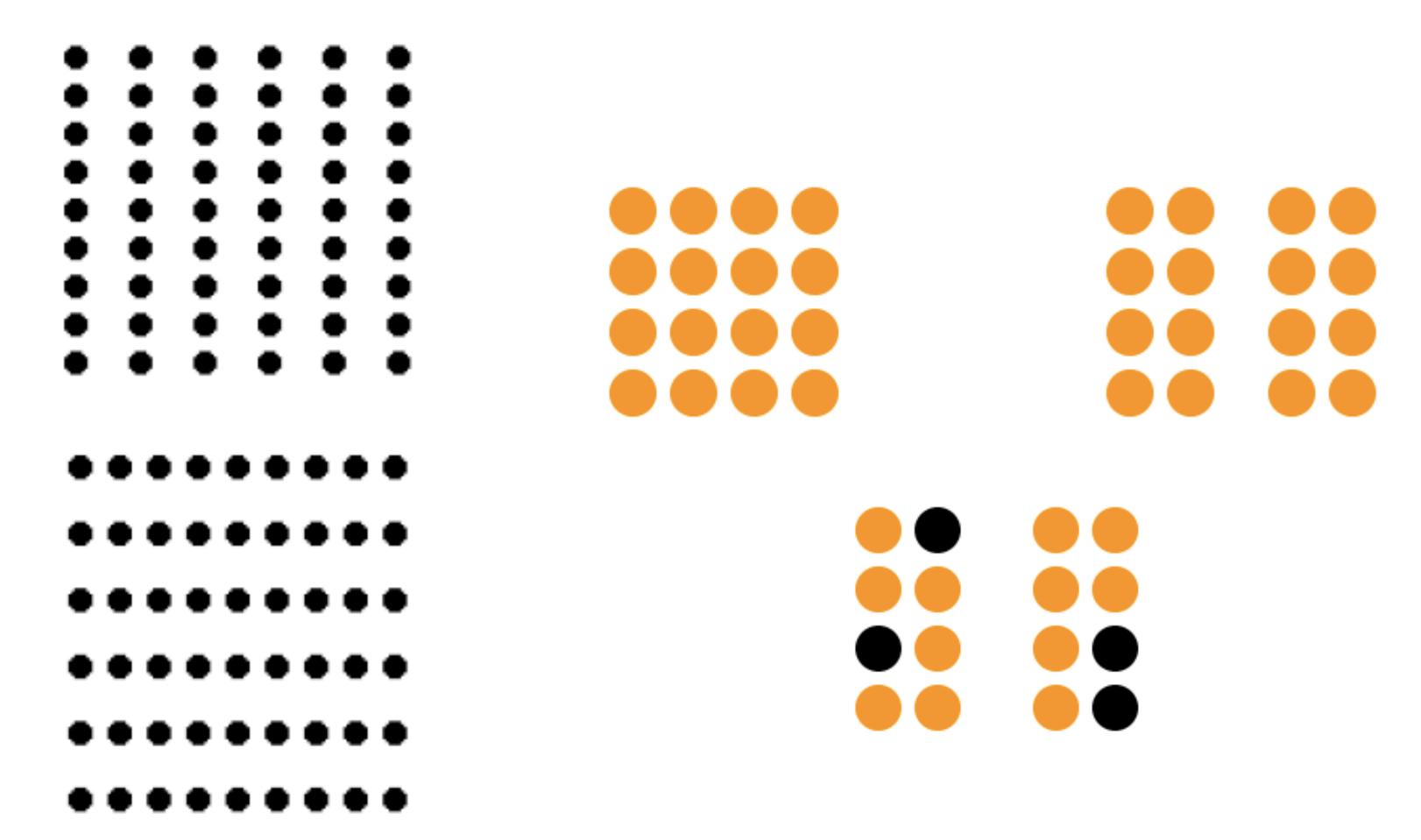
Disagreed with the

-The whole is greater than the sum of the parts.

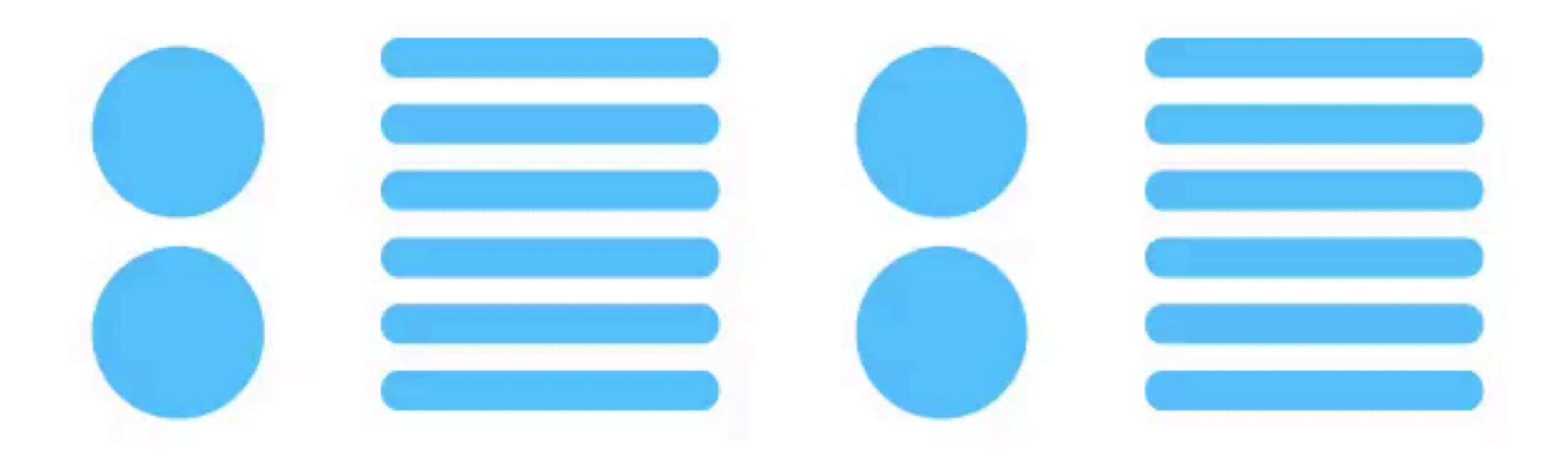
quote which is attributed to Aristoteles



Proximity



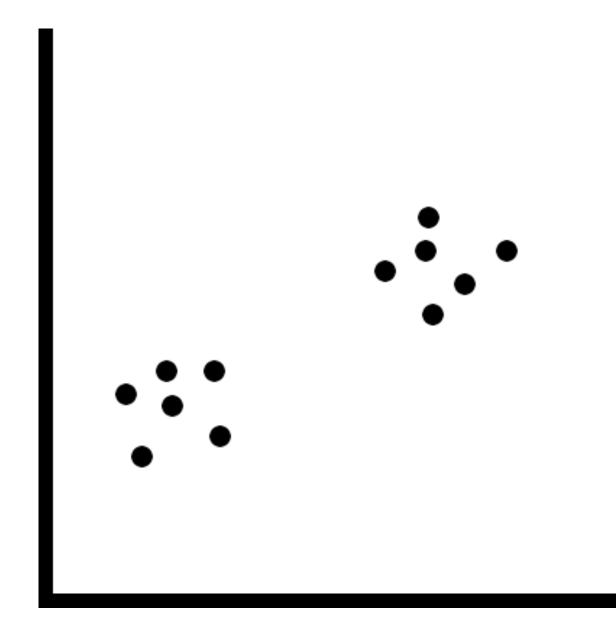
Law of proximity



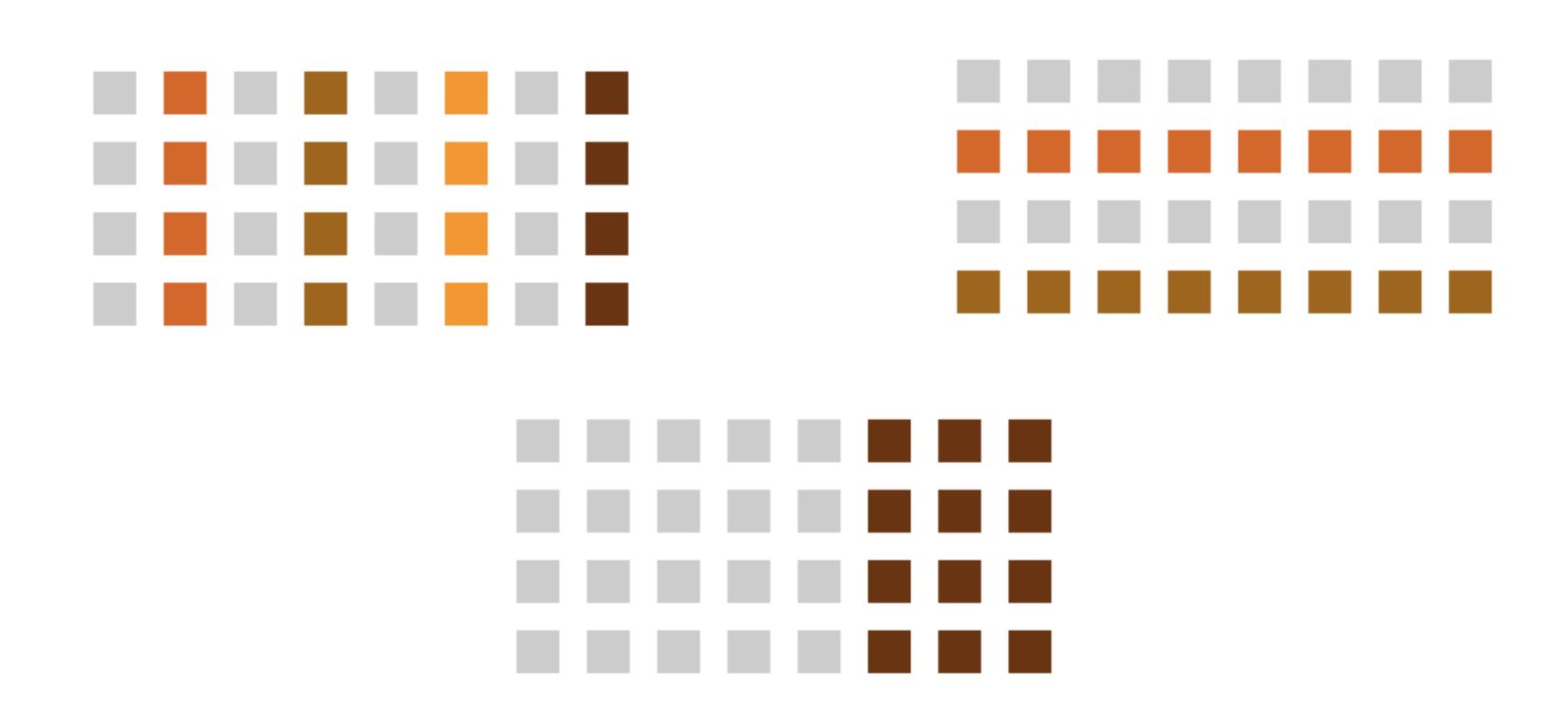
4 columns

Proximity

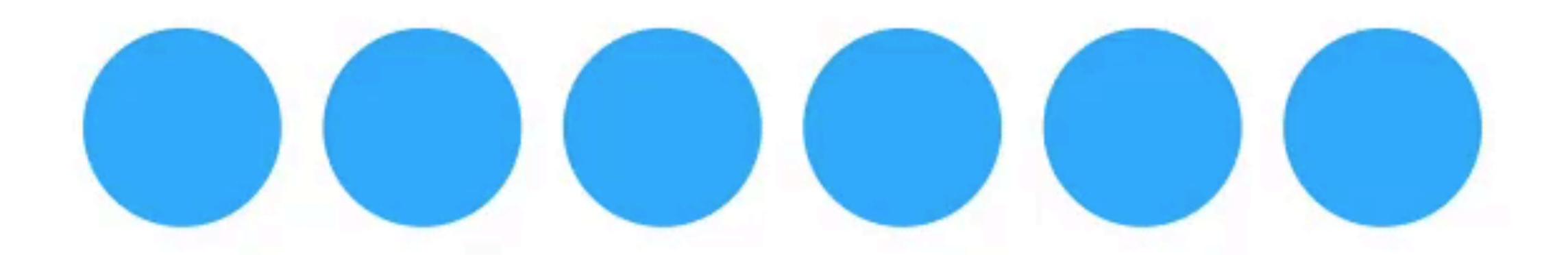
Grouping/linking by placing entities in close proximity



Similarity

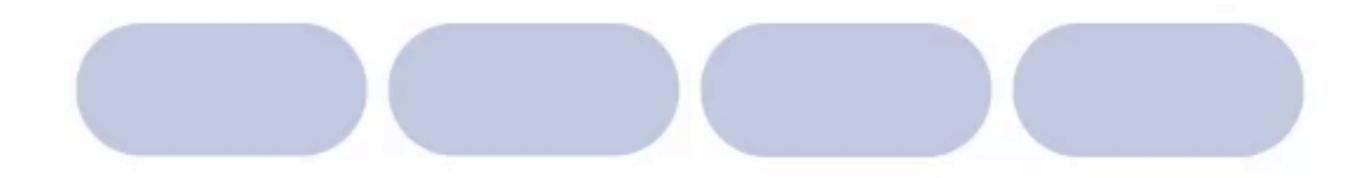


Similarity Principle



1 group

Focal Point



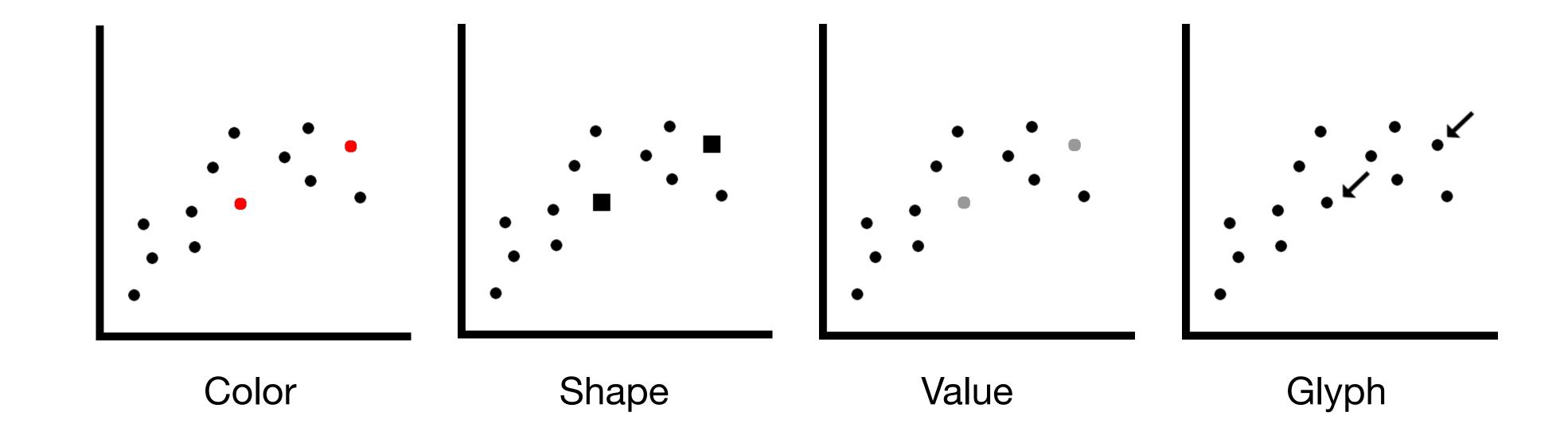
No focus

Similarity

Co-modulation of a channel

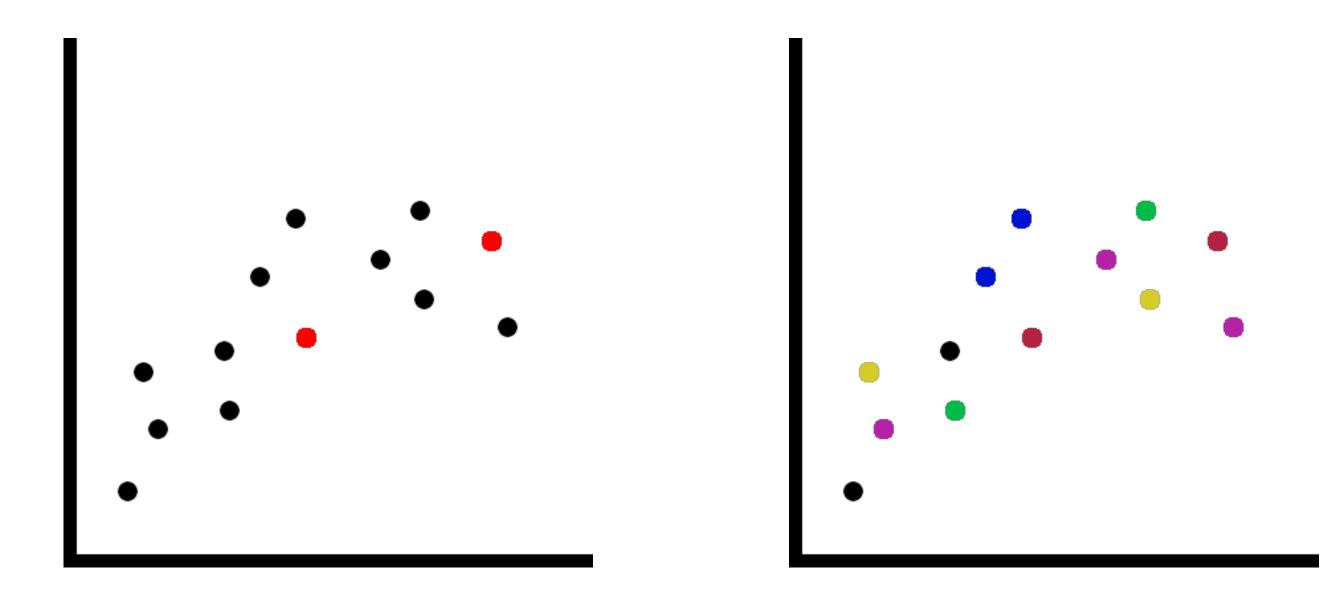
color, shape, size, value, orientation, texture, ...

Adding a glyph, label, frame, background



Color – Perception Issues (1/2)

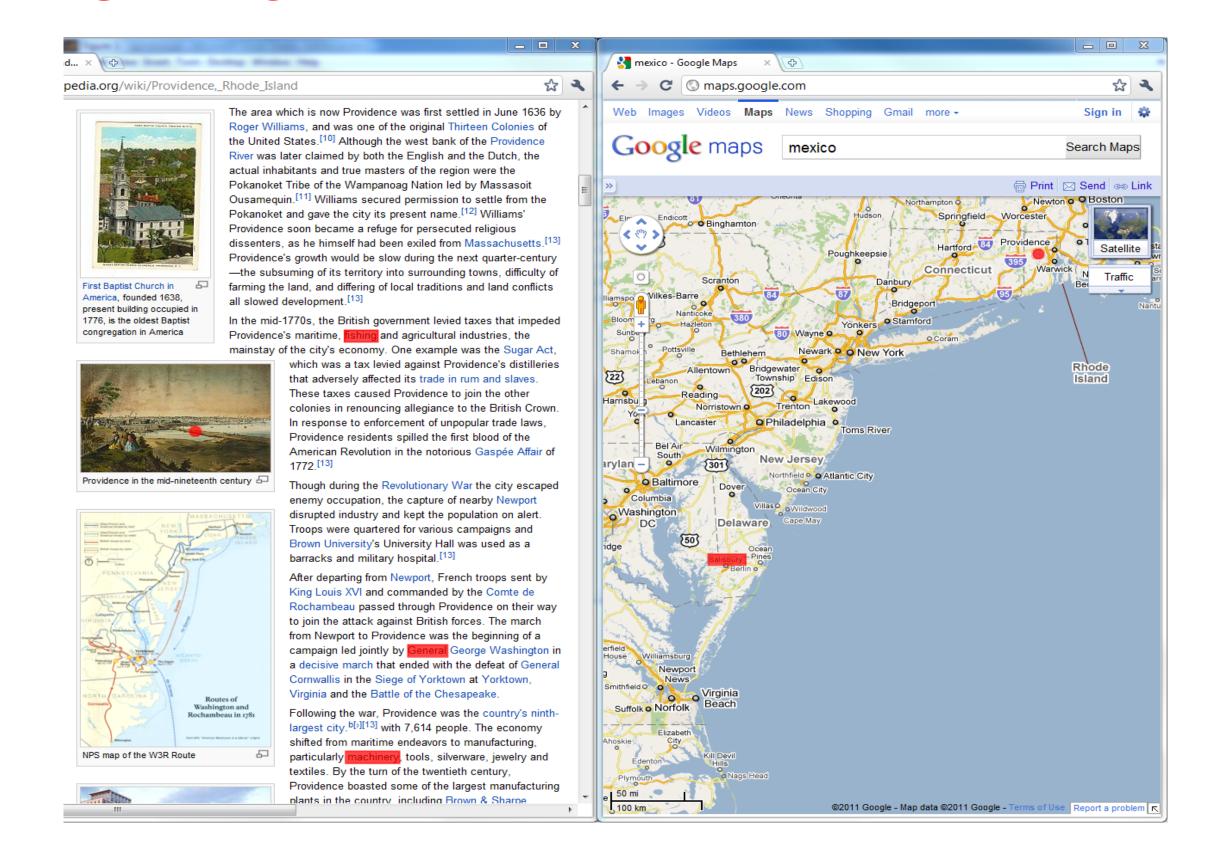
Popout properties: Very good for 1-2 simultaneous, serial search for more



Color - Perception Issues (2/2)

Slower in a cluttered environment

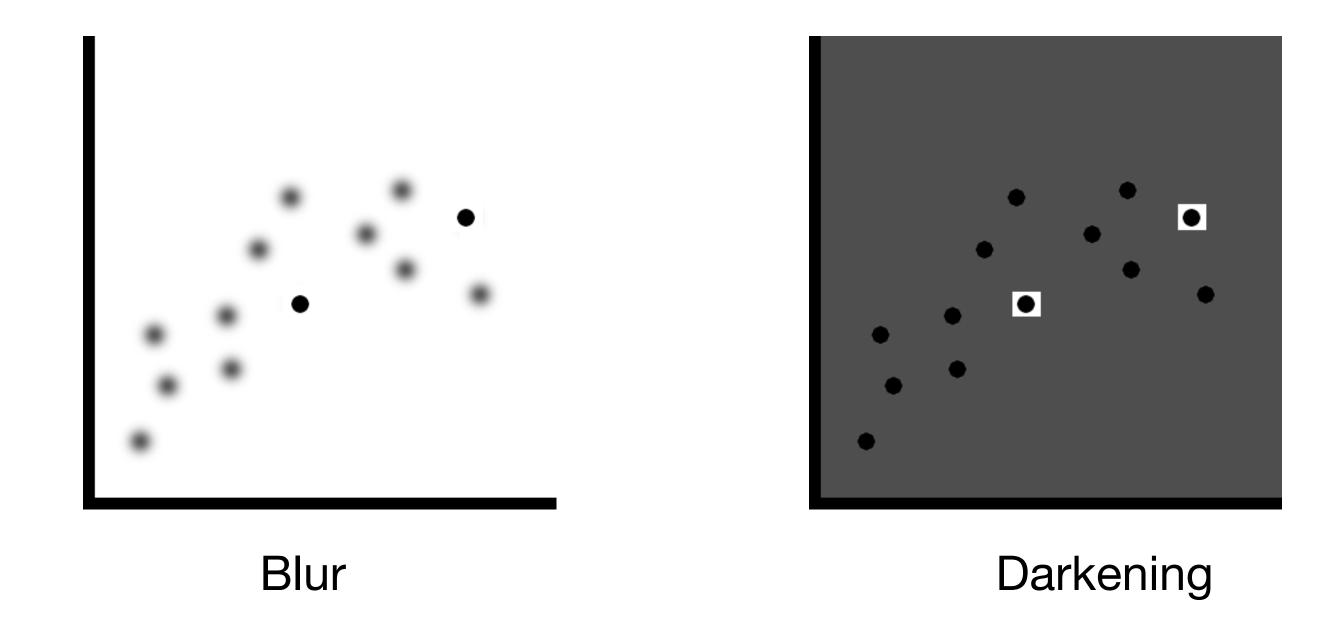
Size of colored object relevant.



Similarity

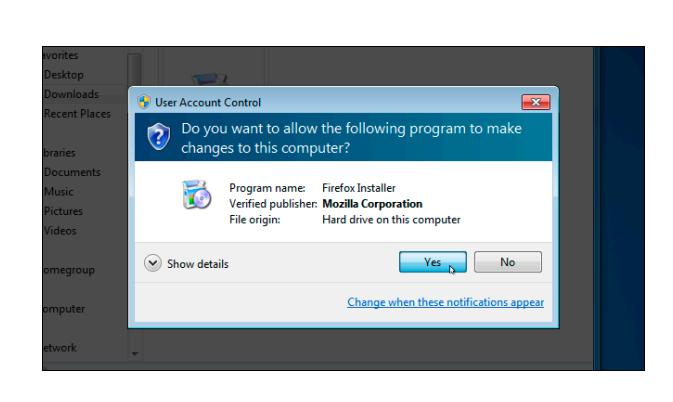
Modulate everything else

Blurring, darkening, desaturating, etc.

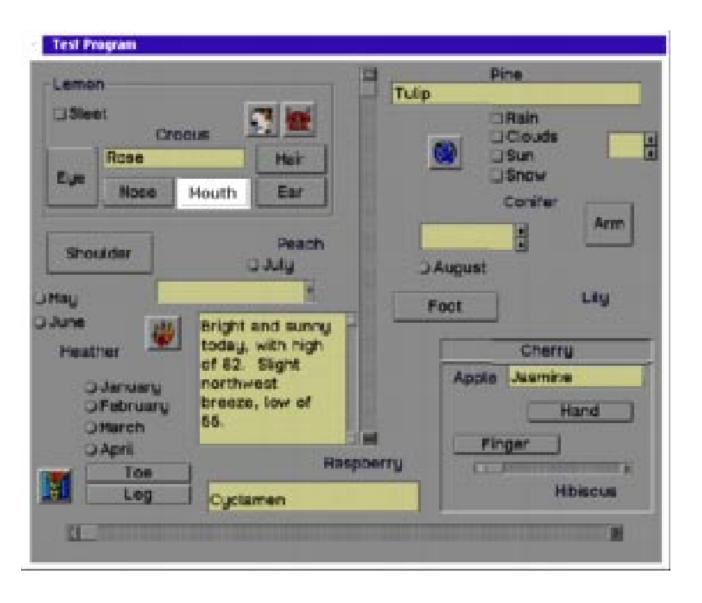


Modulating Everything Else: Recommendation, Example

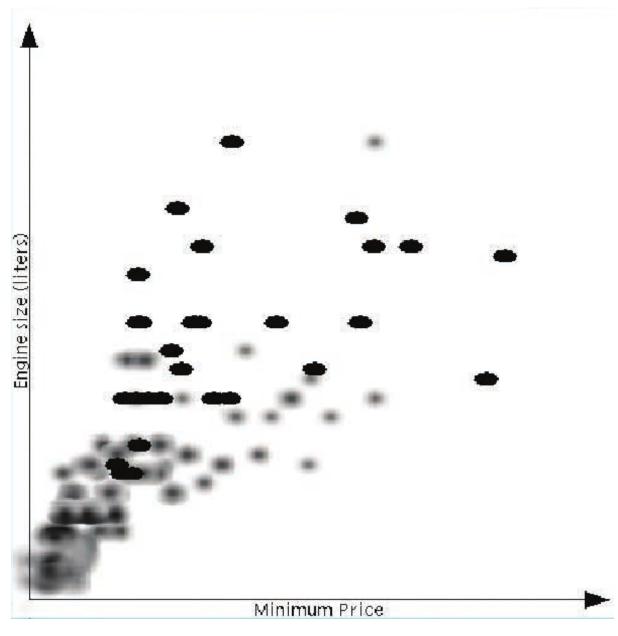
Don't use unless the sole objective is to guide attention toward one (set of) items



[MS Windows User Account Control]

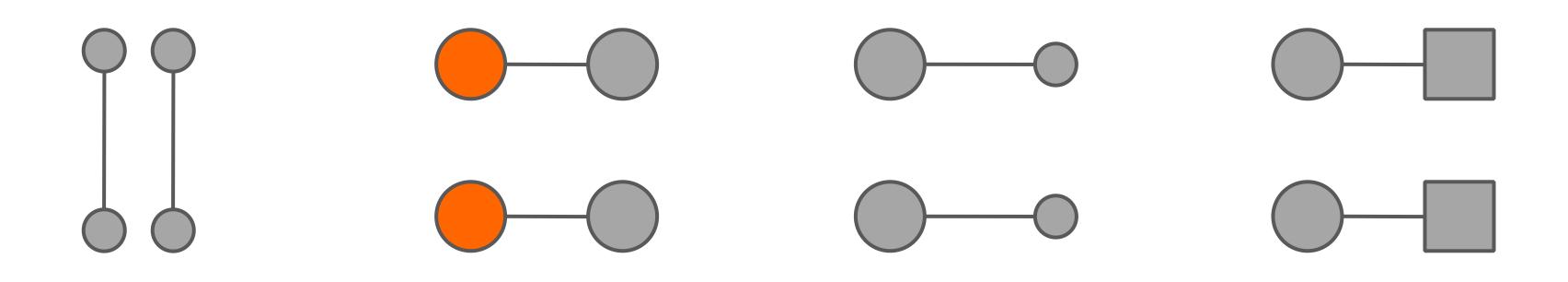


[Zhai et al., 1997]



[Kosara et al., 2002]

A Little Experiment...



Proximity Color Size Shape

Connectedness and Common Region

Connected items with a line or curve

Surround items with a outline, surface, volume



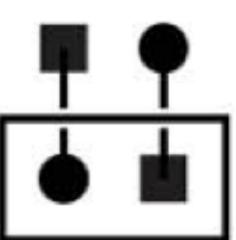
Enclosure / Common Region

Similarity

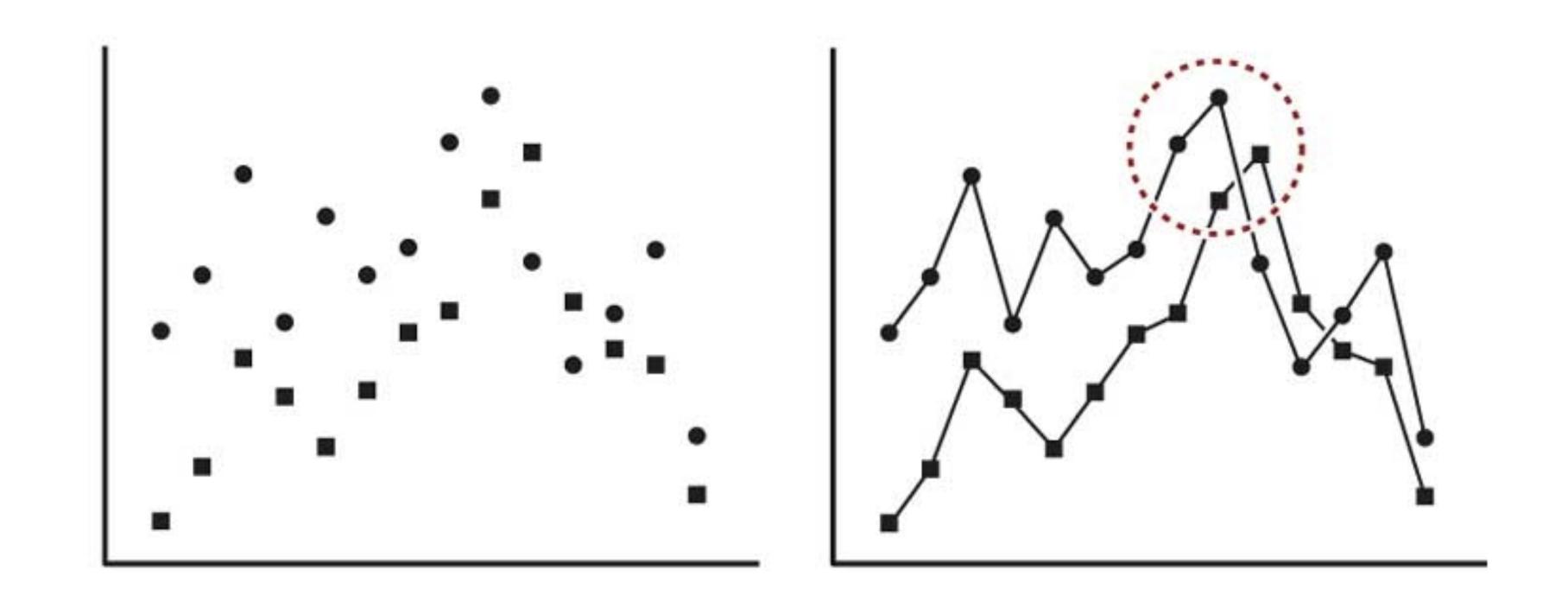
•

Connection

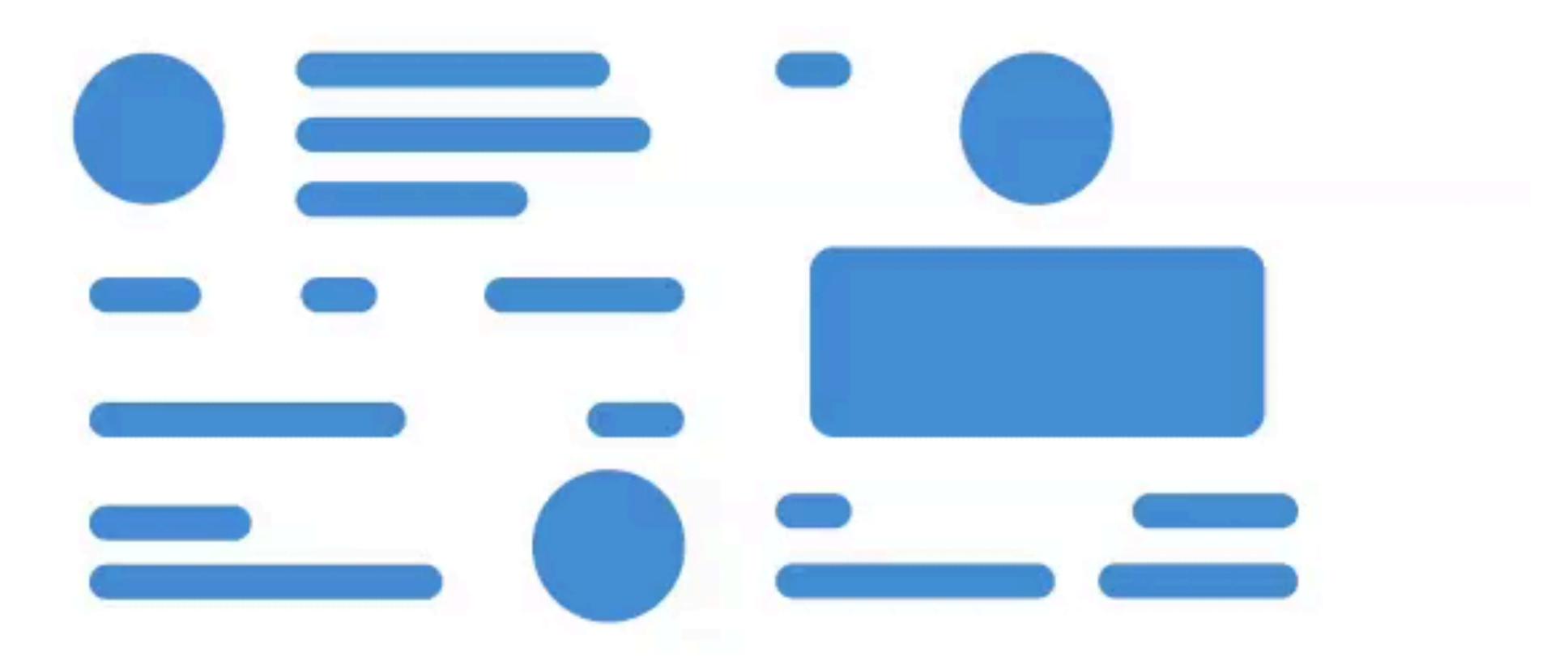
Enclosure



Connectedness / Enclosure



Common Region



Scattered elements

Connectedness Varieties

Bubble Sets

Line Sets

Kelp Diagrams

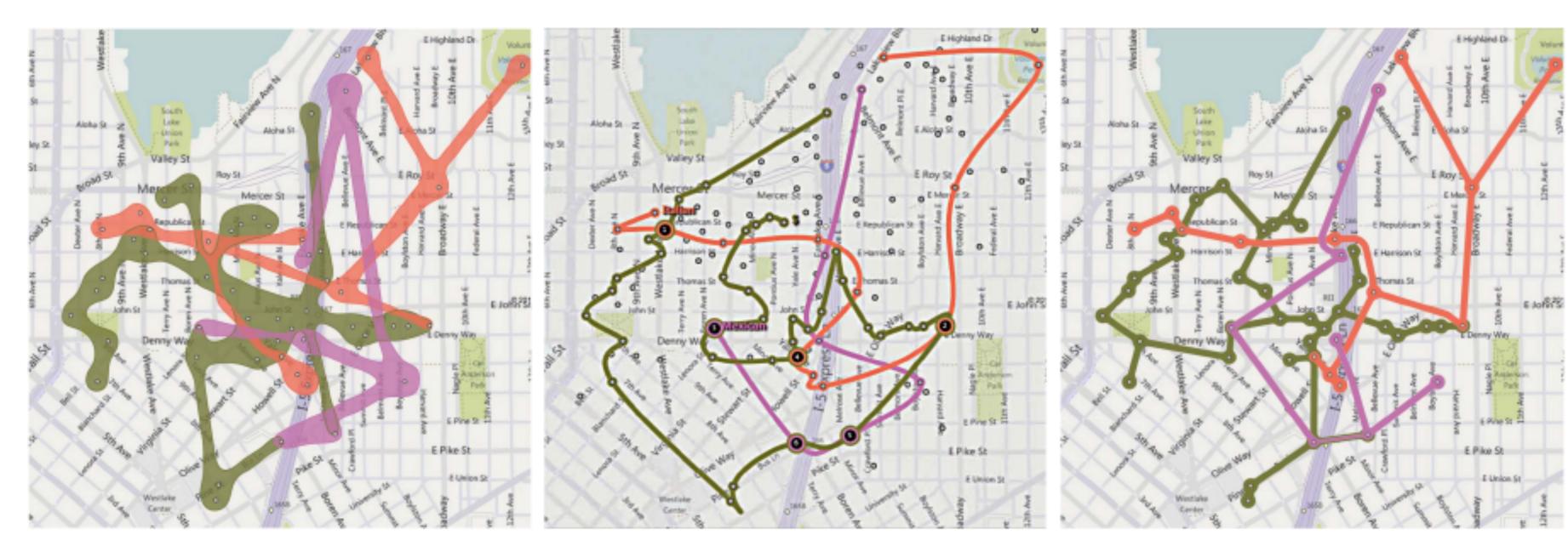
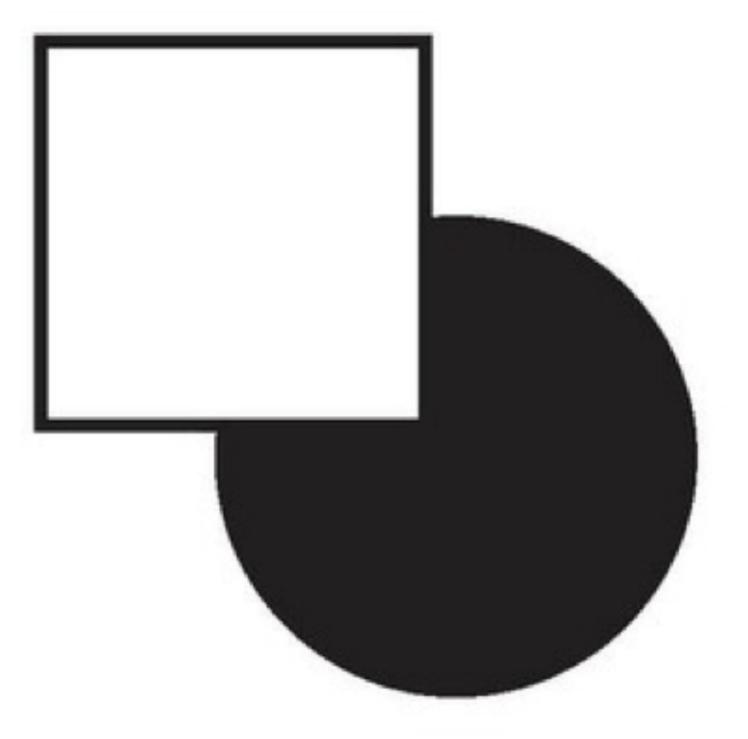


Image by [Dinkla et al., 2011] Technique by [Collins et al., 2009]

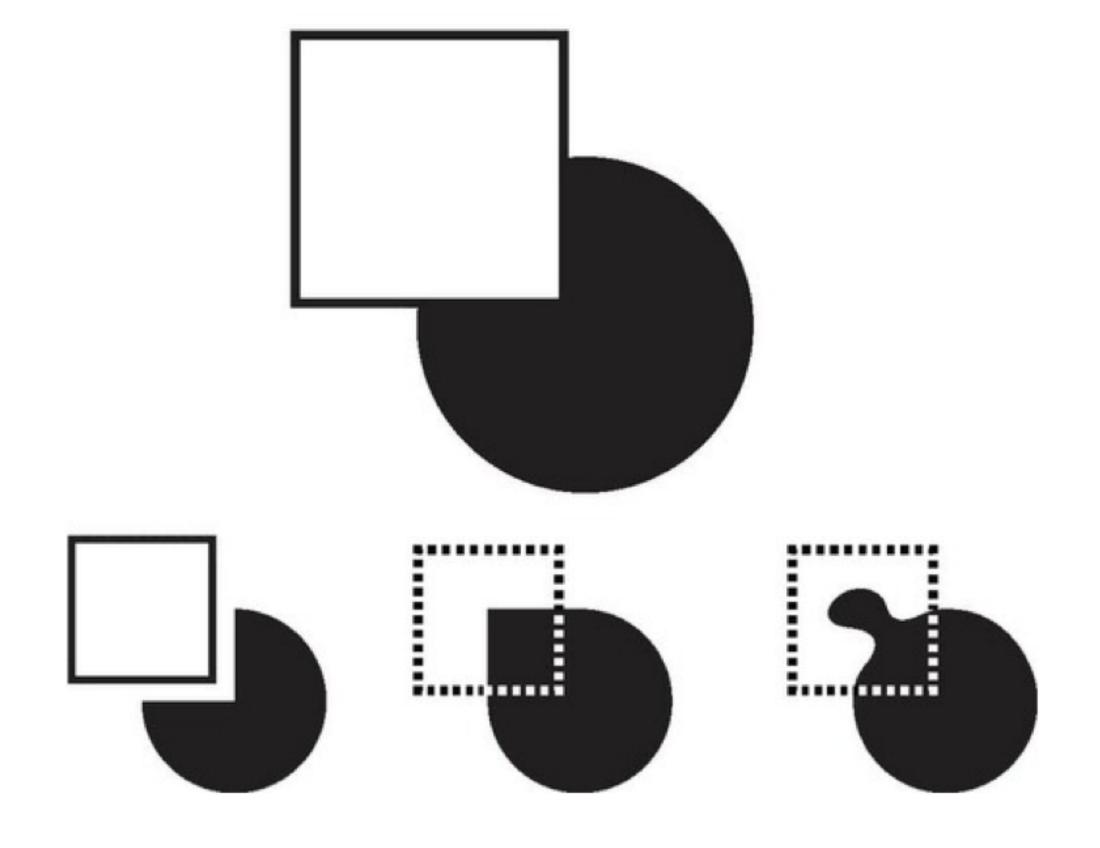
[Alper et al., 2011]

[Dinkla et al., 2012]

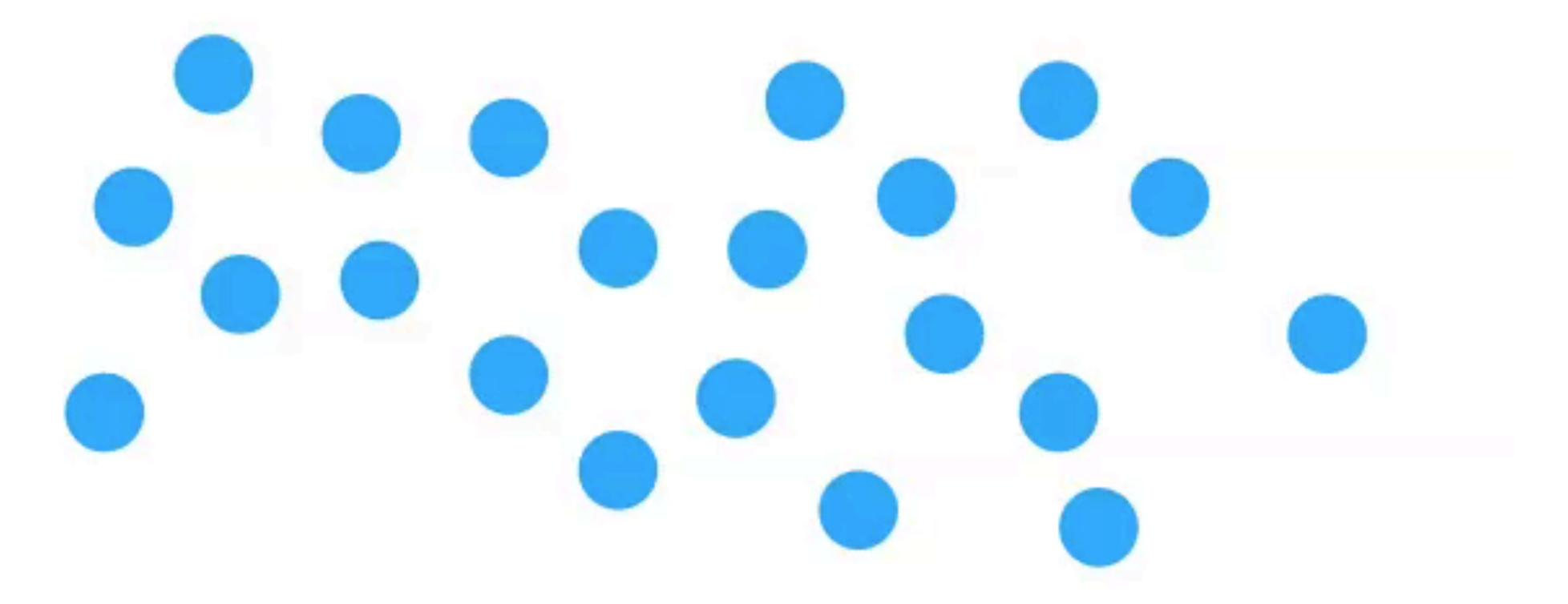
Continuity



Continuity



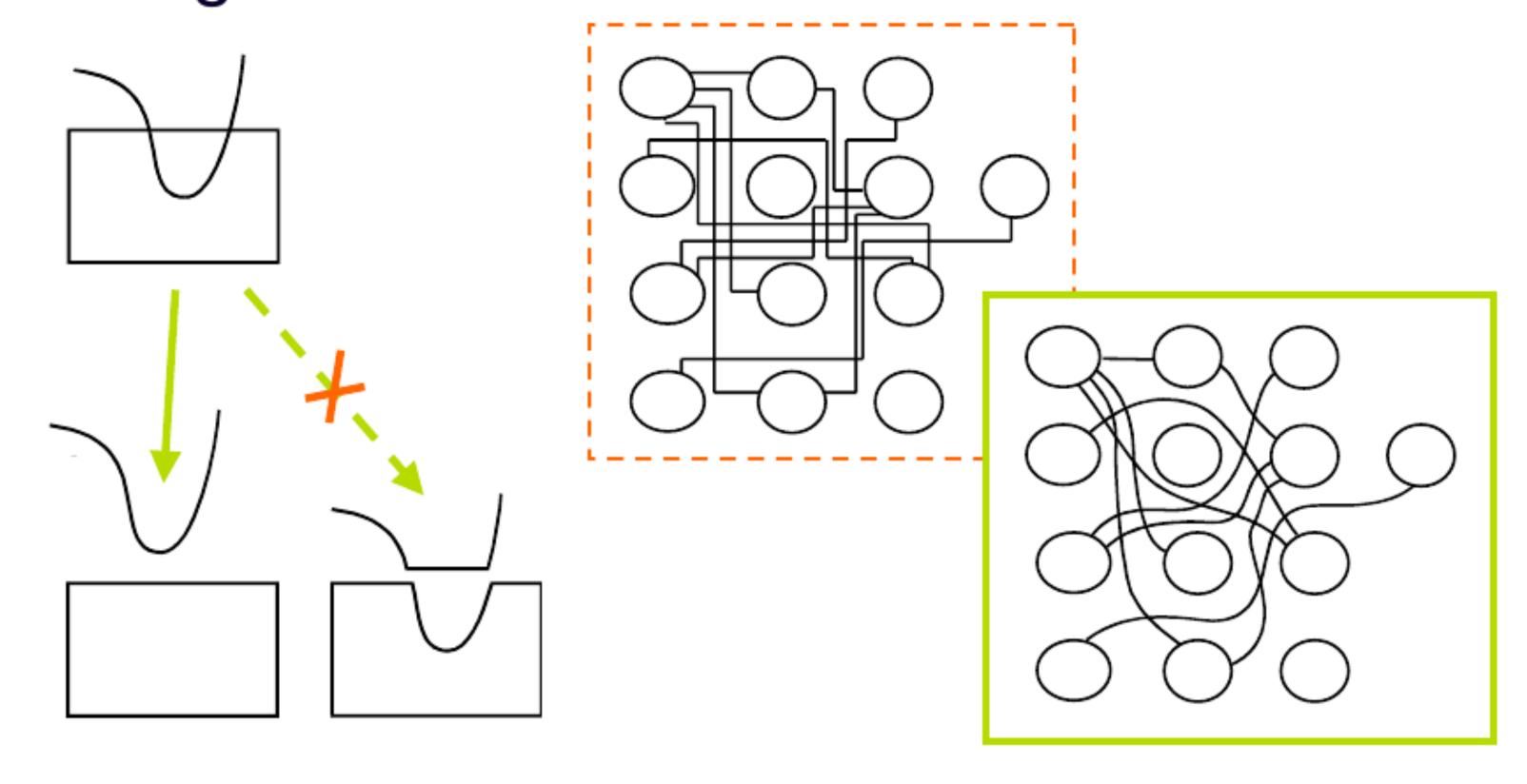
Continuity Principle



Scattered elements

Continuity

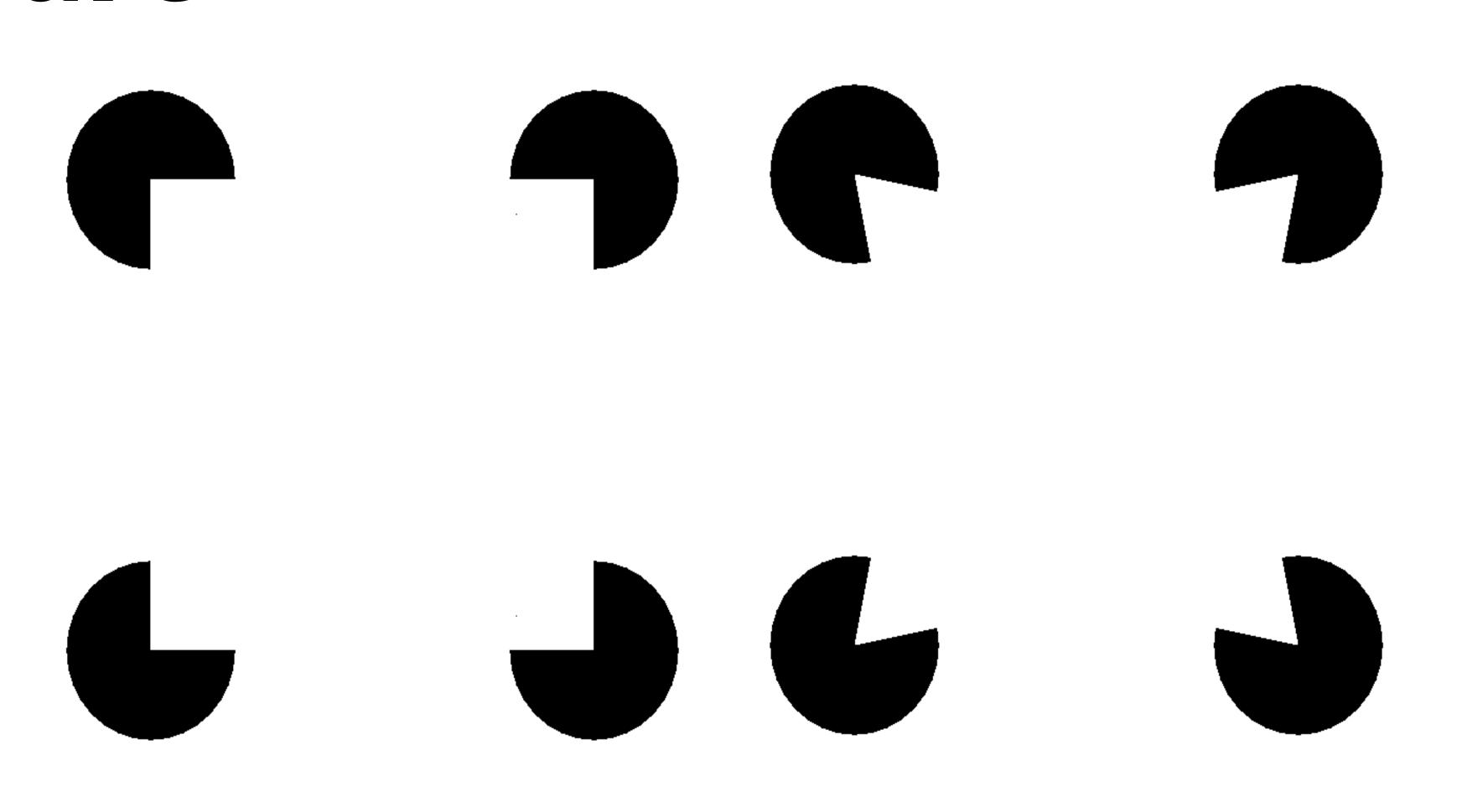
Things: smooth & continuous



Closure / Completion



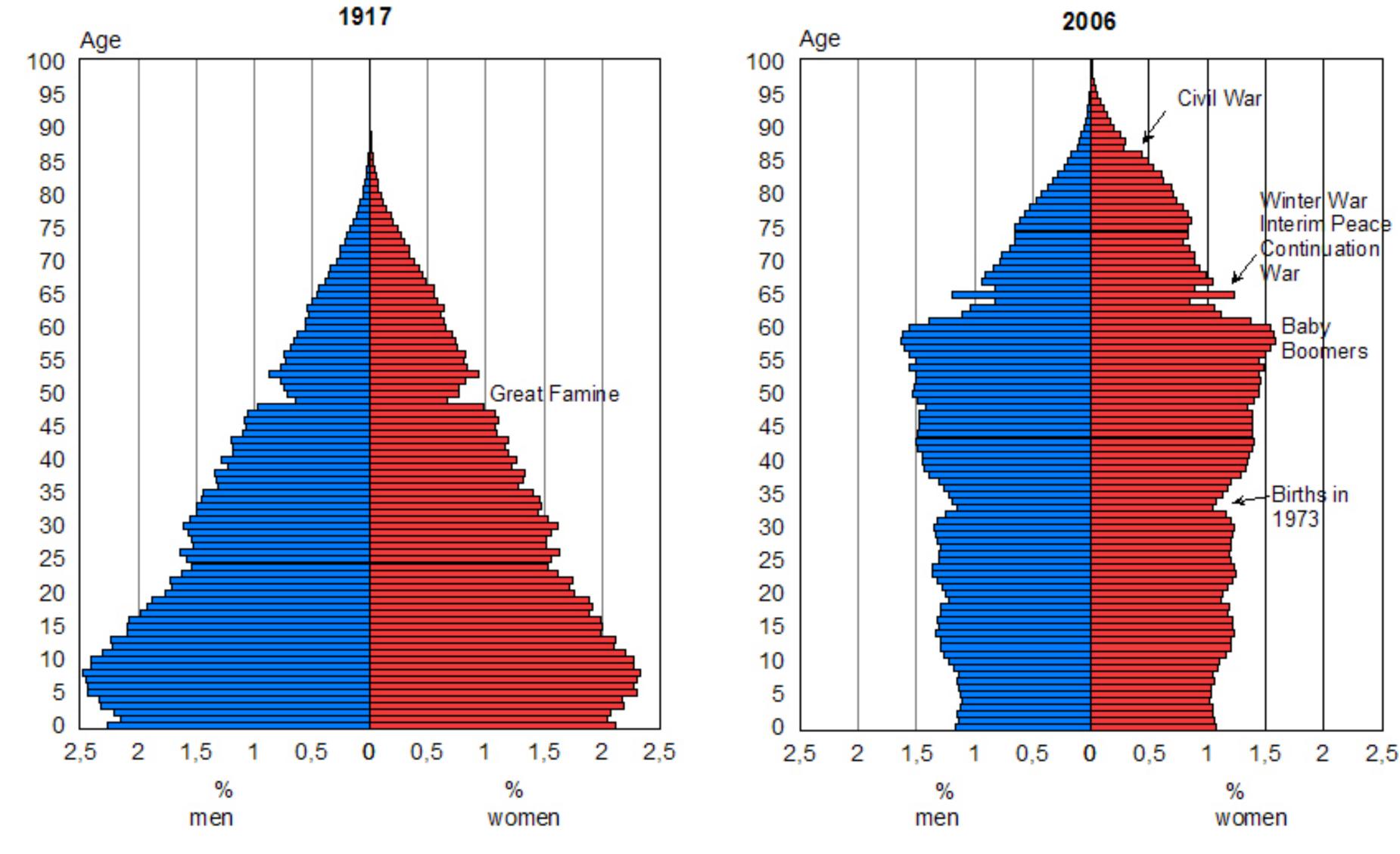
Closure



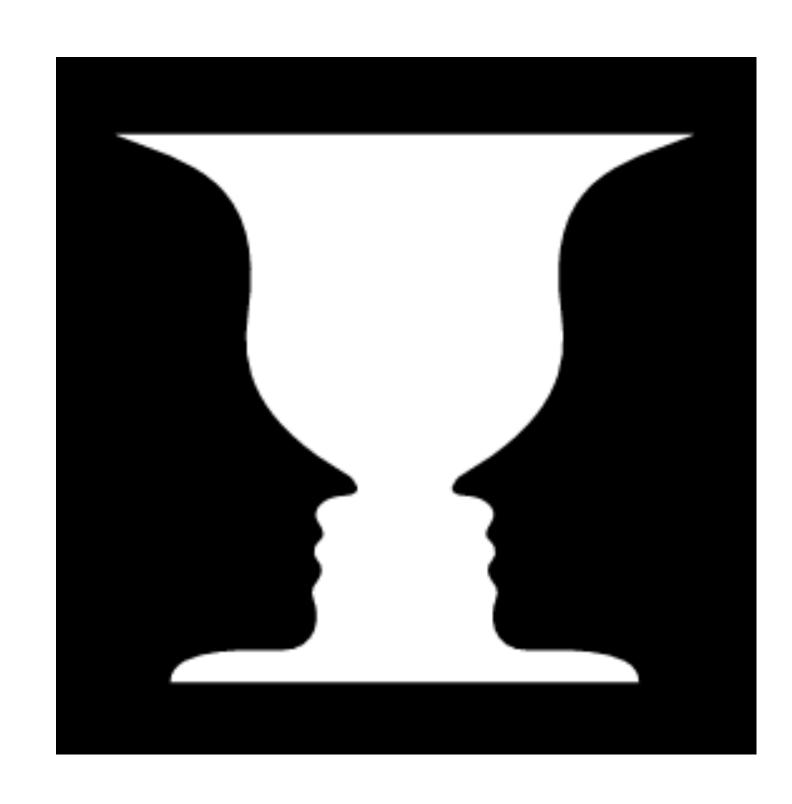
Symmetry

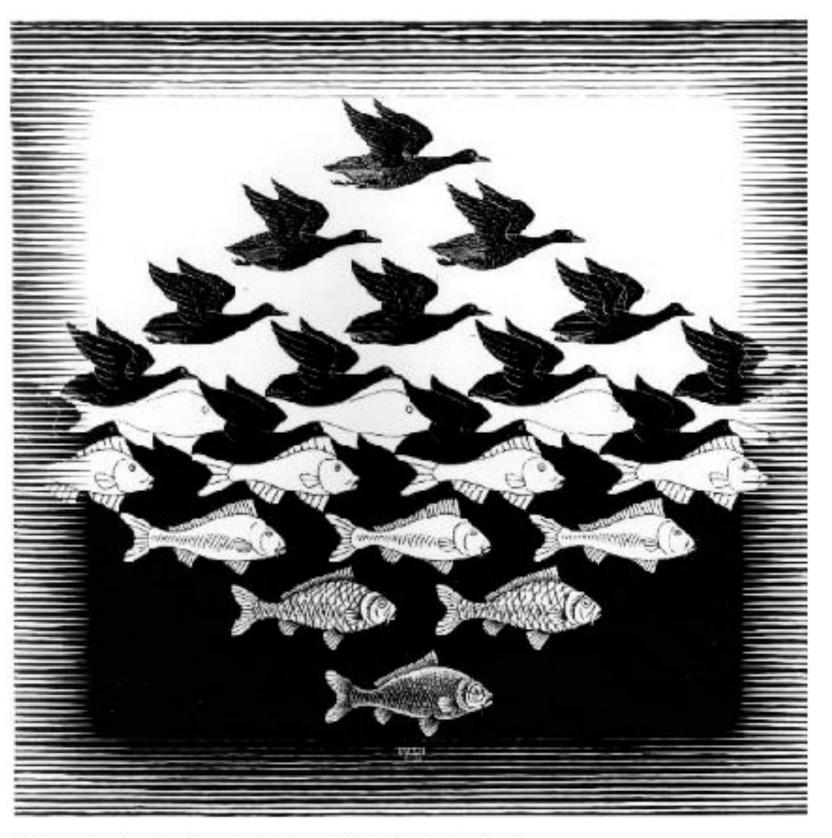
Things: symmetric figure? figure! figure!

Population Pyramid



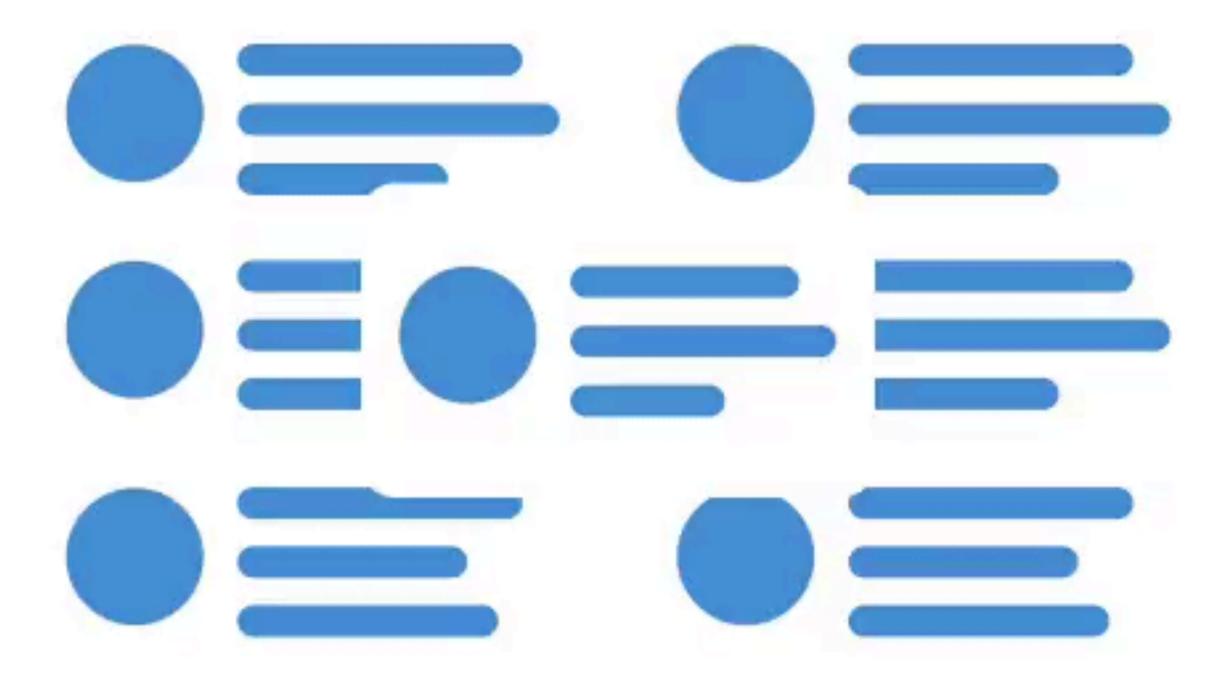
Figure/Ground





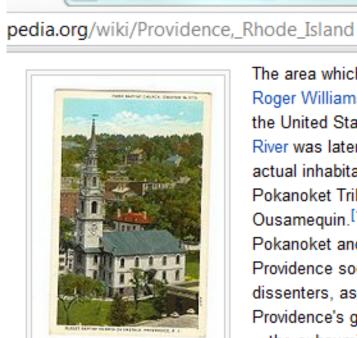
M.C. Escher: Sky and Water I 1938 woodcut

Figure-Ground Articulation



No separation

Applications in Uis



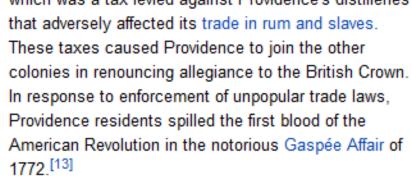
d... × (分)

First Baptist Church in -America, founded 1638, present building occupied in 1776, is the oldest Baptist congregation in America

The area which is now Providence was first settled in June 1636 by Roger Williams, and was one of the original Thirteen Colonies of the United States.^[10] Although the west bank of the Providence River was later claimed by both the English and the Dutch, the actual inhabitants and true masters of the region were the Pokanoket Tribe of the Wampanoag Nation led by Massasoit Ousamequin.[11] Williams secured permission to settle from the Pokanoket and gave the city its present name. [12] Williams' Providence soon became a refuge for persecuted religious dissenters, as he himself had been exiled from Massachusetts.[13] Providence's growth would be slow during the next quarter-century —the subsuming of its territory into surrounding towns, difficulty of farming the land, and differing of local traditions and land conflicts all slowed development.[13]

In the mid-1770s, the British government levied taxes that impeded Providence's maritime, fishing and agricultural industries, the mainstay of the city's economy. One example was the Sugar Act,

> which was a tax levied against Providence's distilleries that adversely affected its trade in rum and slaves. These taxes caused Providence to join the other In response to enforcement of unpopular trade laws, Providence residents spilled the first blood of the American Revolution in the notorious Gaspée Affair of 1772.^[13]

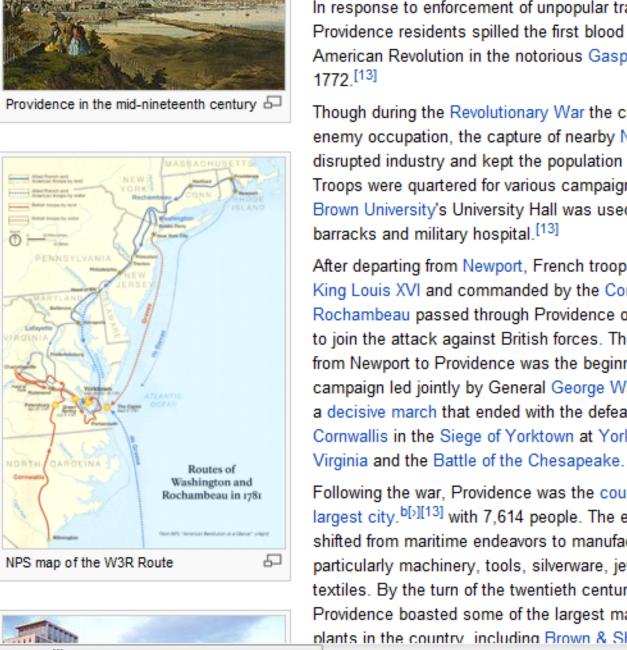


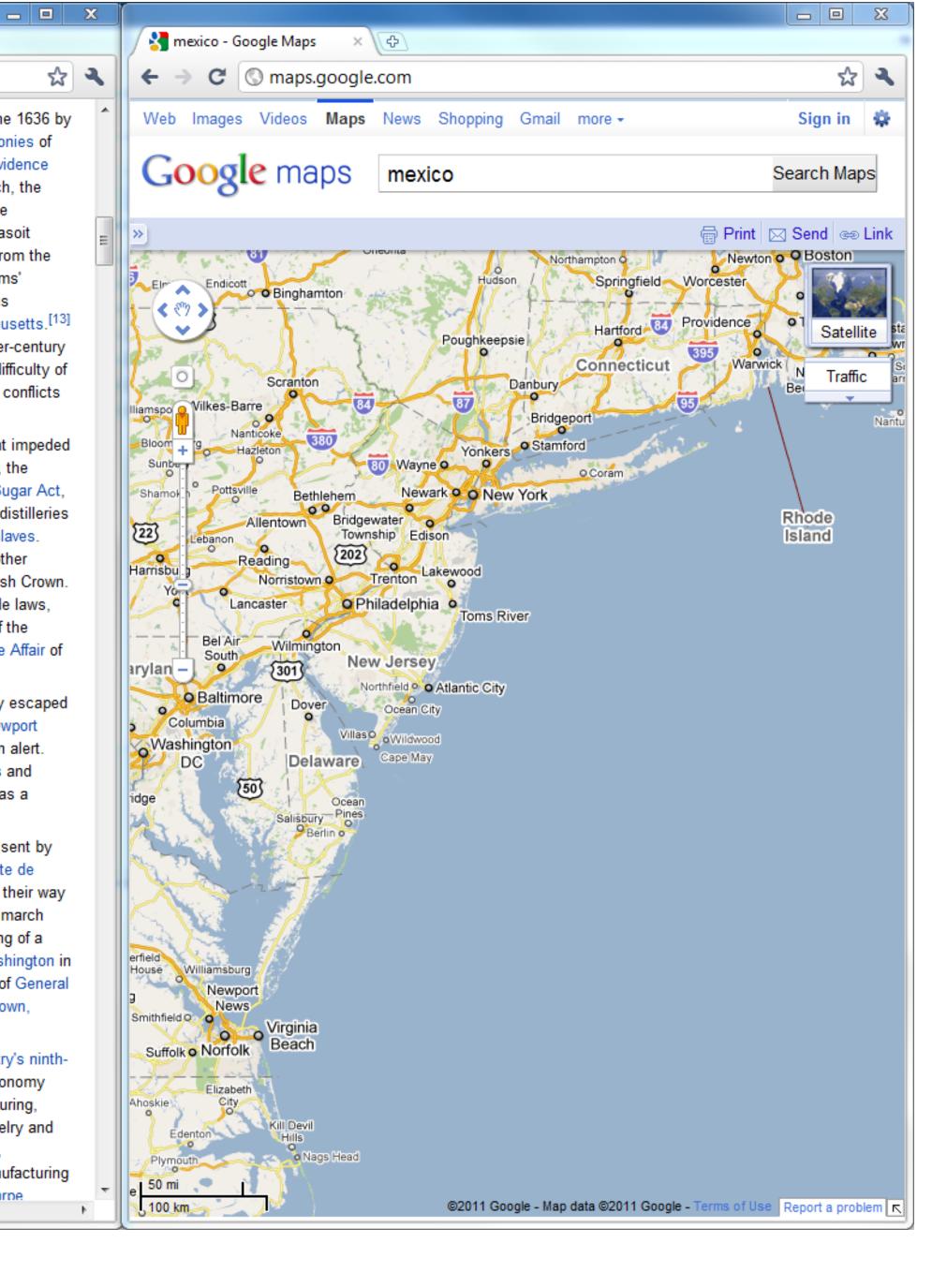
Though during the Revolutionary War the city escaped enemy occupation, the capture of nearby Newport disrupted industry and kept the population on alert. Troops were quartered for various campaigns and Brown University's University Hall was used as a

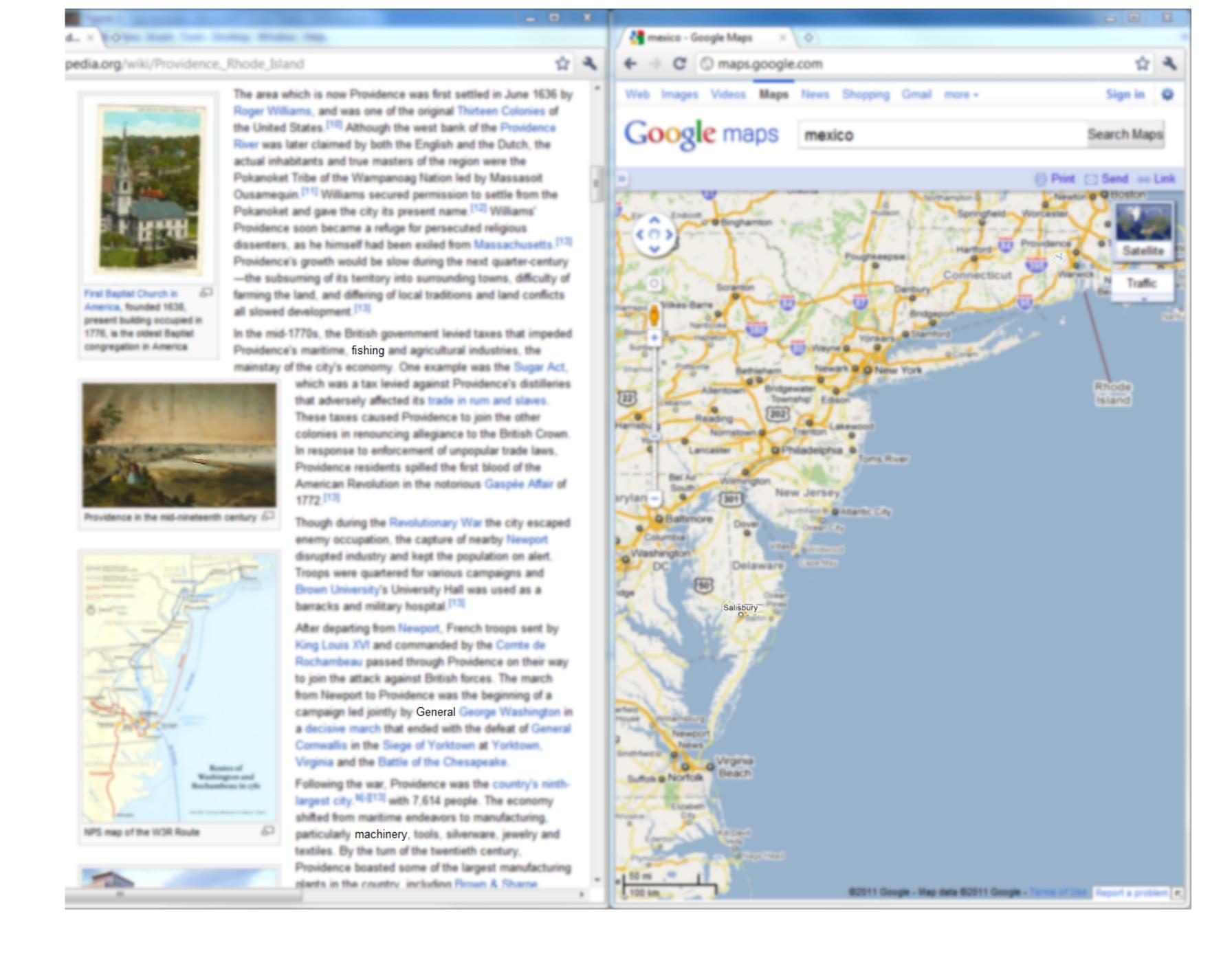
After departing from Newport, French troops sent by King Louis XVI and commanded by the Comte de Rochambeau passed through Providence on their way to join the attack against British forces. The march from Newport to Providence was the beginning of a campaign led jointly by General George Washington in a decisive march that ended with the defeat of General Cornwallis in the Siege of Yorktown at Yorktown,

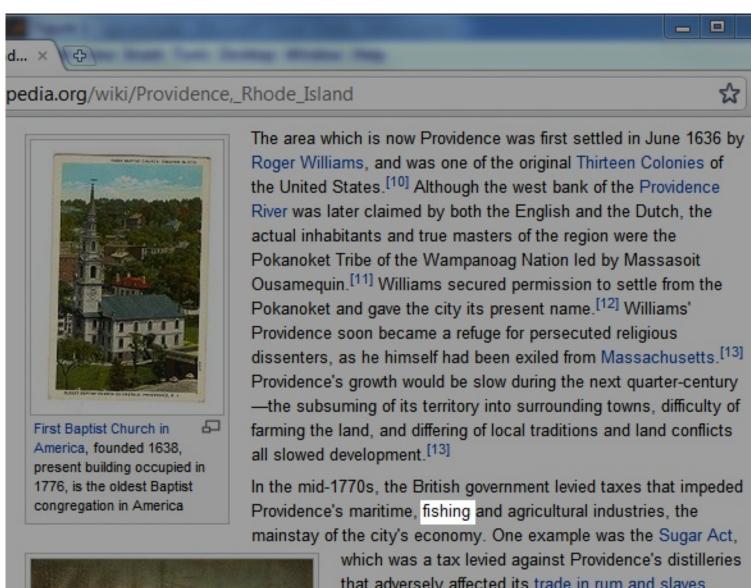
Following the war, Providence was the country's ninthlargest city. b[>][13] with 7,614 people. The economy shifted from maritime endeavors to manufacturing, particularly machinery, tools, silverware, jewelry and textiles. By the turn of the twentieth century, Providence boasted some of the largest manufacturing plants in the country including Brown & Sharpe





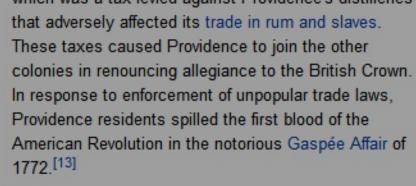






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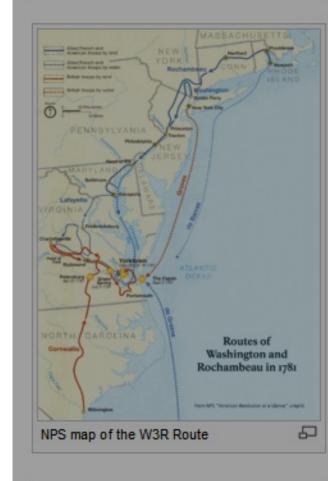


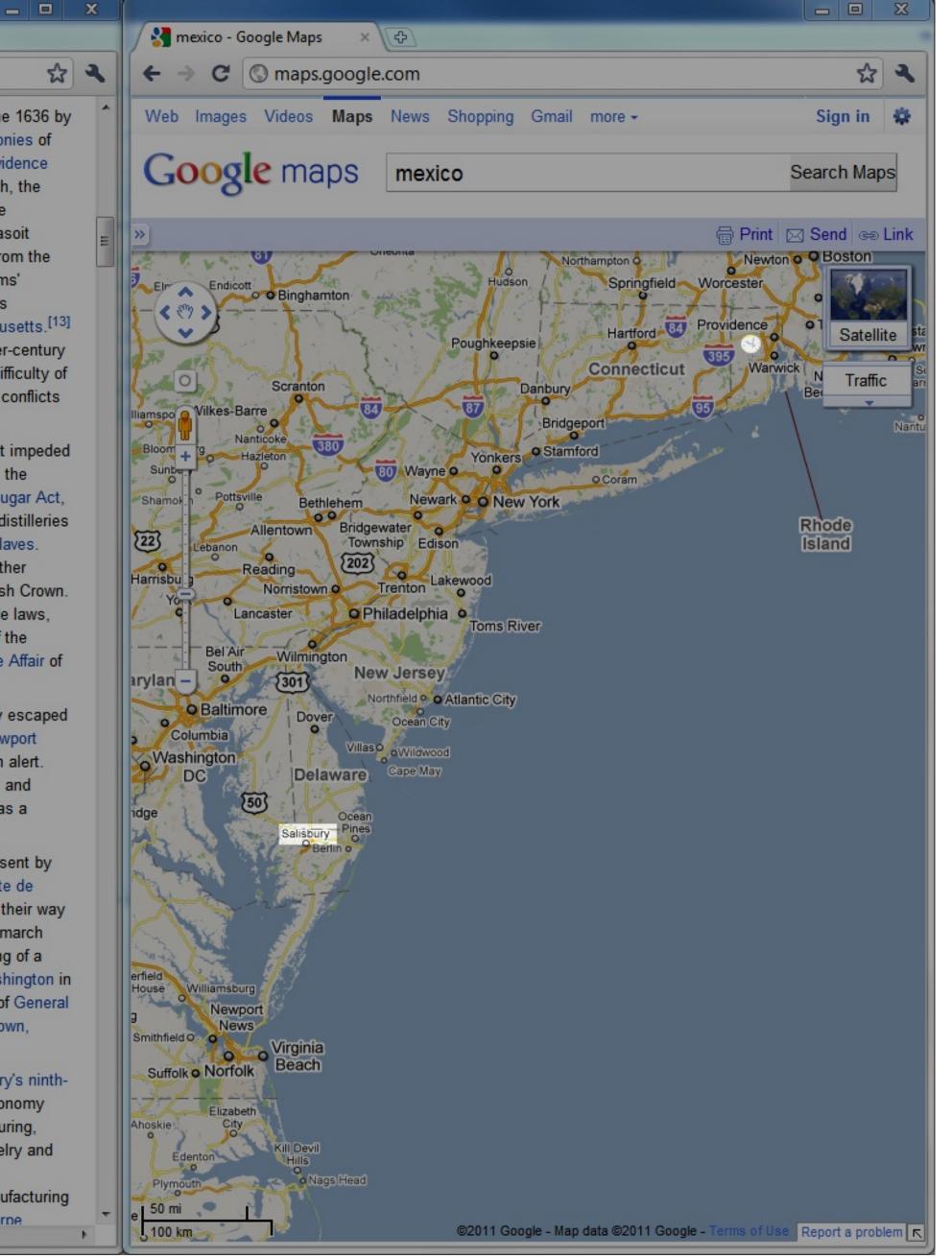
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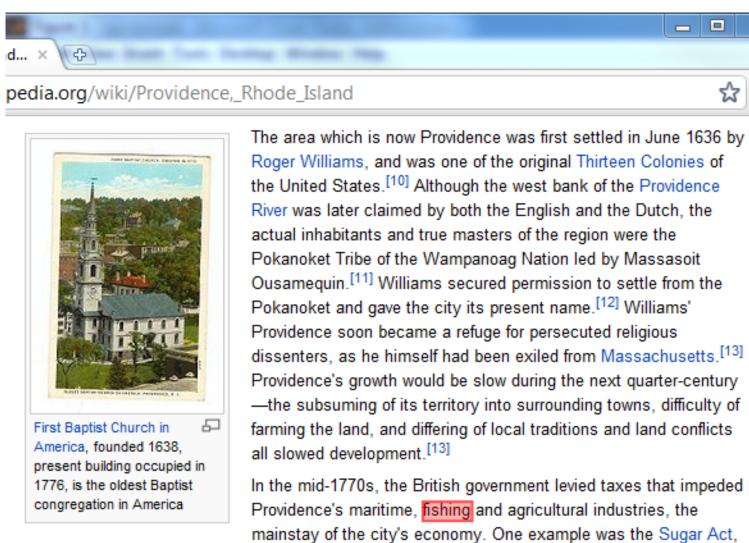
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🛂 mexico - Google Maps

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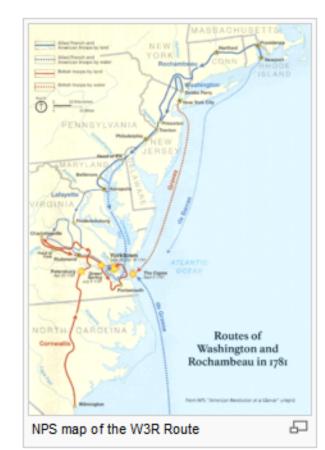
> 1772.^[13]

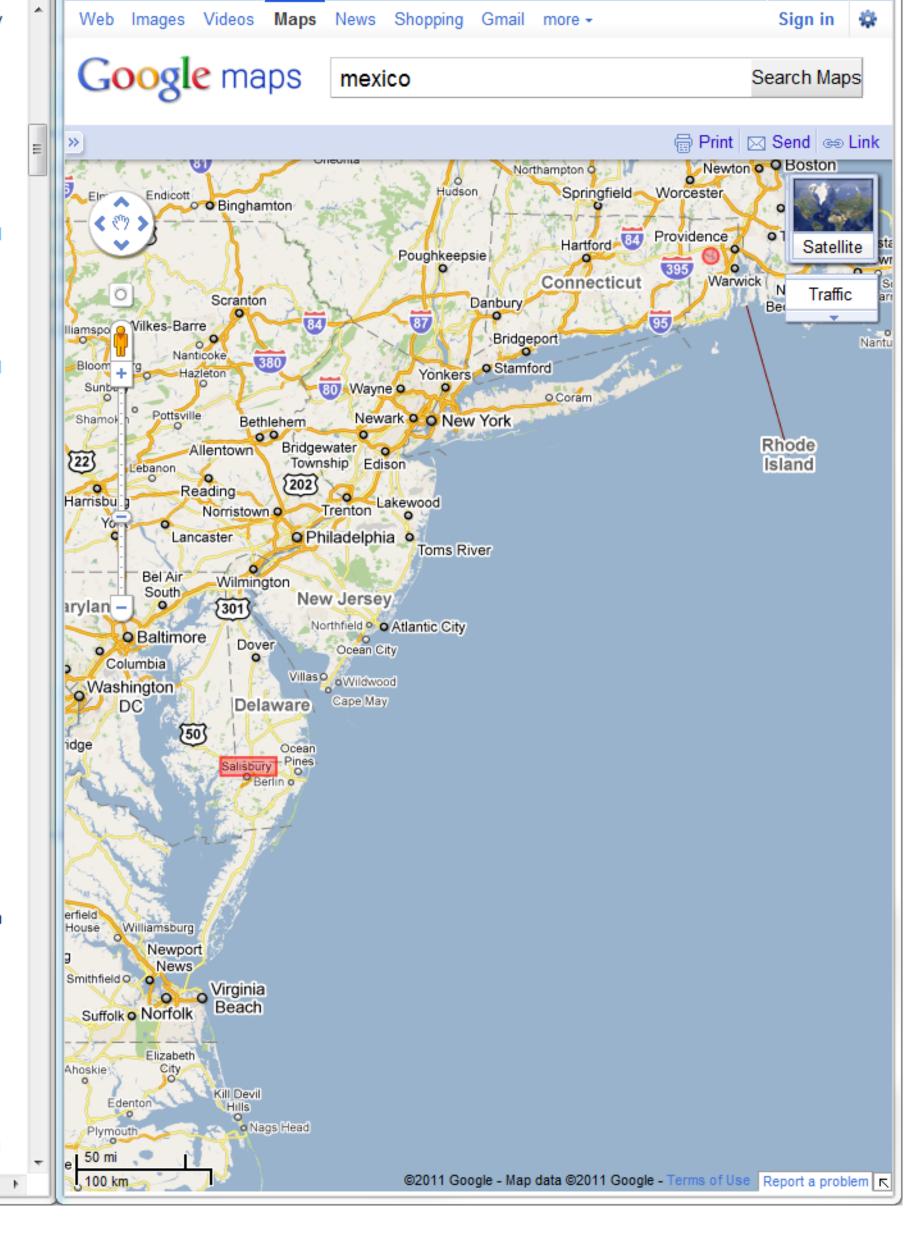
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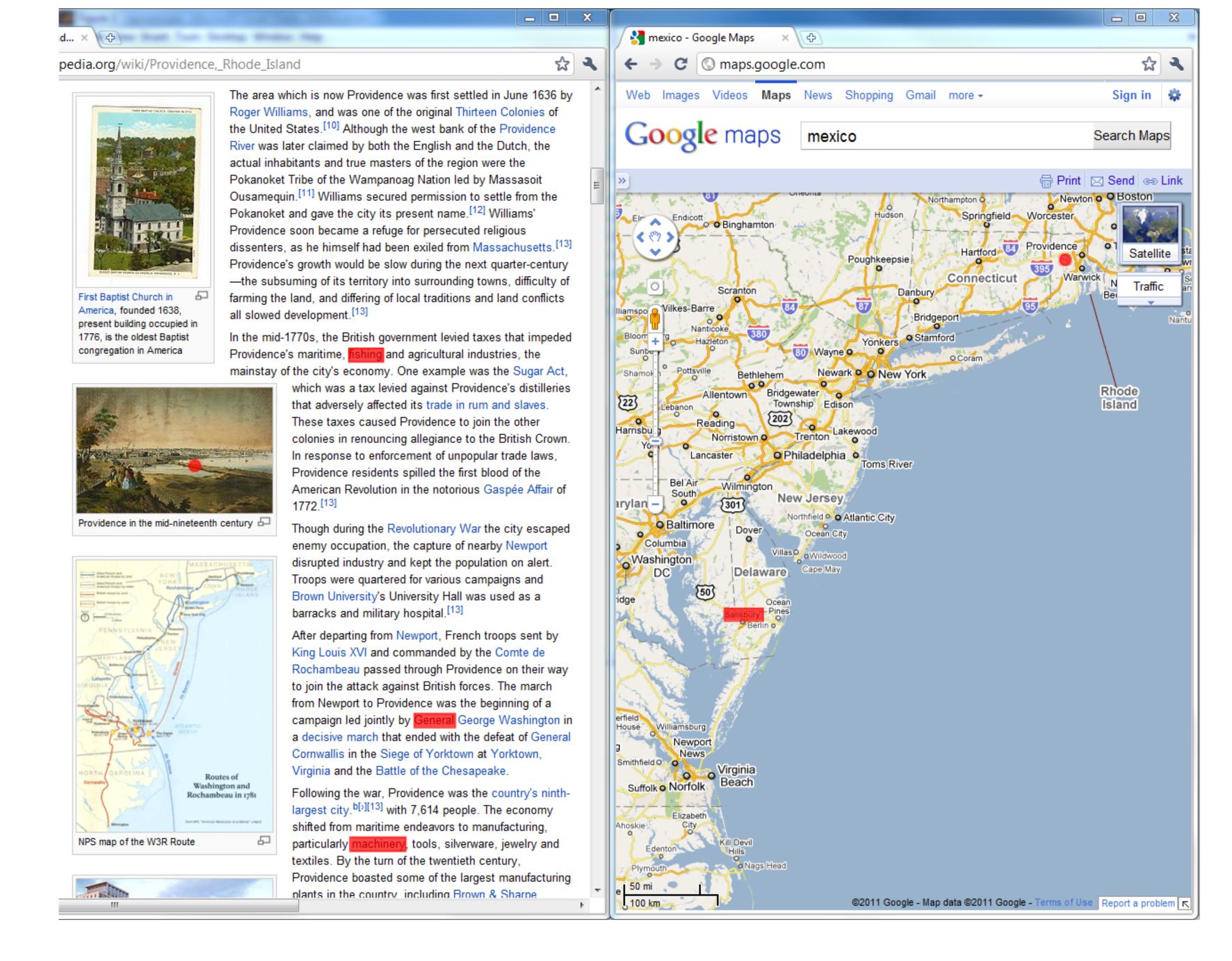


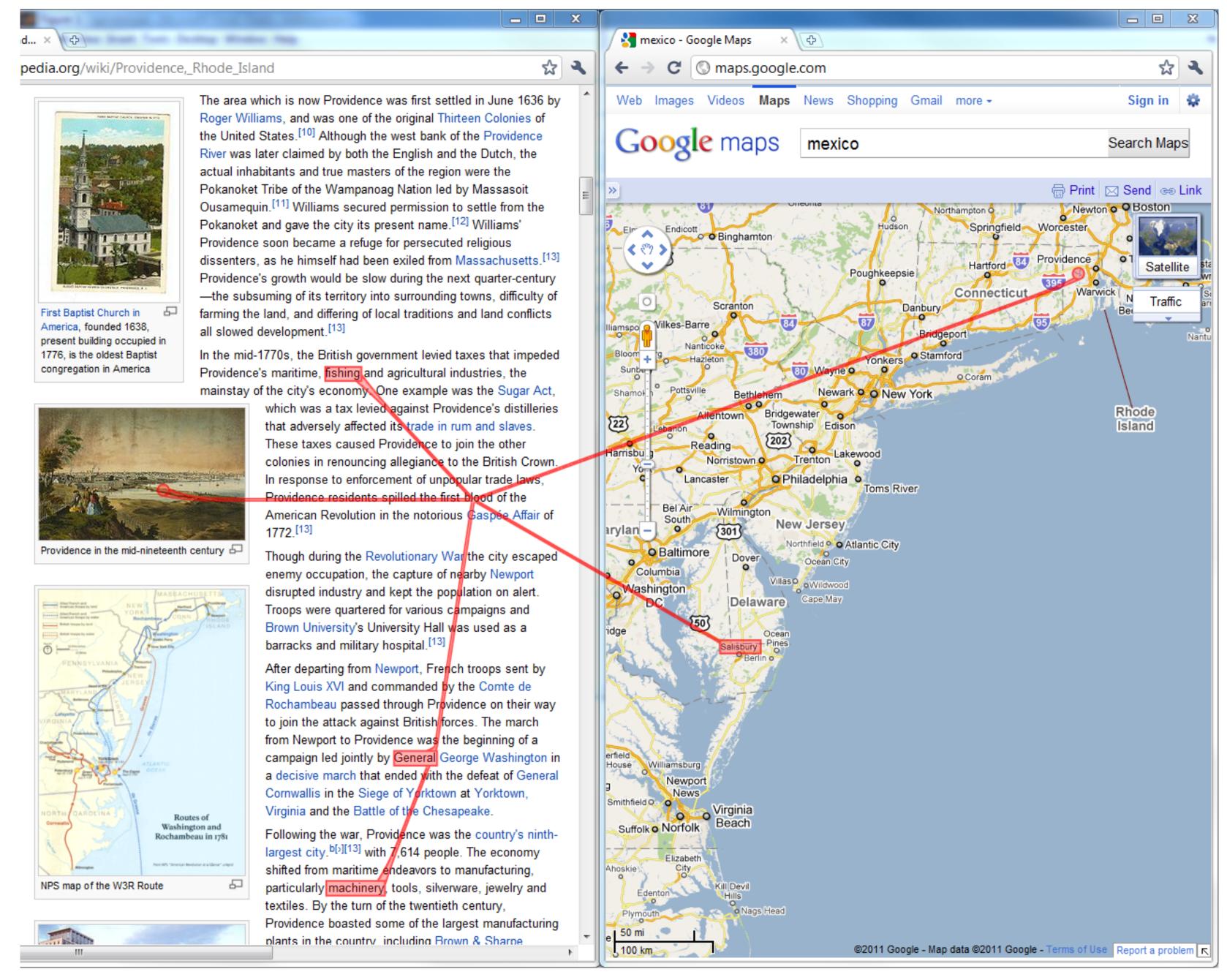




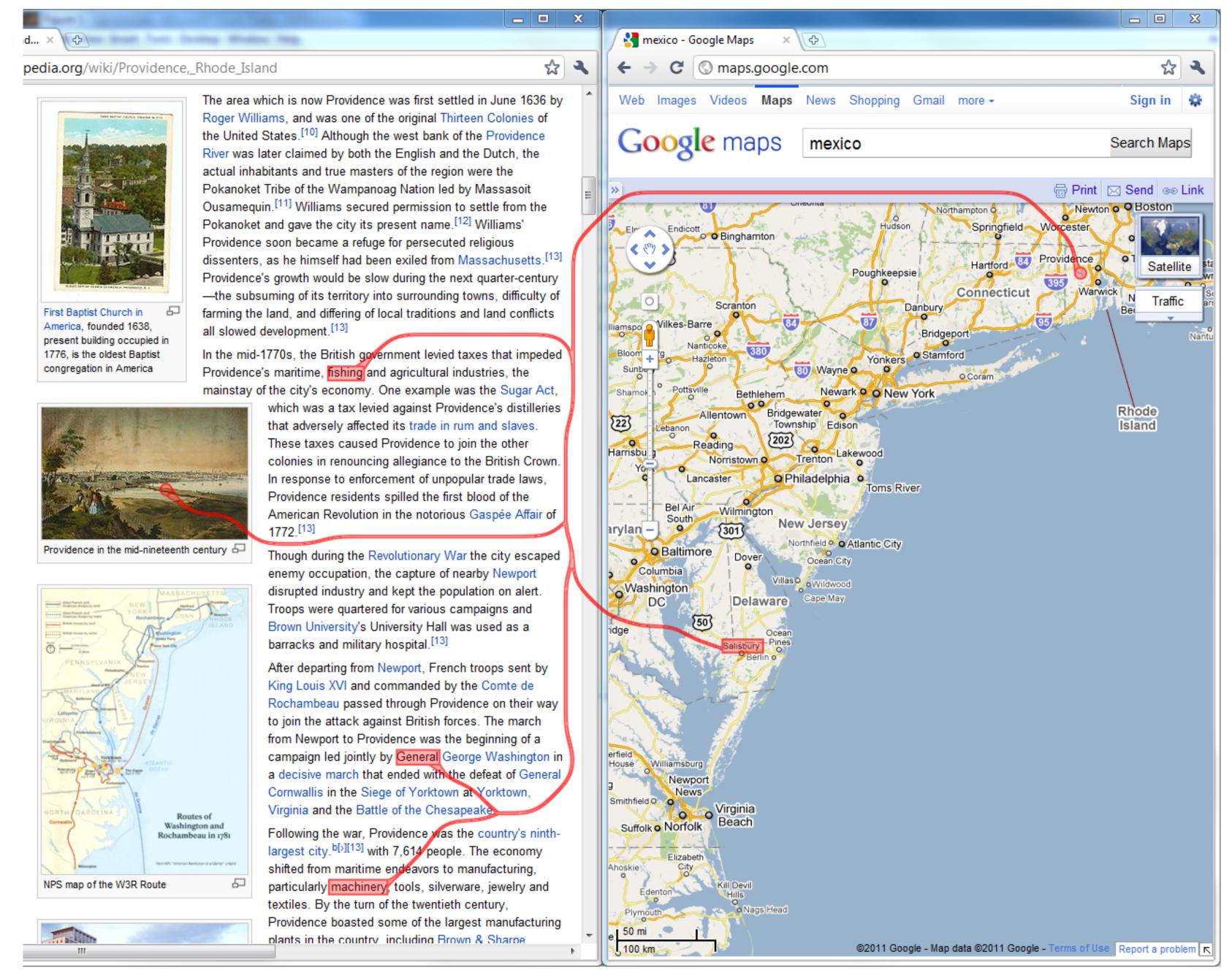
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What is the problem?



Context-Preserving Visual Links

Takeaways

Knowing about Perception is important for Vis and UI design

How to choose your colors

How to show relationships

How to draw attention

How to minimize risk of overlooking