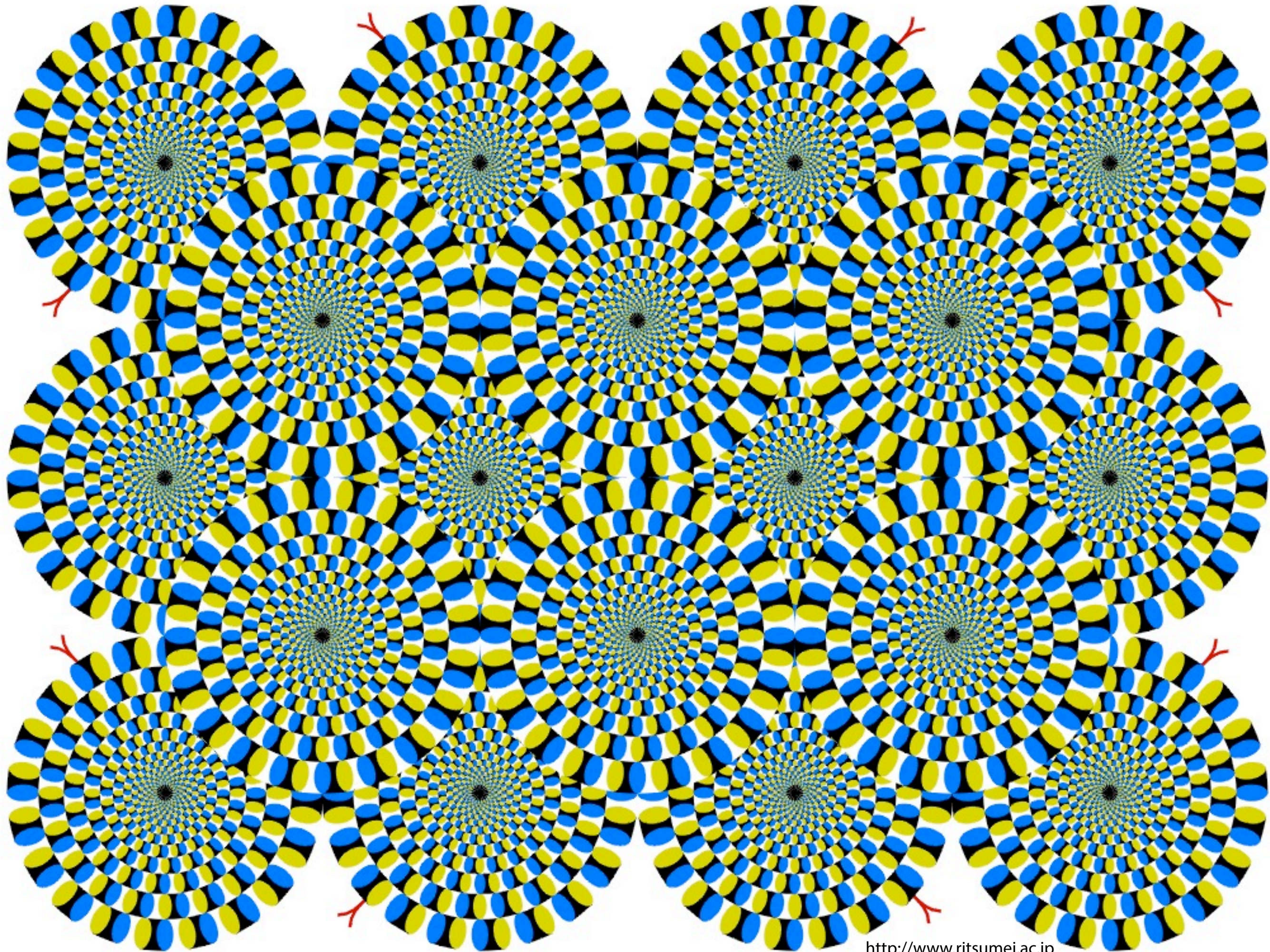
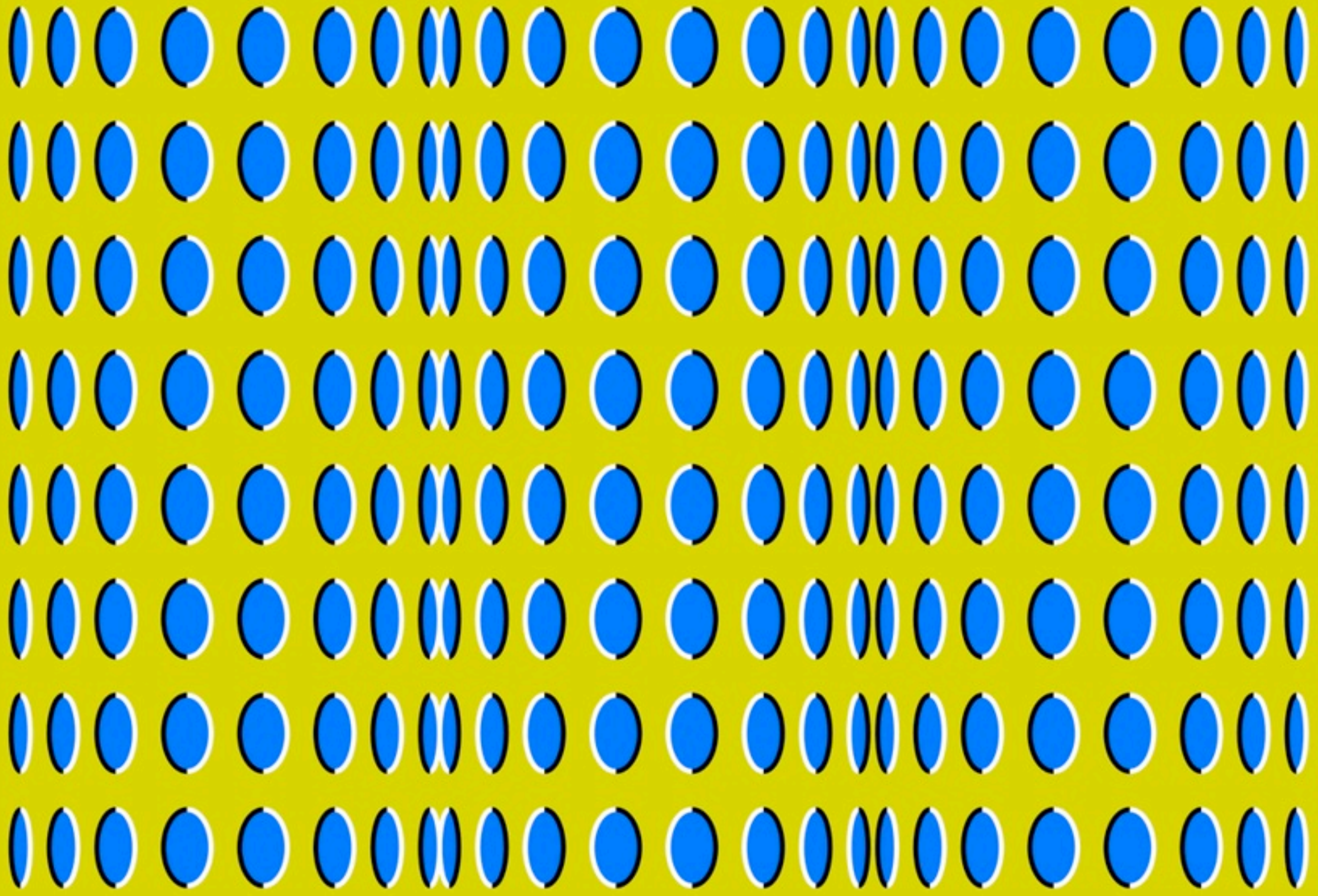


Perception

How our brain perceives and interprets visuals

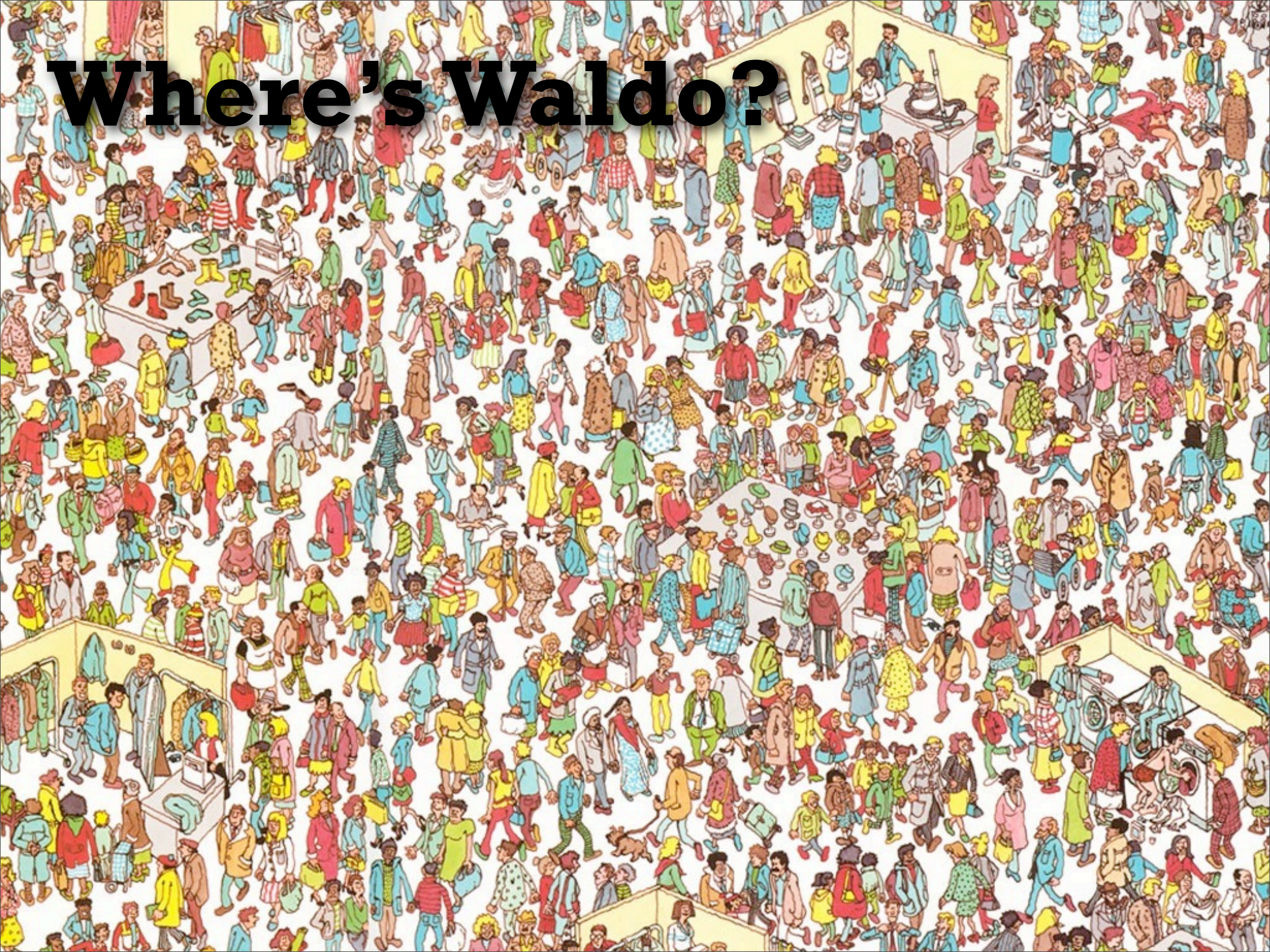




Pre-attentive Attributes

vs Attentive Attributes

Where's Waldo?



How many 3s?

How many 3s?

1281768756138976546985604982826762
9809858458224509856458940980943585
9091030209905959595775050678904567
8845789809821677654876360912949686

How many 3s?

How many 3s?

581**3**12062451046275777644**3**227882568
85400854815**3**2851714248582146284078
1041710**3**41052577585177276725911070
451252518271514012**3**882064857804410

Pre-attentive vs Attentive

Differences in speed of perception

pre-attentive

attentive

Pre-attentive vs Attentive

Differences in speed of perception

pre-attentive

$\leq 500\text{ms}$

$\leq 10\text{ms}$

parallel processing

Task

indiv. obj.

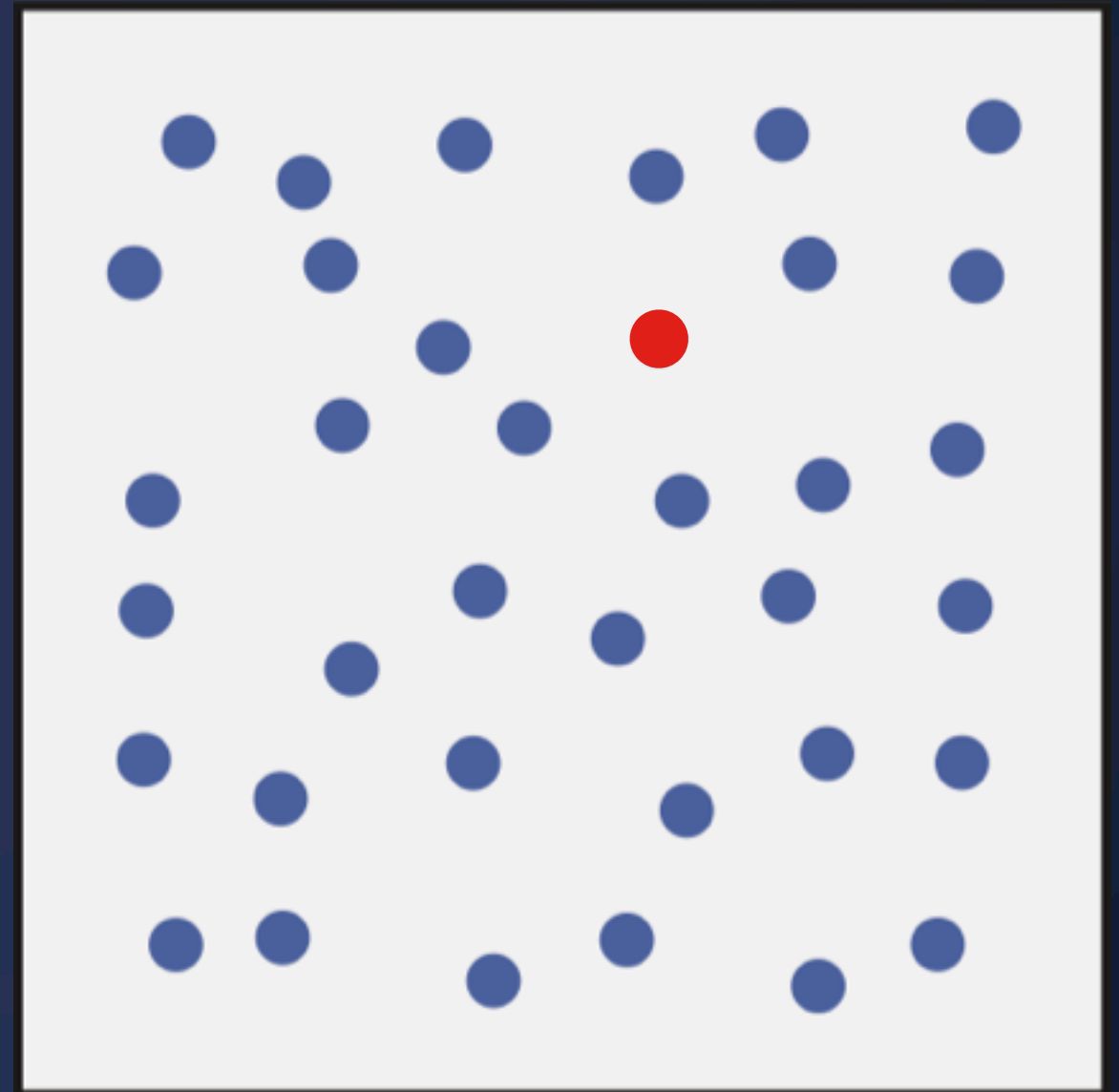
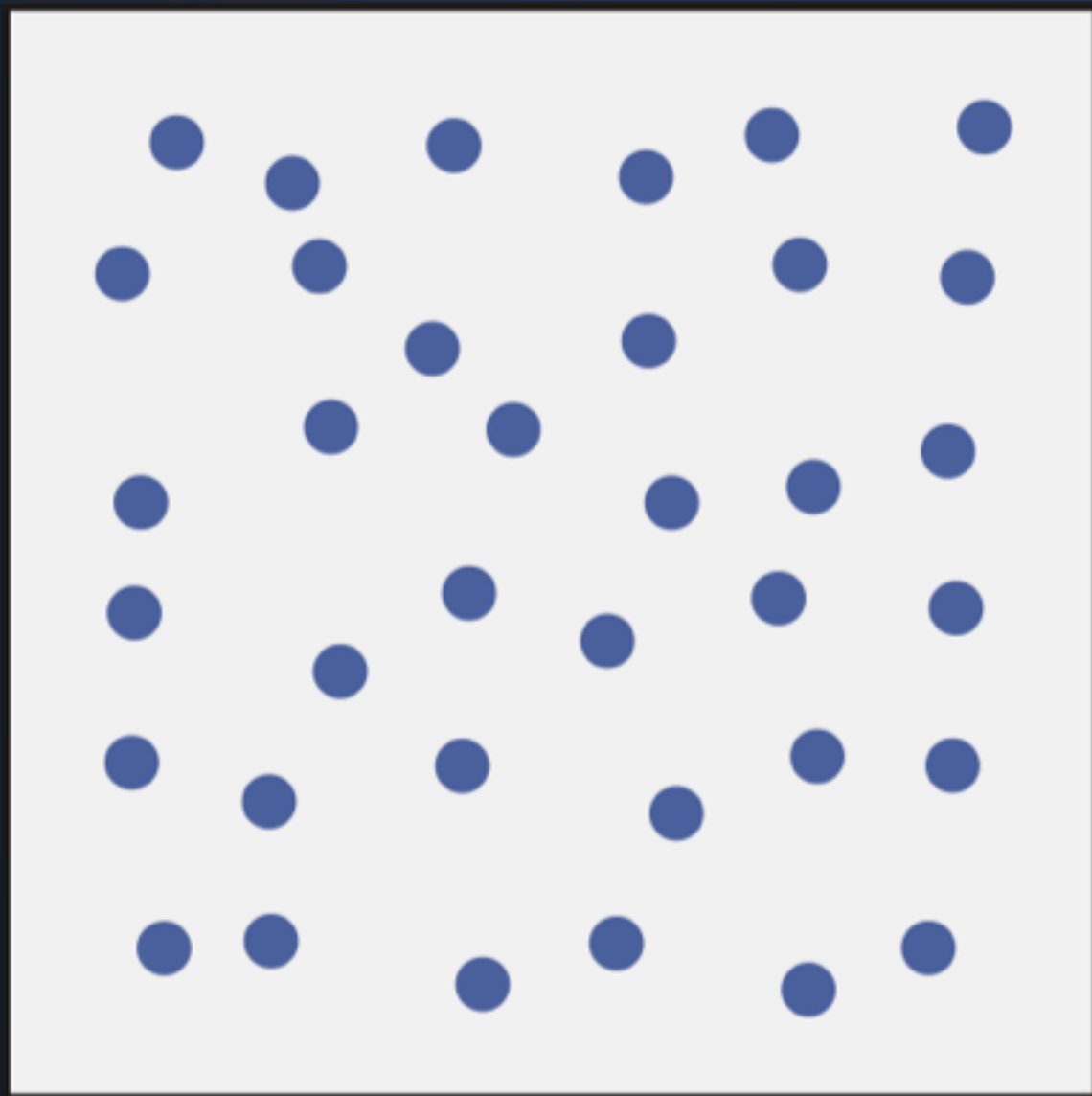
attentive

$> 500\text{ms}$

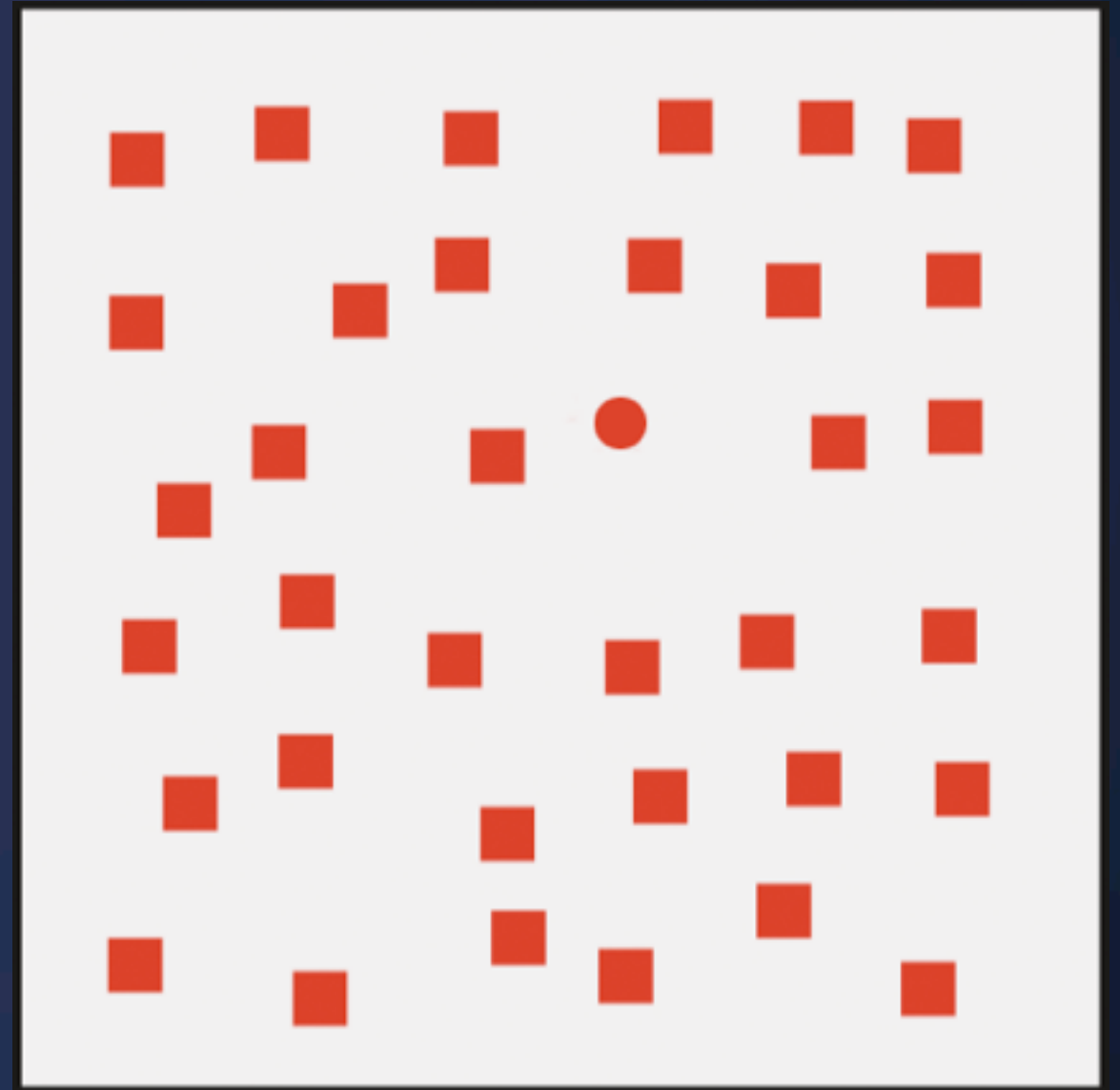
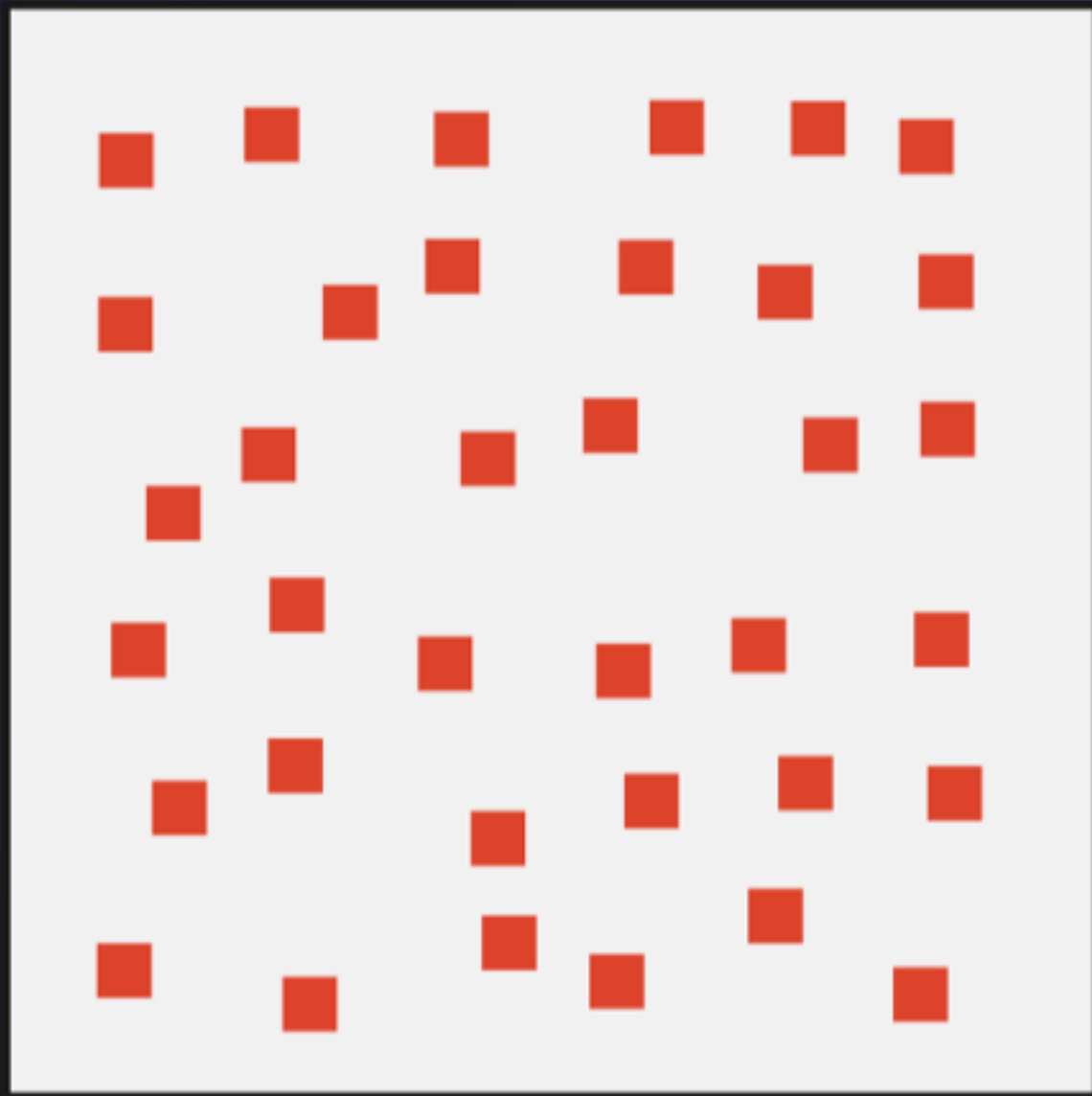
$> 10\text{ms}$

sequential processing

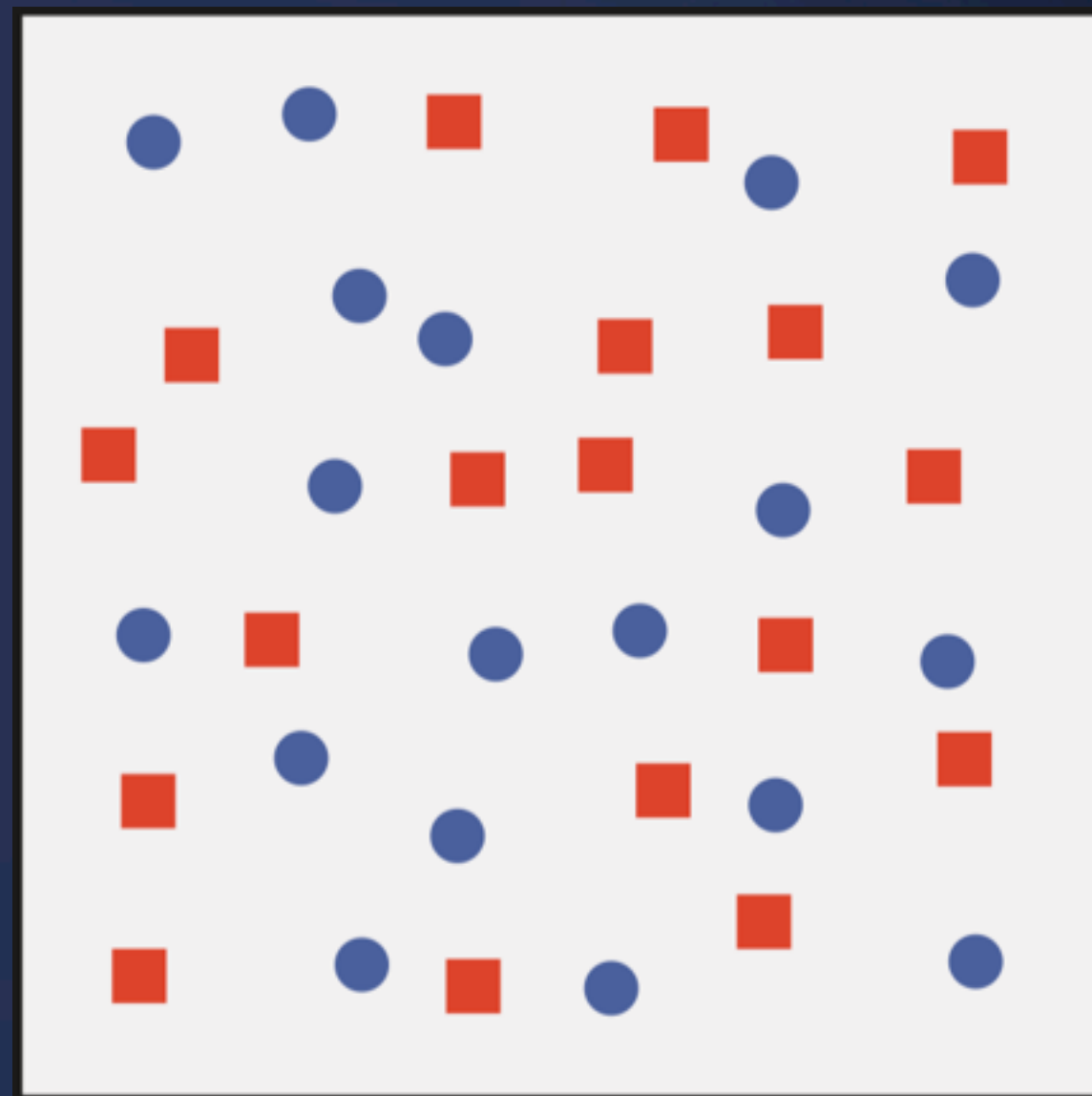
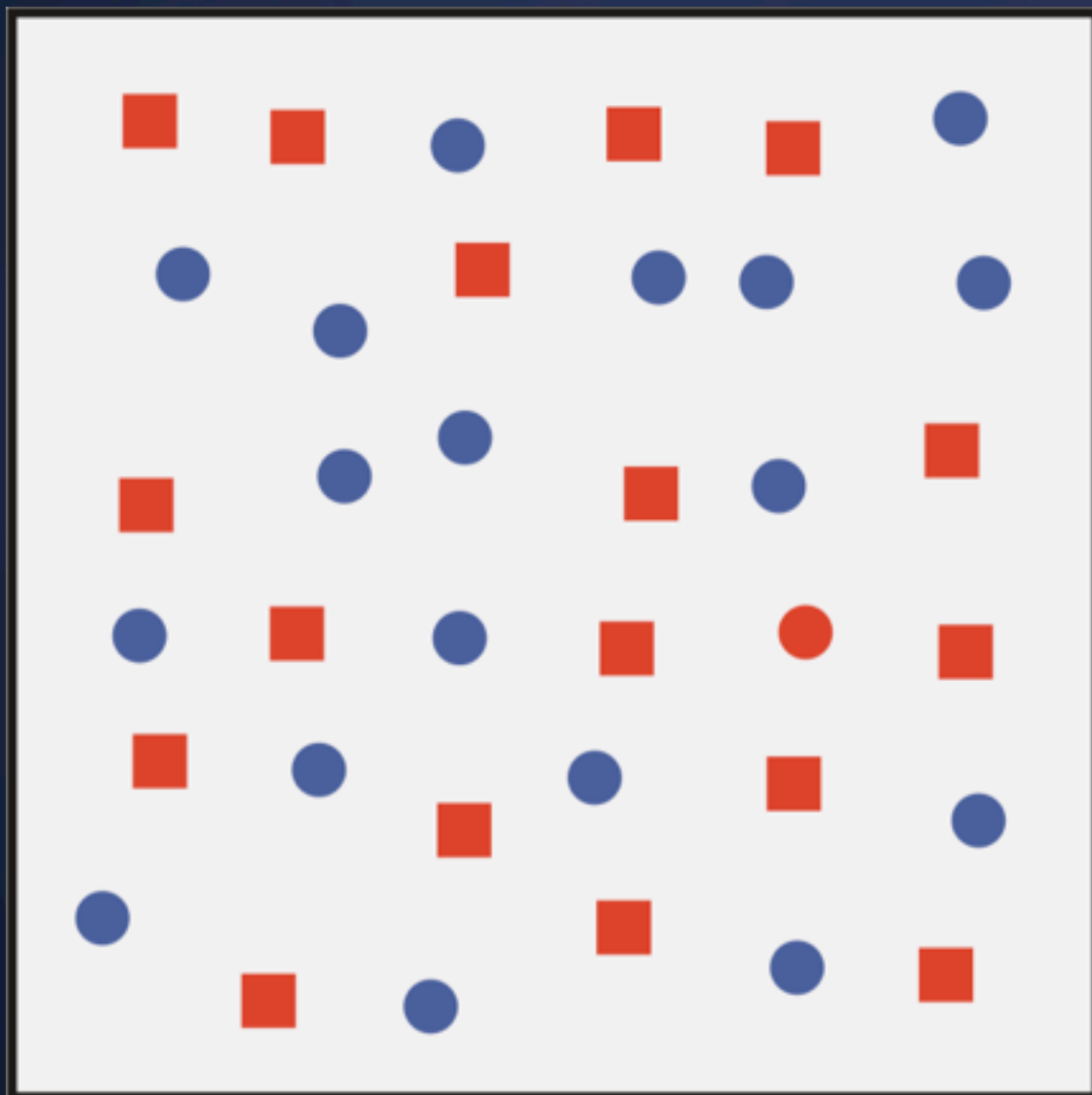
Visual Pop-Out: Color



Visual Pop-Out: Shape

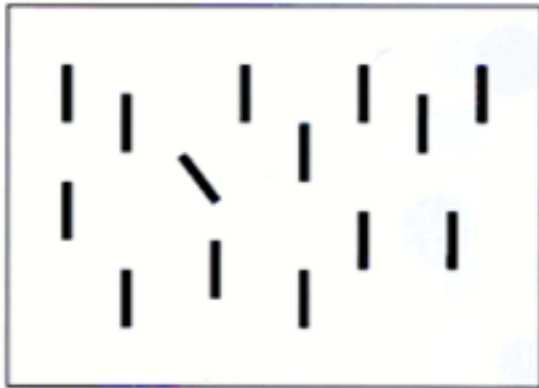


Feature Conjunctions

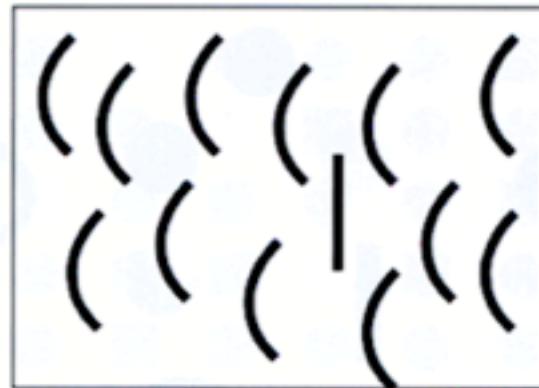


Pre-attentive Features

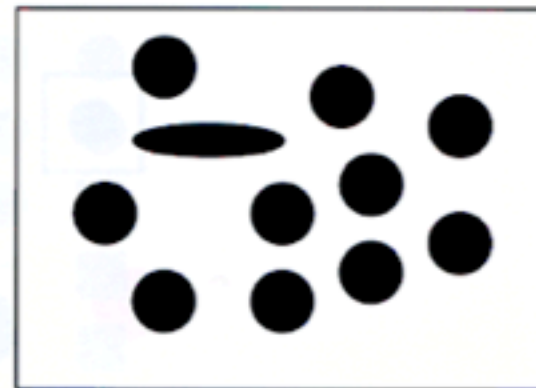
Orientation



Curved/straight



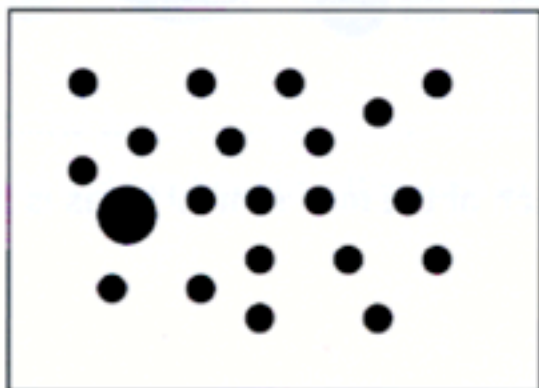
Shape



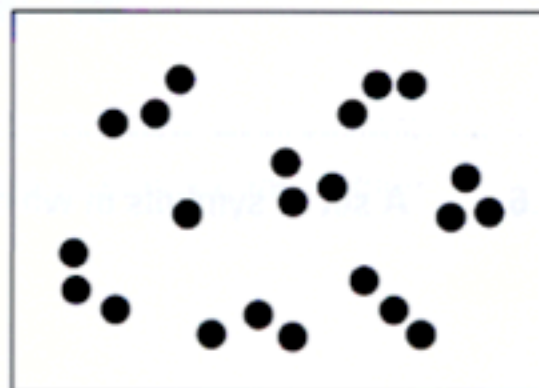
Shape



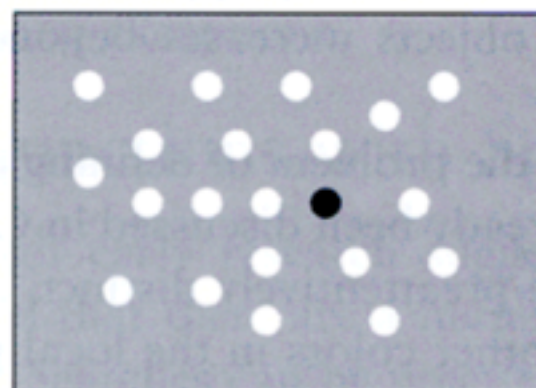
Size



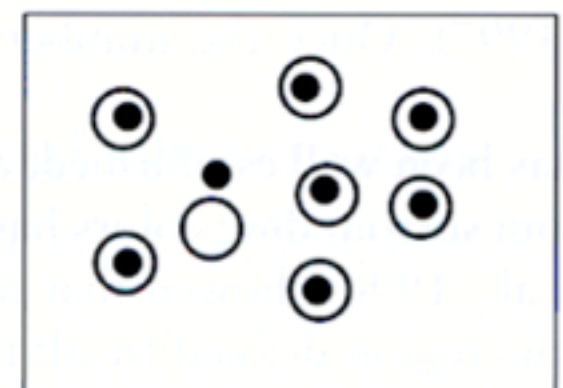
Number



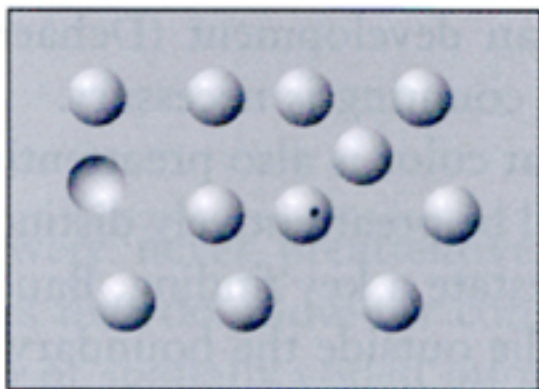
Gray/value



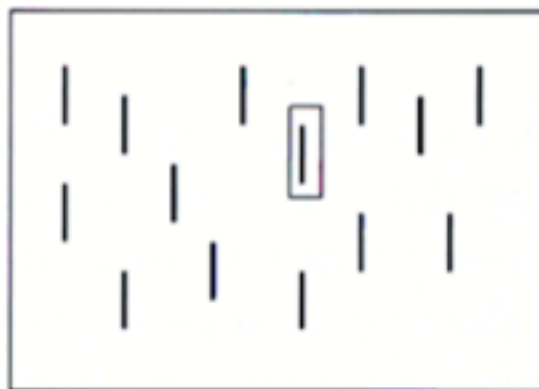
Enclosure



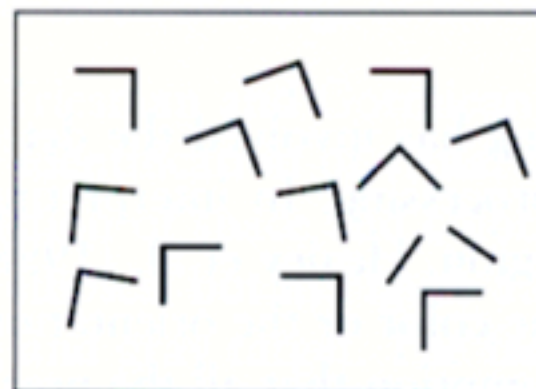
Convexity/concavity



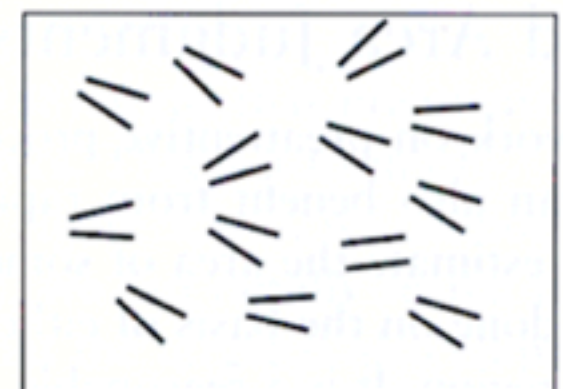
Addition



Juncture



Parallelism



More Pre-attentive Features

Line (blob) orientation

Length

Width

Size

Curvature

Number

Terminators

Intersection

Closure

Color (hue)

Intensity

Flicker

Direction of motion

Binocular lustre

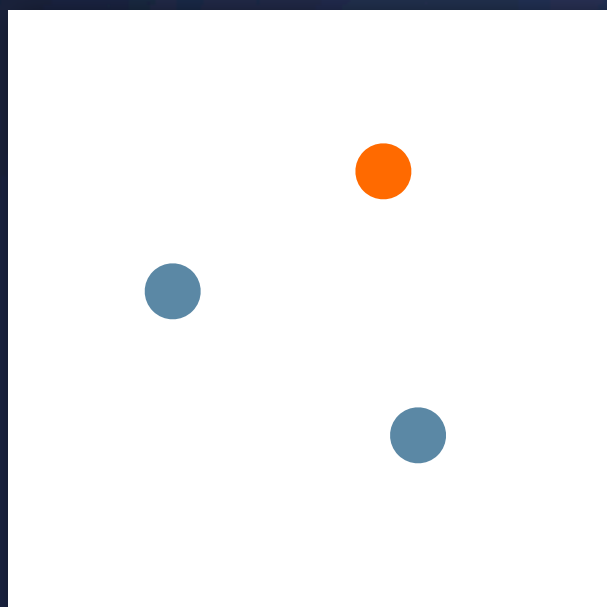
Stereoscopic depth

3-D depth cues

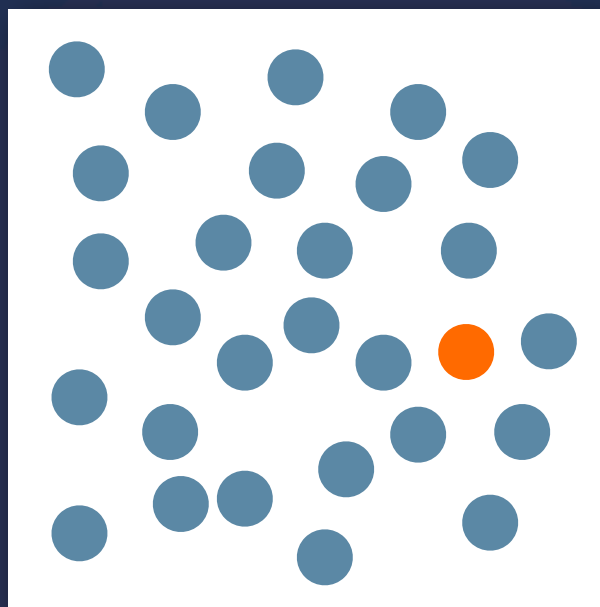
Lighting direction

Distractors - Pre-attentive

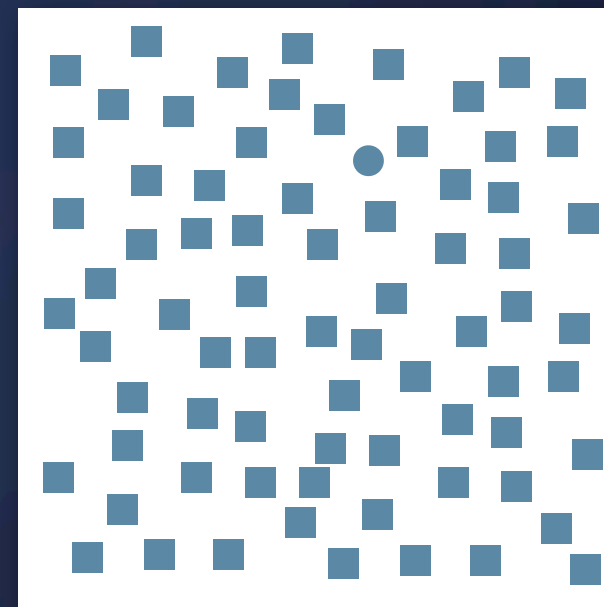
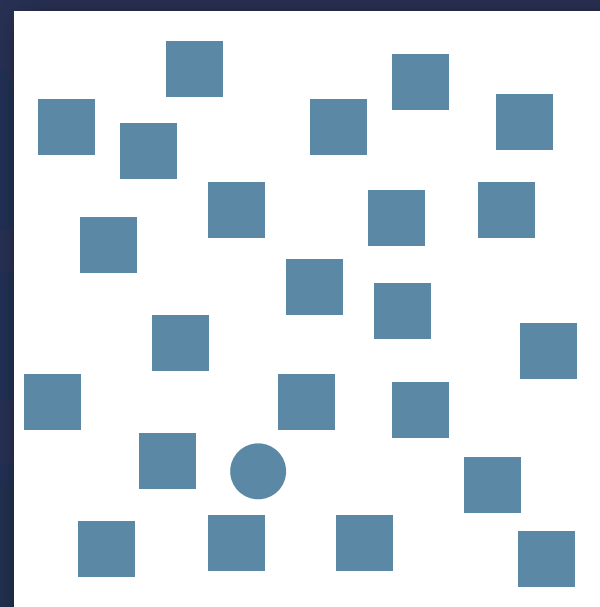
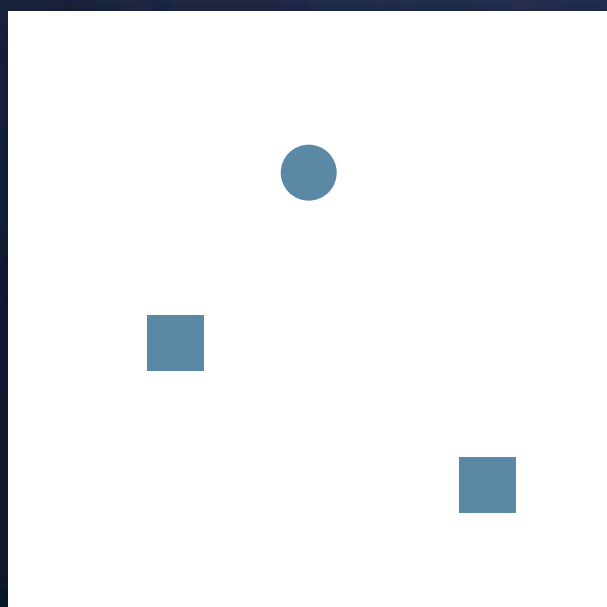
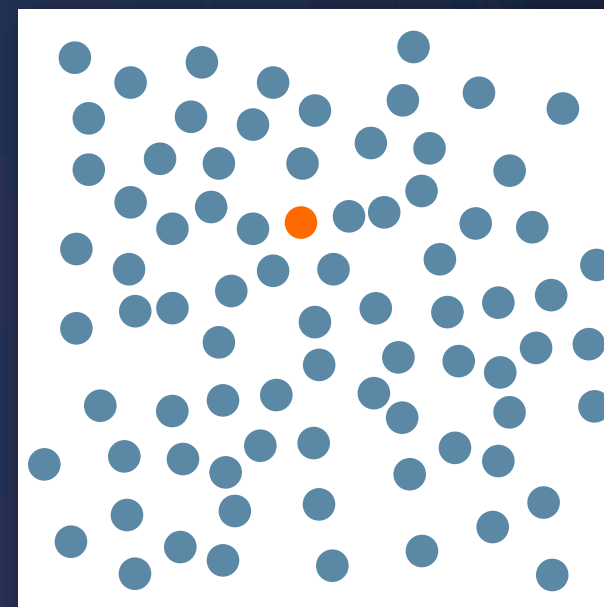
Few



More

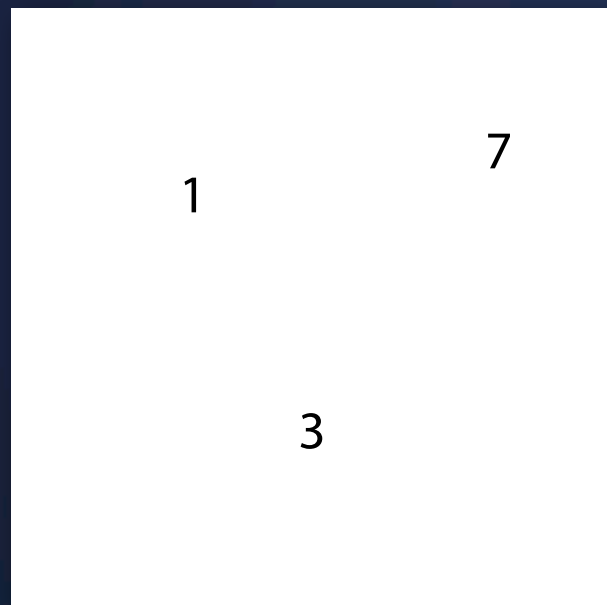


A lot

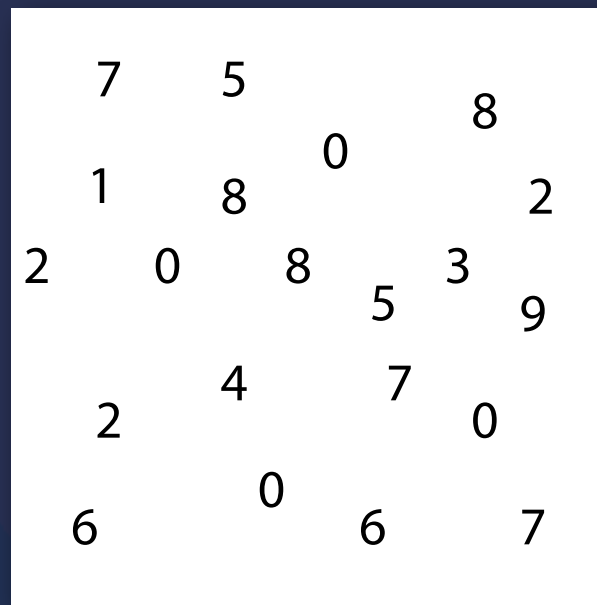


Distractors - Attentive

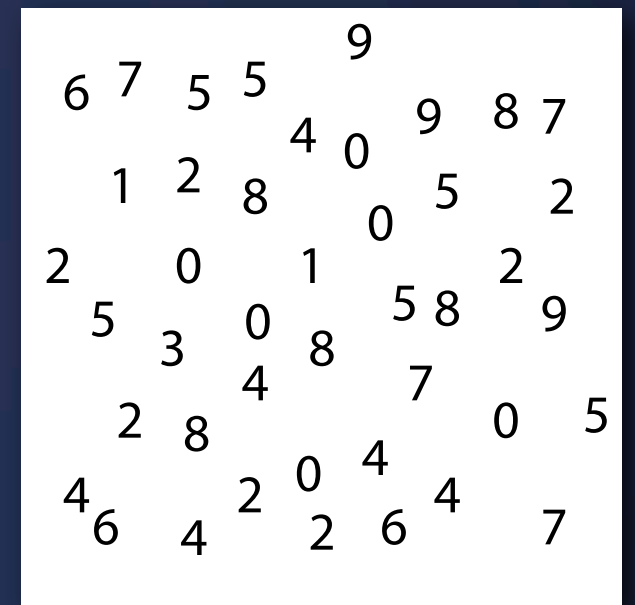
Few



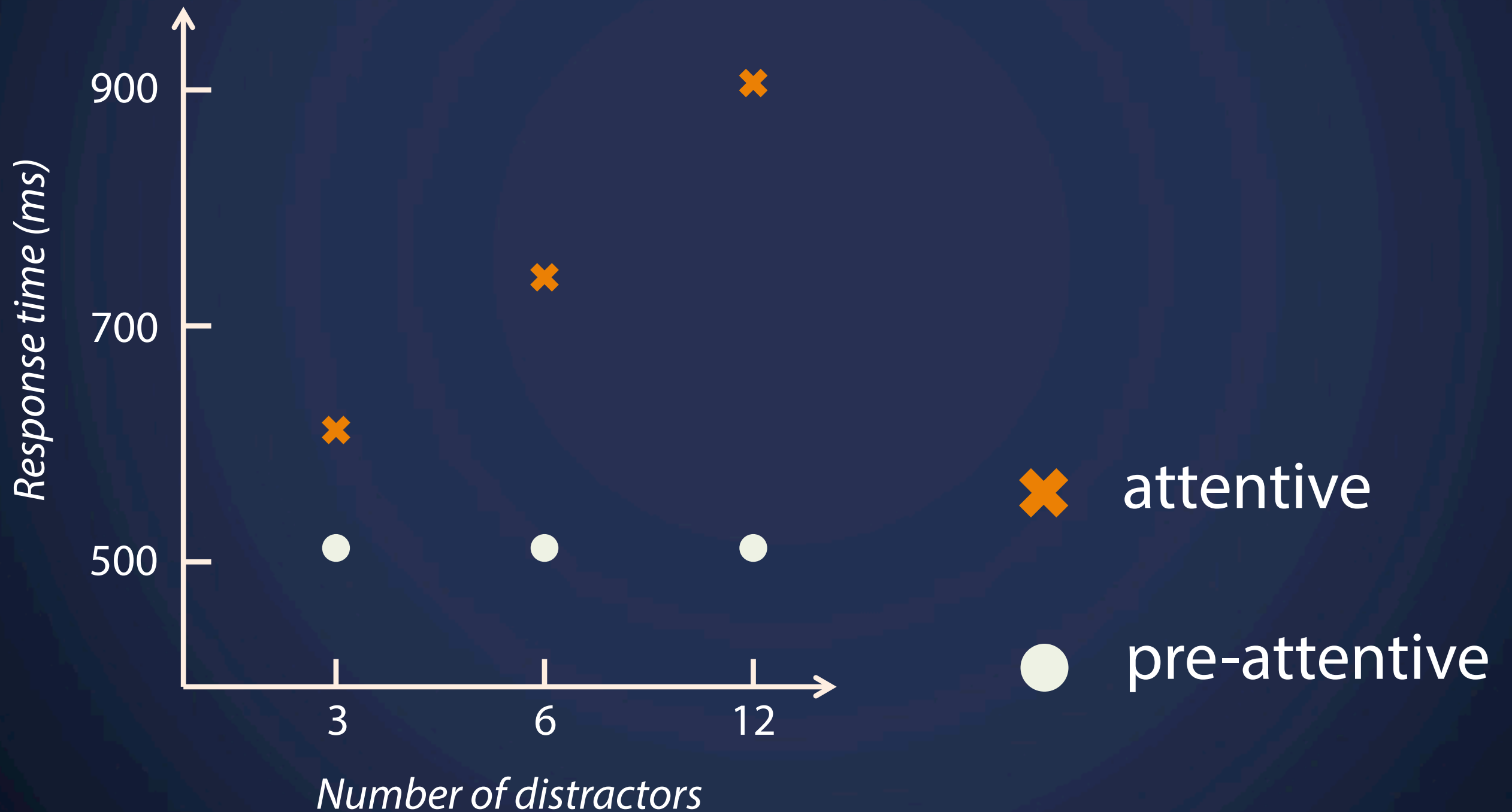
More



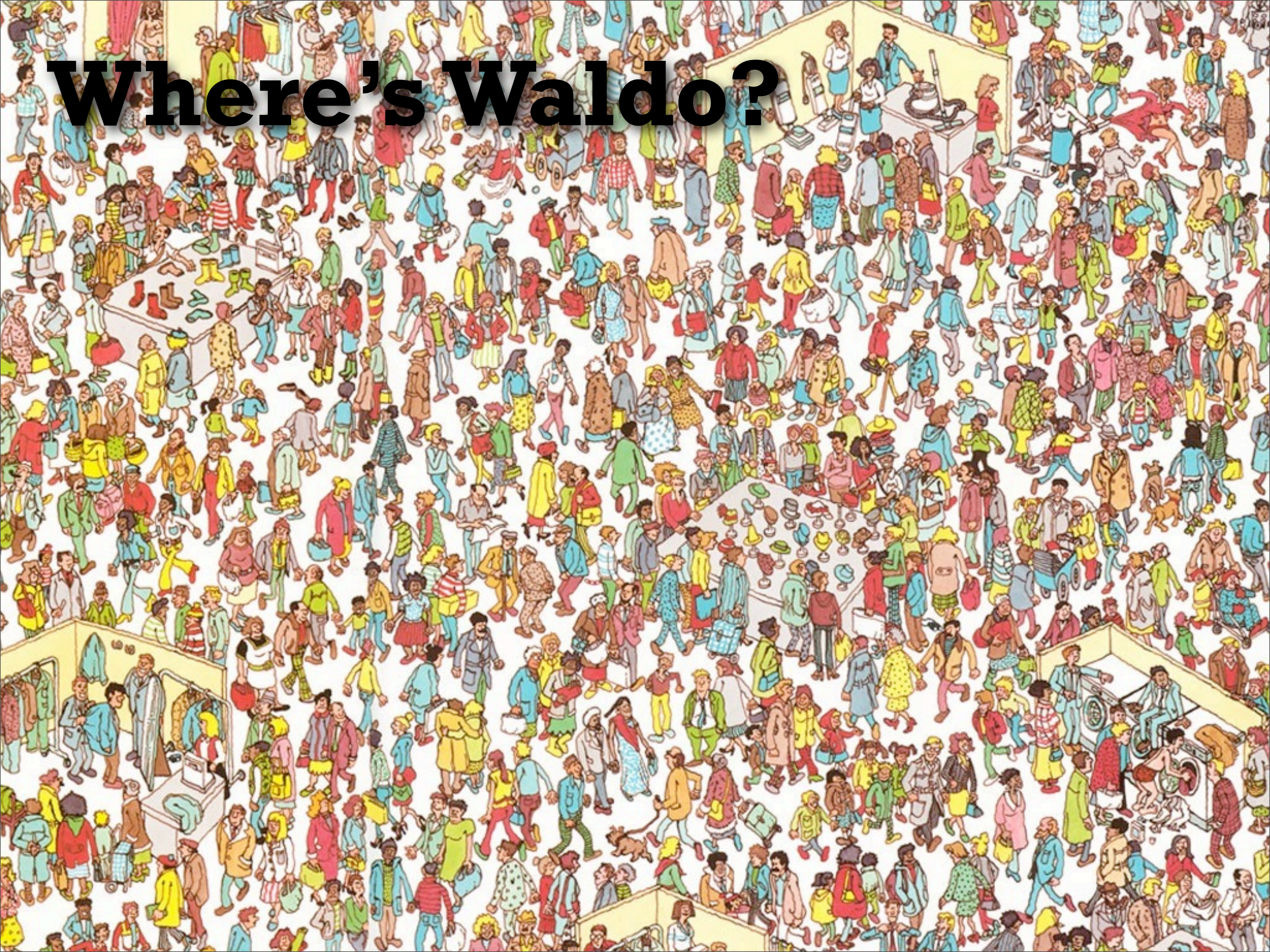
A lot



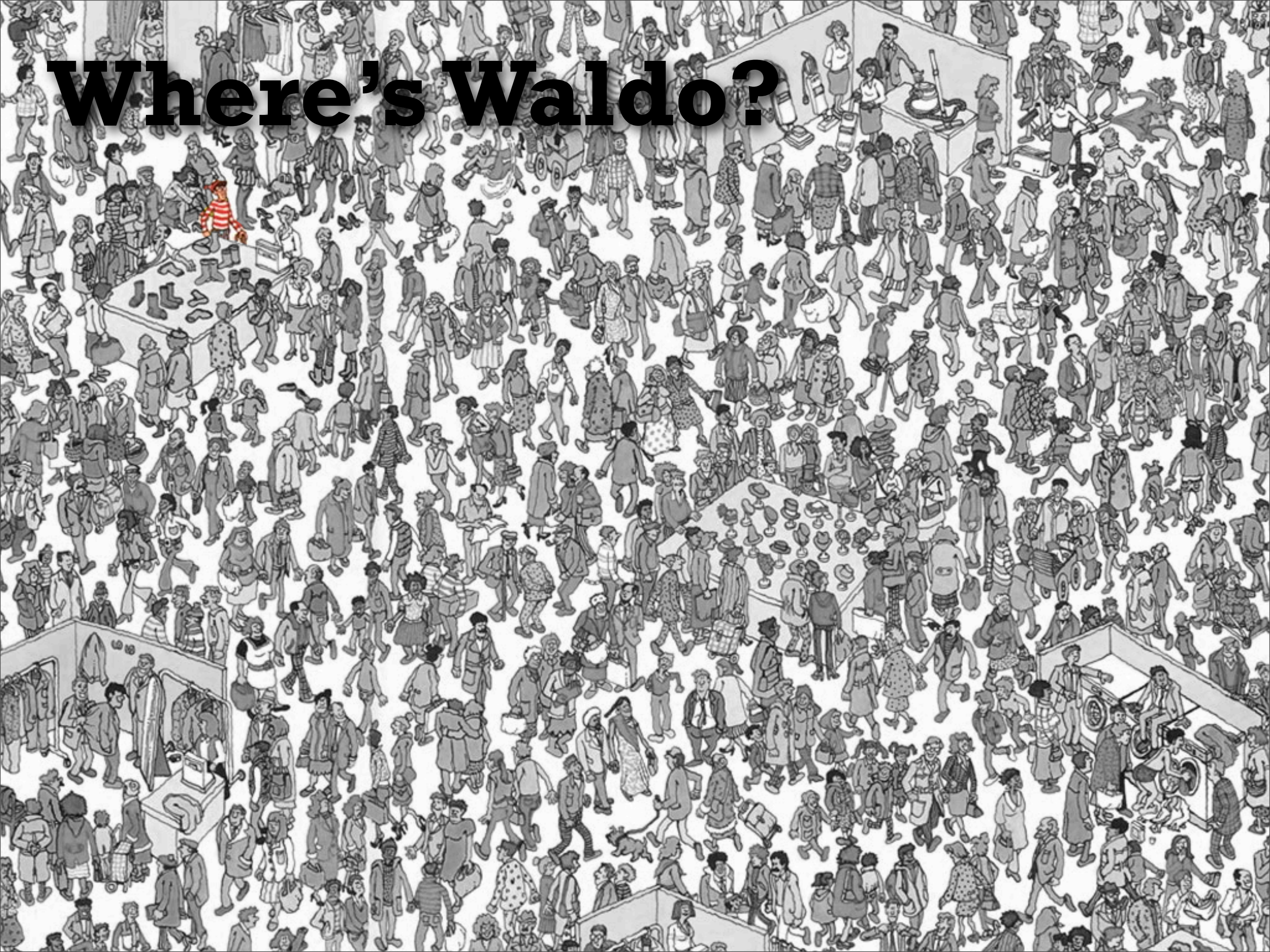
Distractors



Where's Waldo?



Where's Waldo?

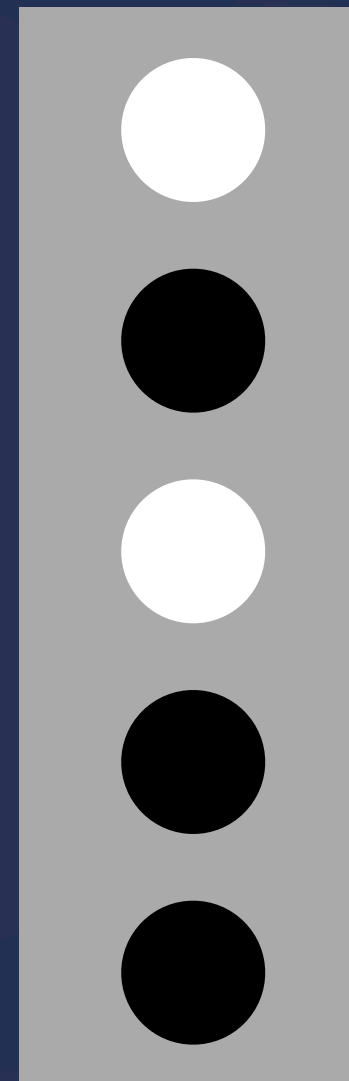
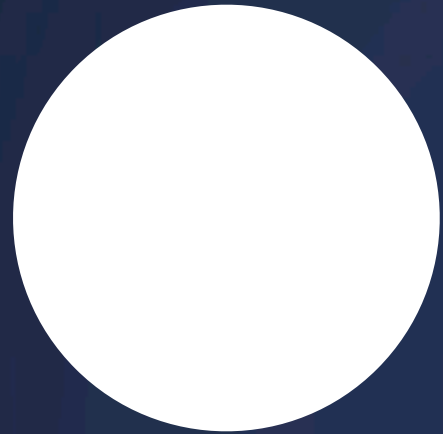


Multiple Attributes

Conjunctions

One-Dimensional

Lightness



White

Black

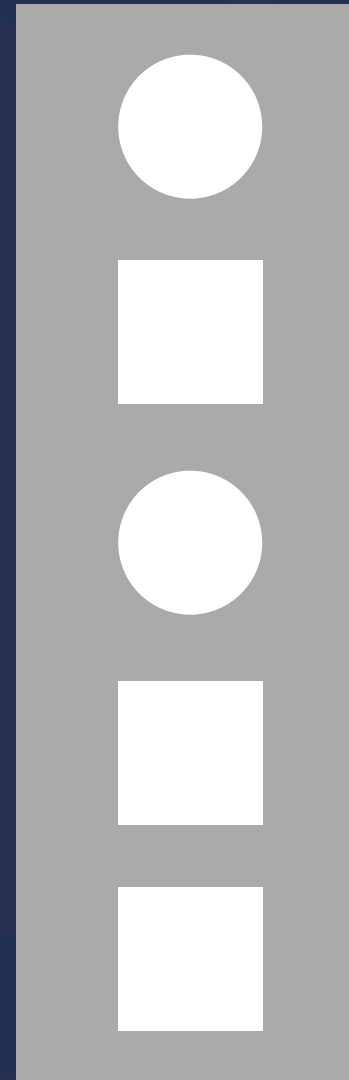
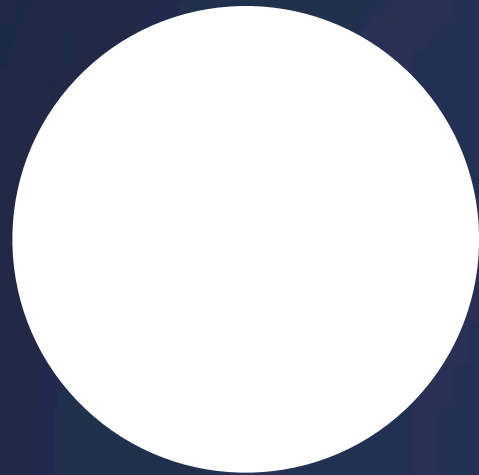
White

Black

Black

One-Dimensional

Shape



Circle

Square

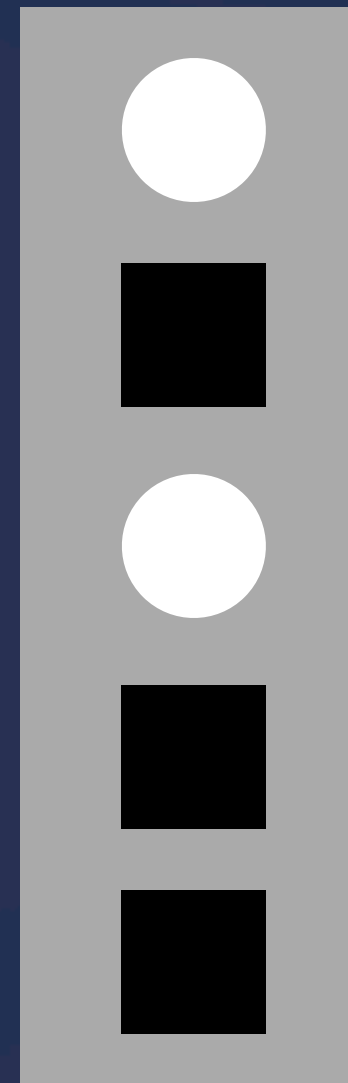
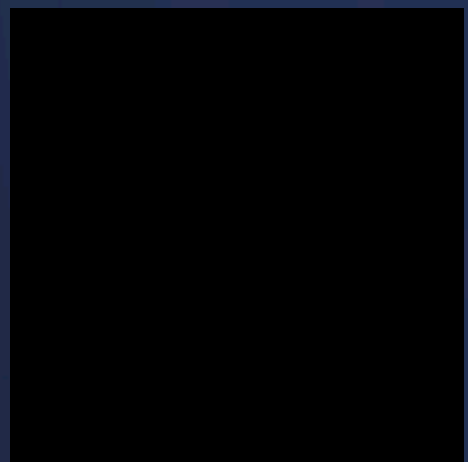
Circle

Square

Square

Correlated Dimensions

Shape or lightness (Redundant encoding)



Circle

Square

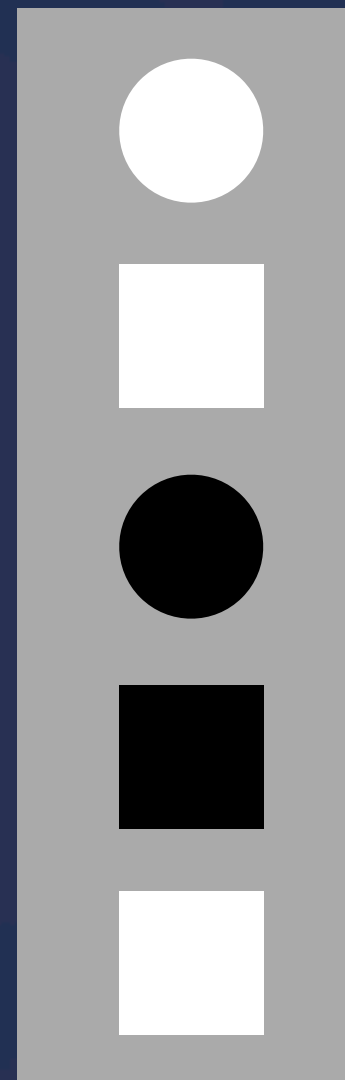
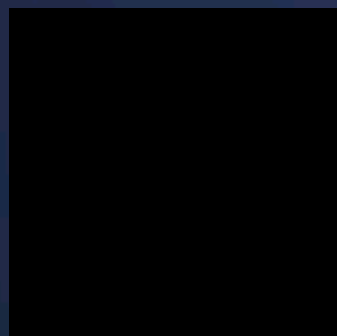
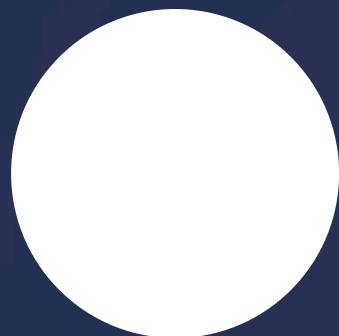
Circle

Square

Square

Orthogonal Dimensions

Shape **and** lightness



Circle

Square

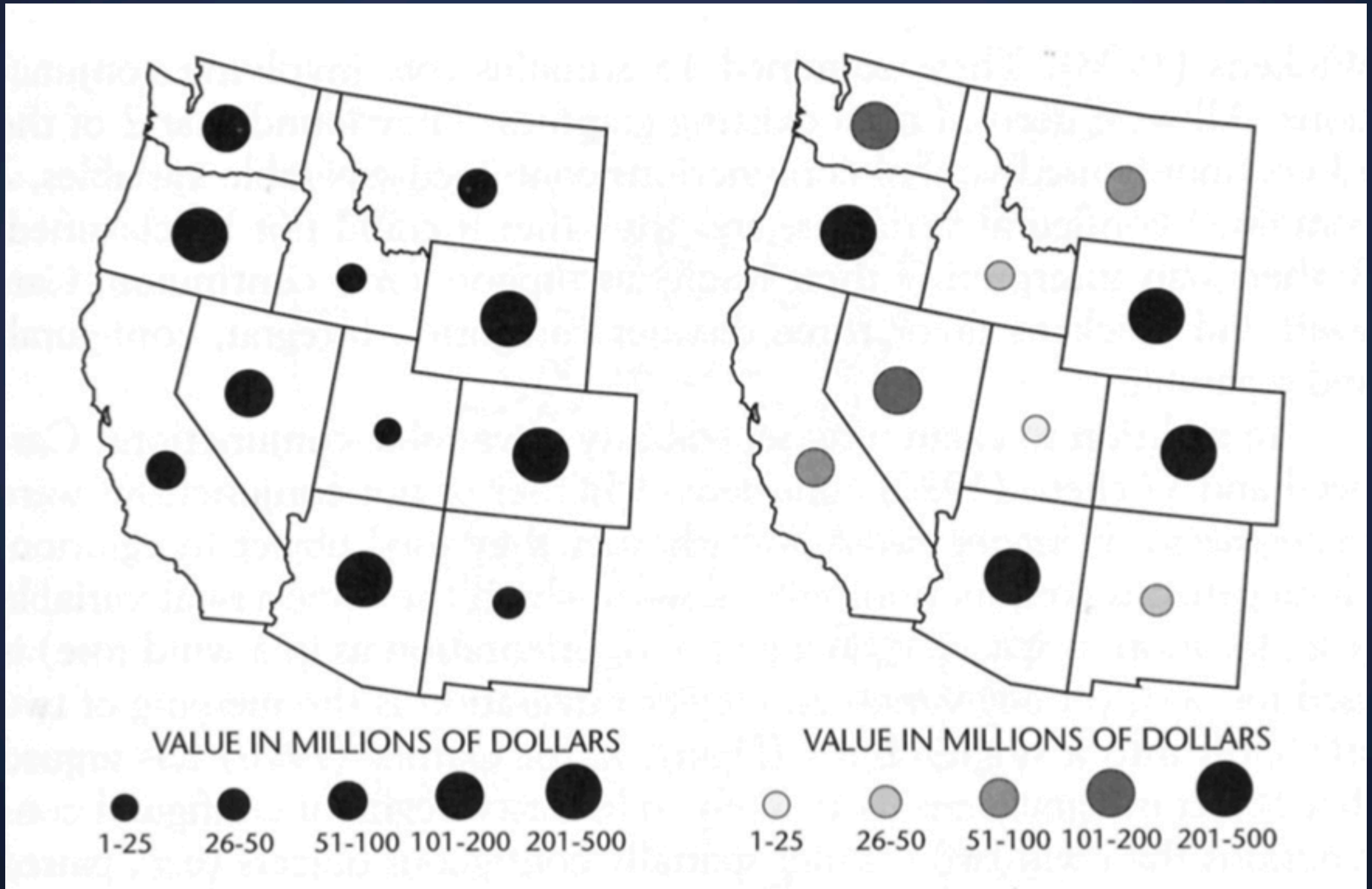
Circle

Square

Square

Correlated Dimensions

Size and Value



Orthogonal Dimensions

Aspect Ratio: Size and Size

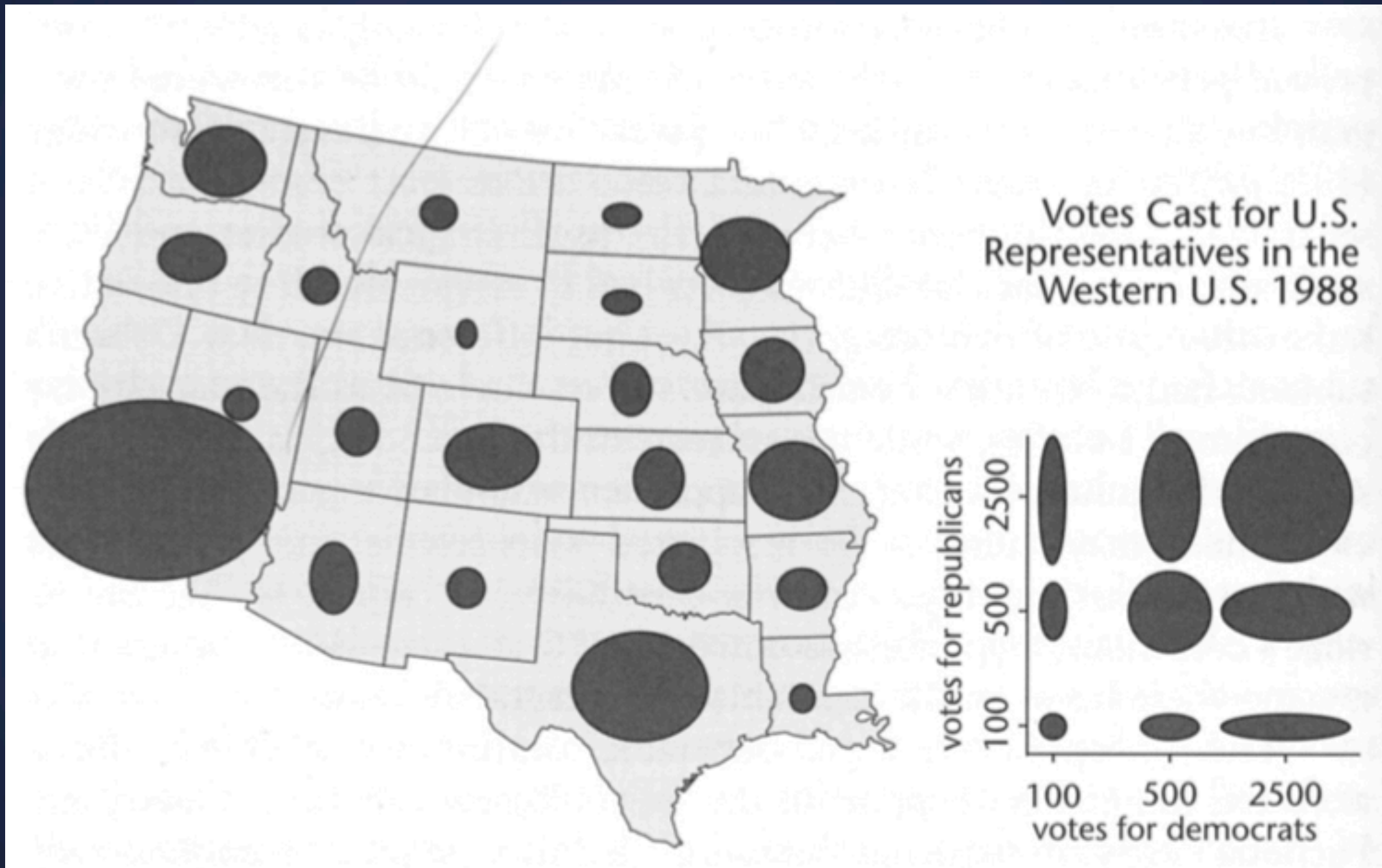
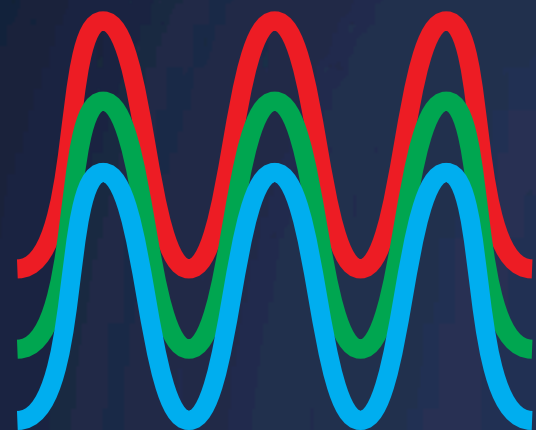


FIGURE 3.38. An example of the use of an ellipse as a map symbol in which the horizontal and vertical axes represent different (but presumably related) variables.

From Light to Visualization

Interpretations and Interpolations



Signal Detection

Which one is brighter?



Signal Detection

Which one is brighter?

[128,128,128]



[144,144,144]



Signal Detection

Which one is brighter?

Signal Detection

Which one is brighter?



Signal Detection

Which one is brighter?

[136,136,136]



[128,128,128]



Just noticeable difference

Weber's Law

$$JND = \frac{\Delta I}{I}$$

JND : constant

I : intensity

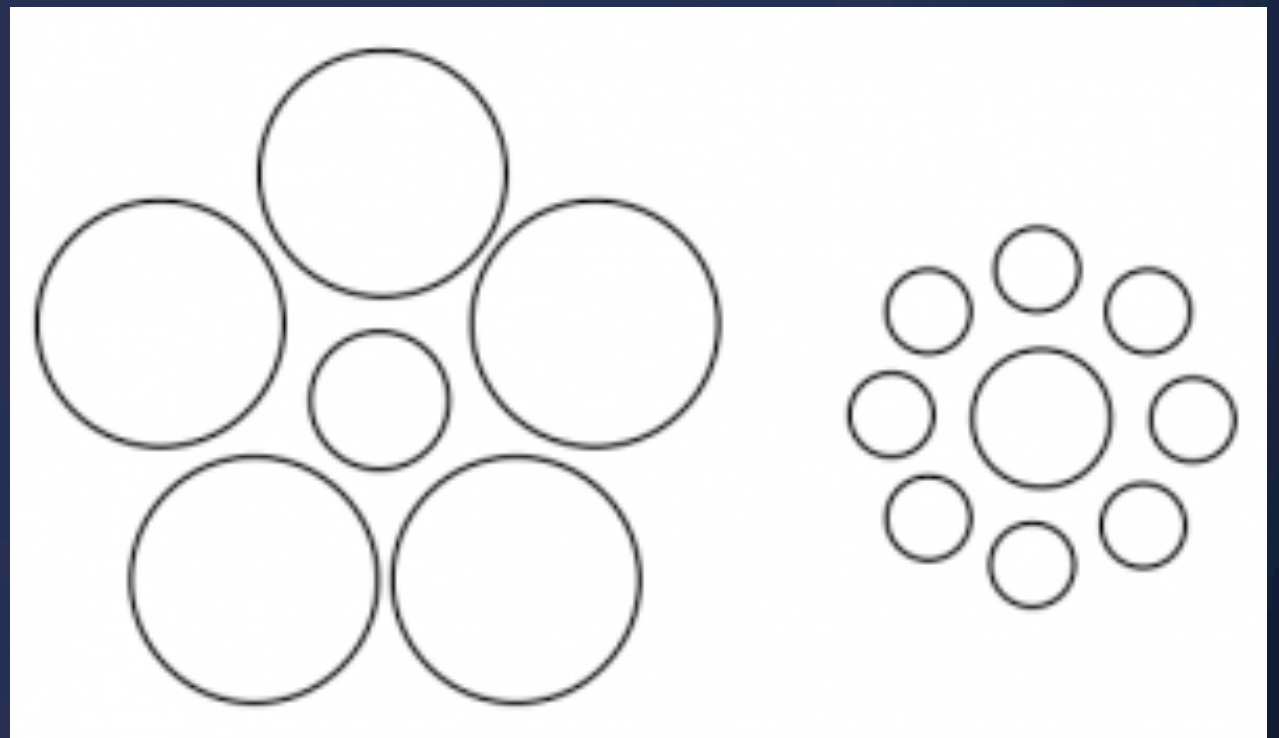
Just noticeable difference

Weber's Law

$$JND = \frac{\Delta I}{I}$$

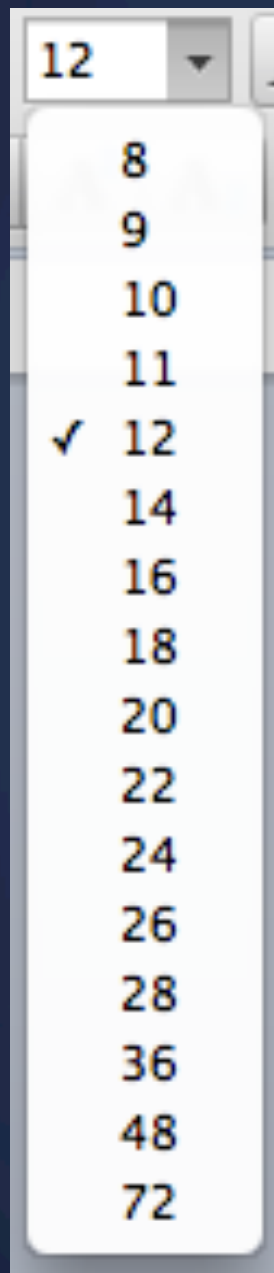
JND : constant
I : intensity

Ratio is much more
important
than magnitude



Steps in font size

Sizes standardized in 16th century



a a a a a a a a a a a a a a a a a

Magnitude Estimation

How much bigger is the lower bar?



Magnitude Estimation

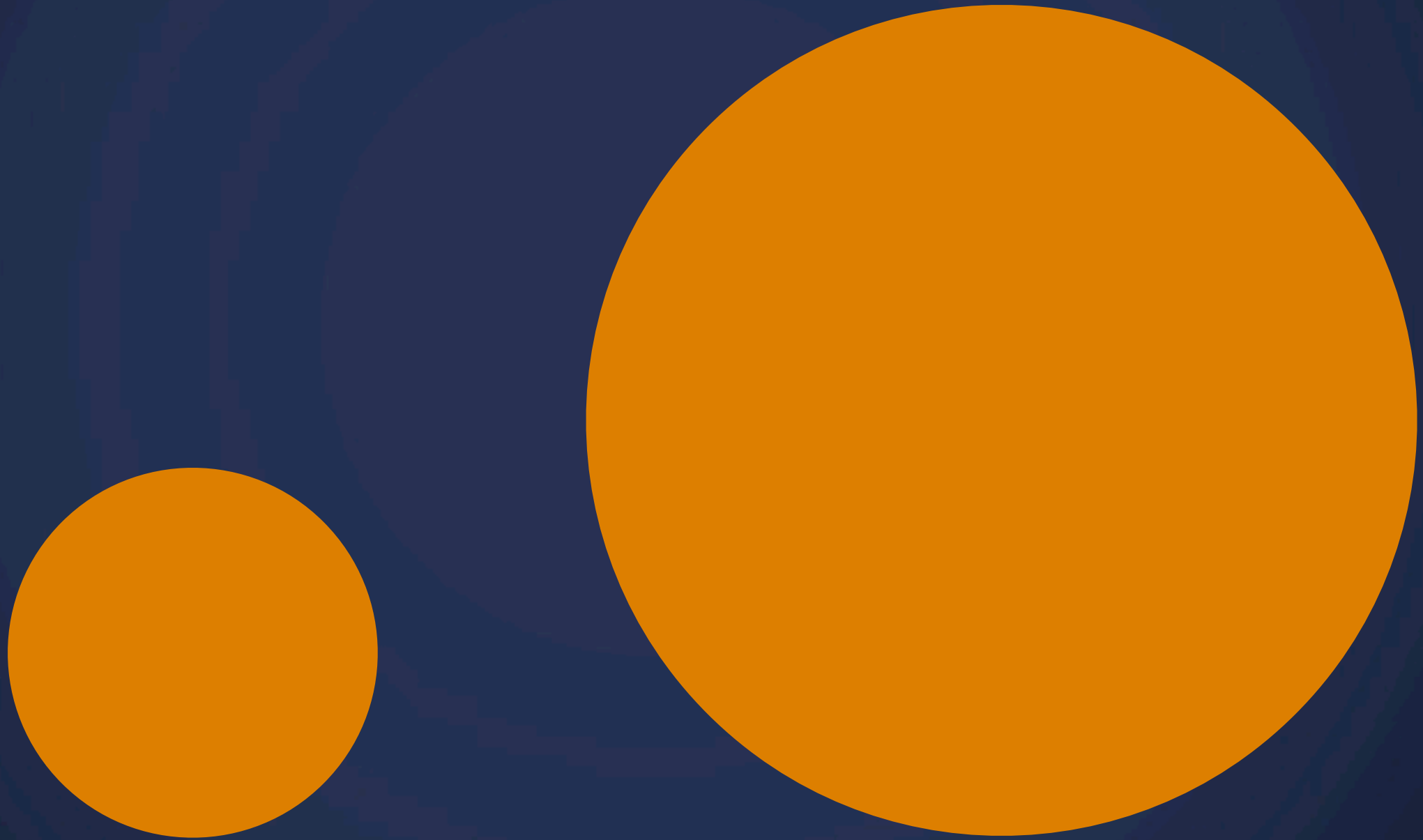
How much bigger is the lower bar?



×4

Magnitude Estimation

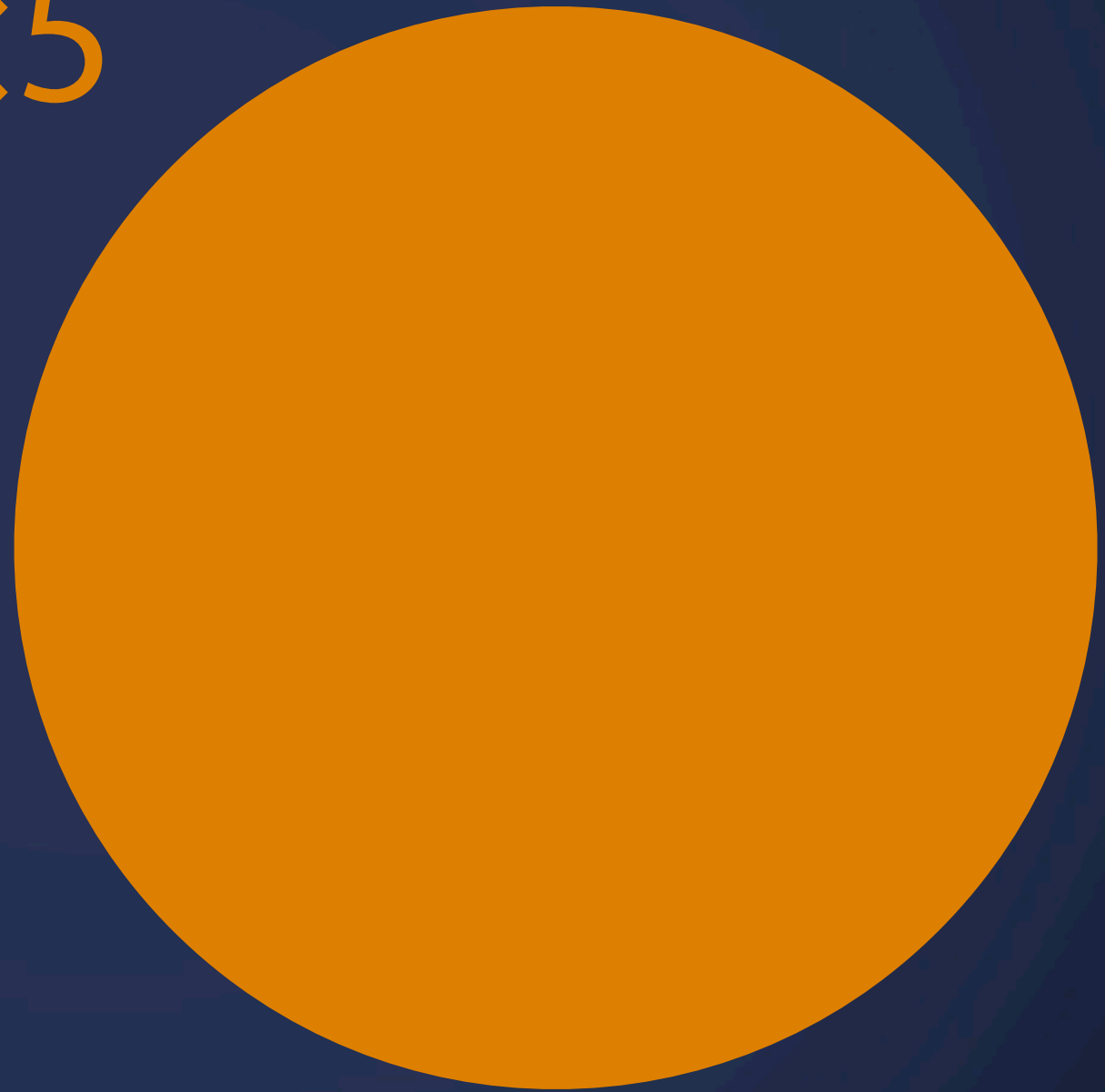
How much bigger is the right circle



Magnitude Estimation

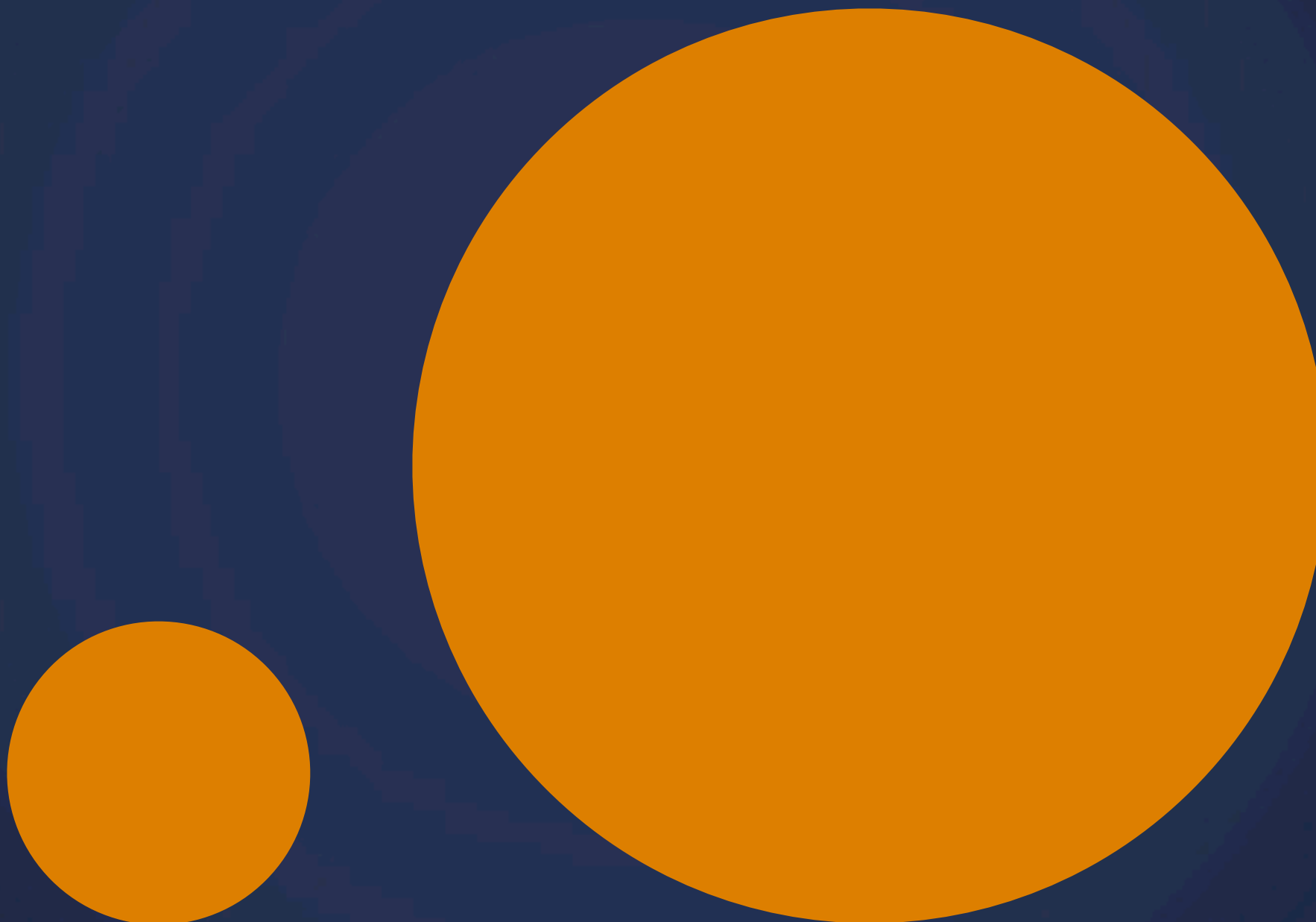
How much bigger is the right circle

$\times 5$



Magnitude Estimation

How much bigger is the right circle



Magnitude Estimation

How much bigger is the right circle

x9



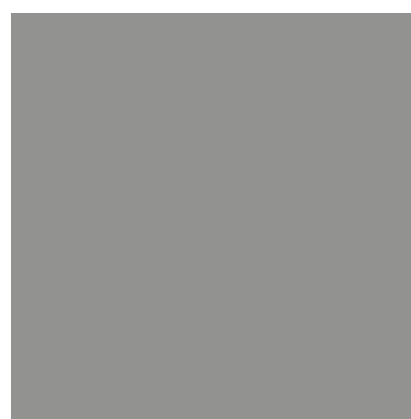
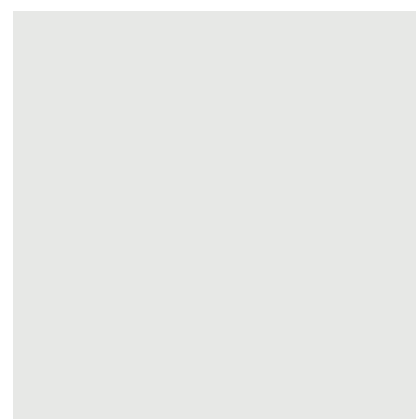
Magnitude Estimation

How much darker is the right square?



Magnitude Estimation

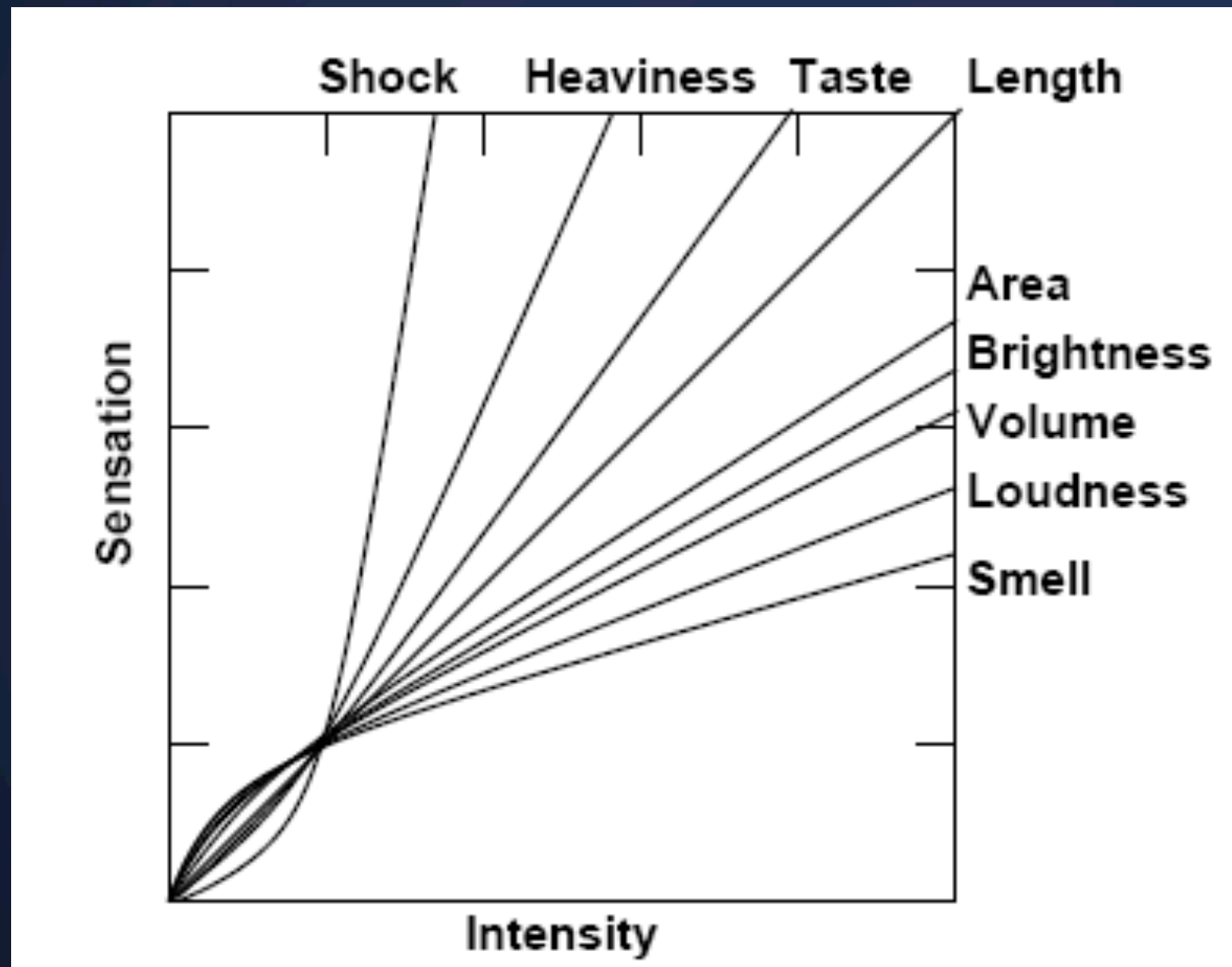
How much darker is the right square?



×4

Steven's Power Law

Under- and overestimation of magnitudes



$$S = I^p$$

$$p < 1$$

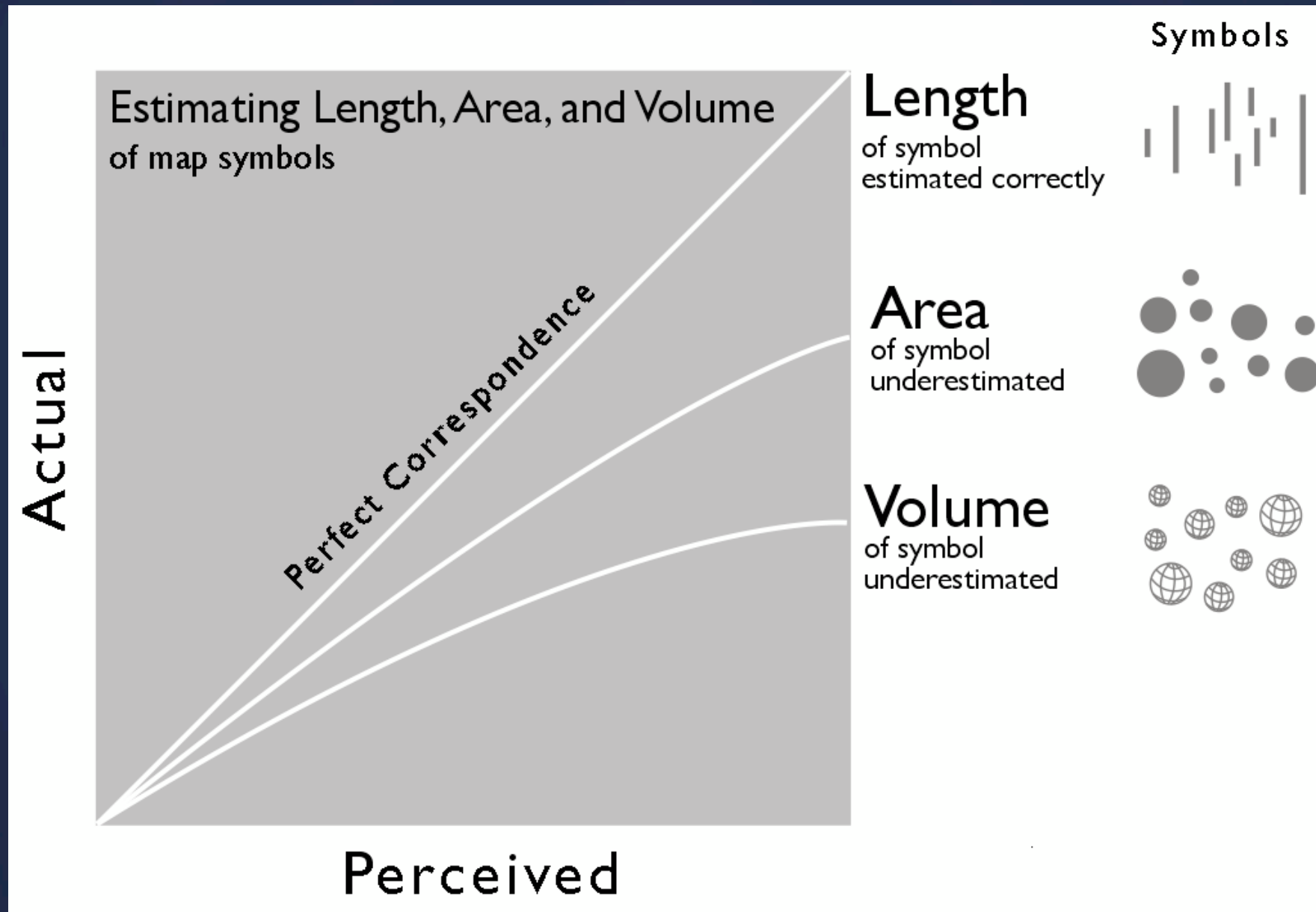
under-estimate

$$p > 1$$

over-estimate

Steven's Power Law

Under- and overestimation of magnitudes

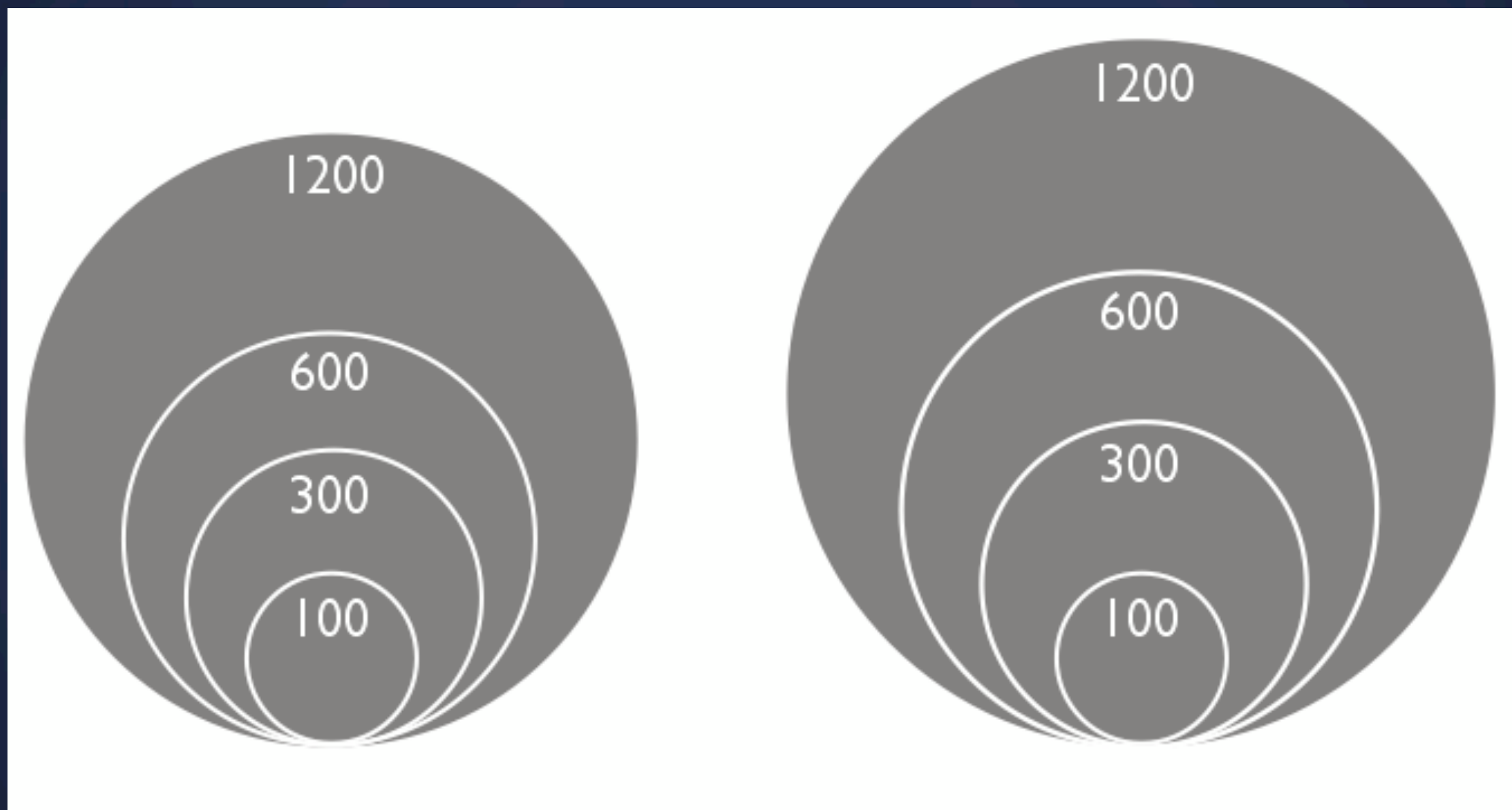


Steven's Power Law

Examples of power law exponents p

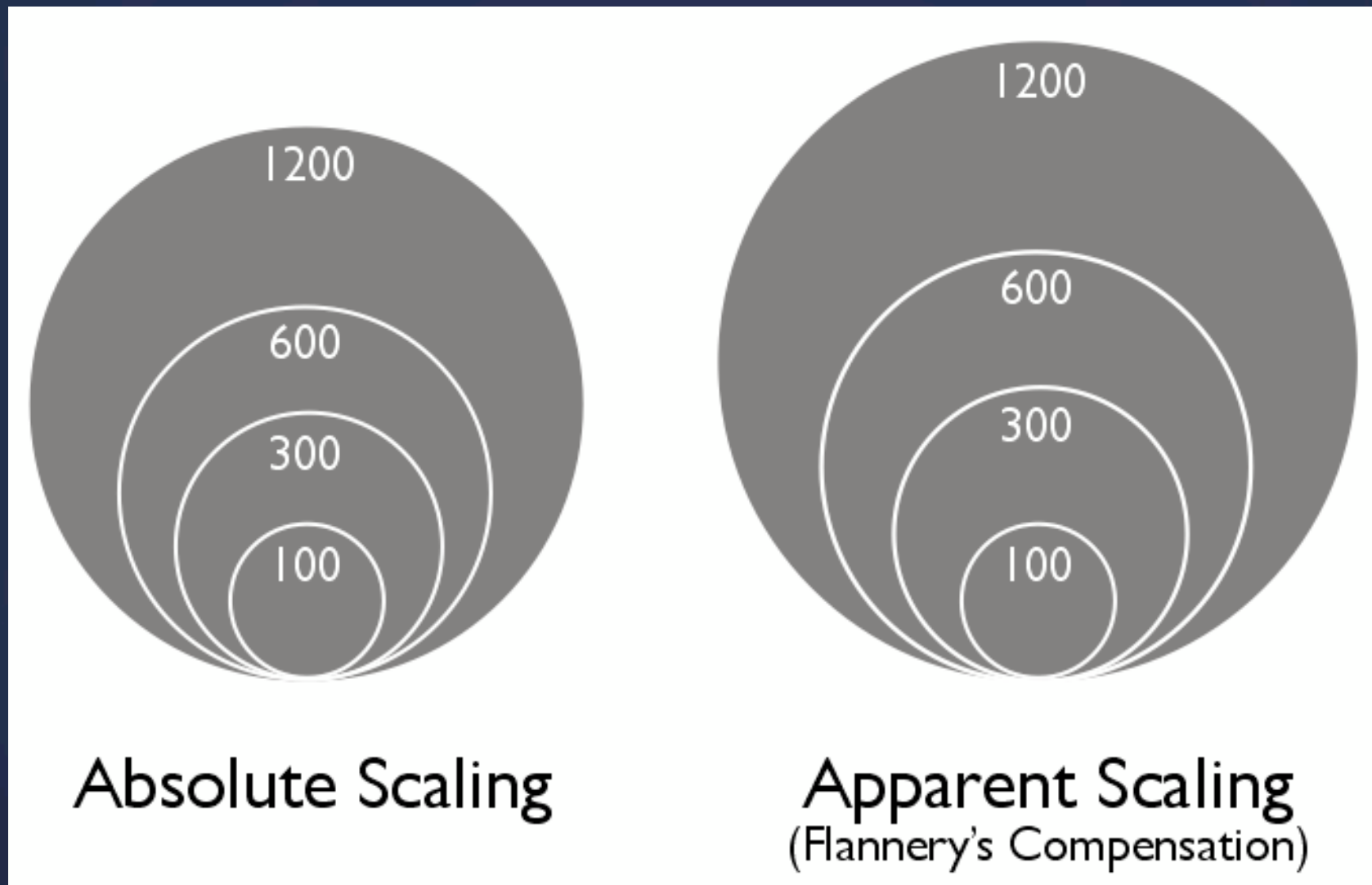
Sensation	Exponent
Loudness	0.6
Brightness	0.33
Smell	0.55 (Coffee) - 0.6 (Heptane)
Taste	0.6 (Saccharine) - 1.3 (Salt)
Temperature	1.0 (Cold) – 1.6 (Warm)
Vibration	0.6 (250 Hz) – 0.95 (60 Hz)
Duration	1.1
Pressure	1.1
Heaviness	1.45
Electric Shock	3.5

Which one is more accurate?



Apparent magnitude scaling

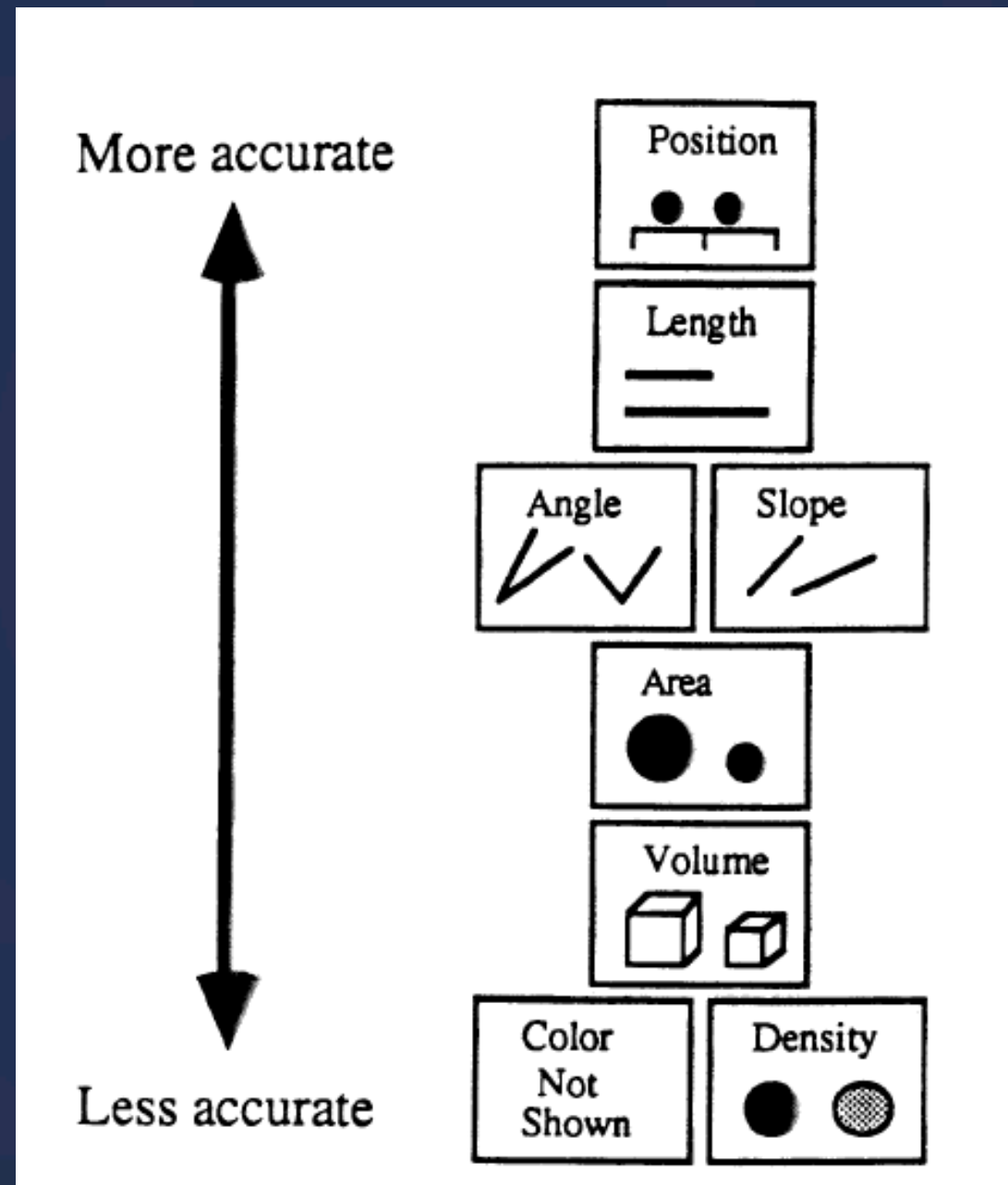
Compensating magnitude to match perception



<http://makingmaps.net/2007/08/28/perceptual-scaling-of-map-symbols/>

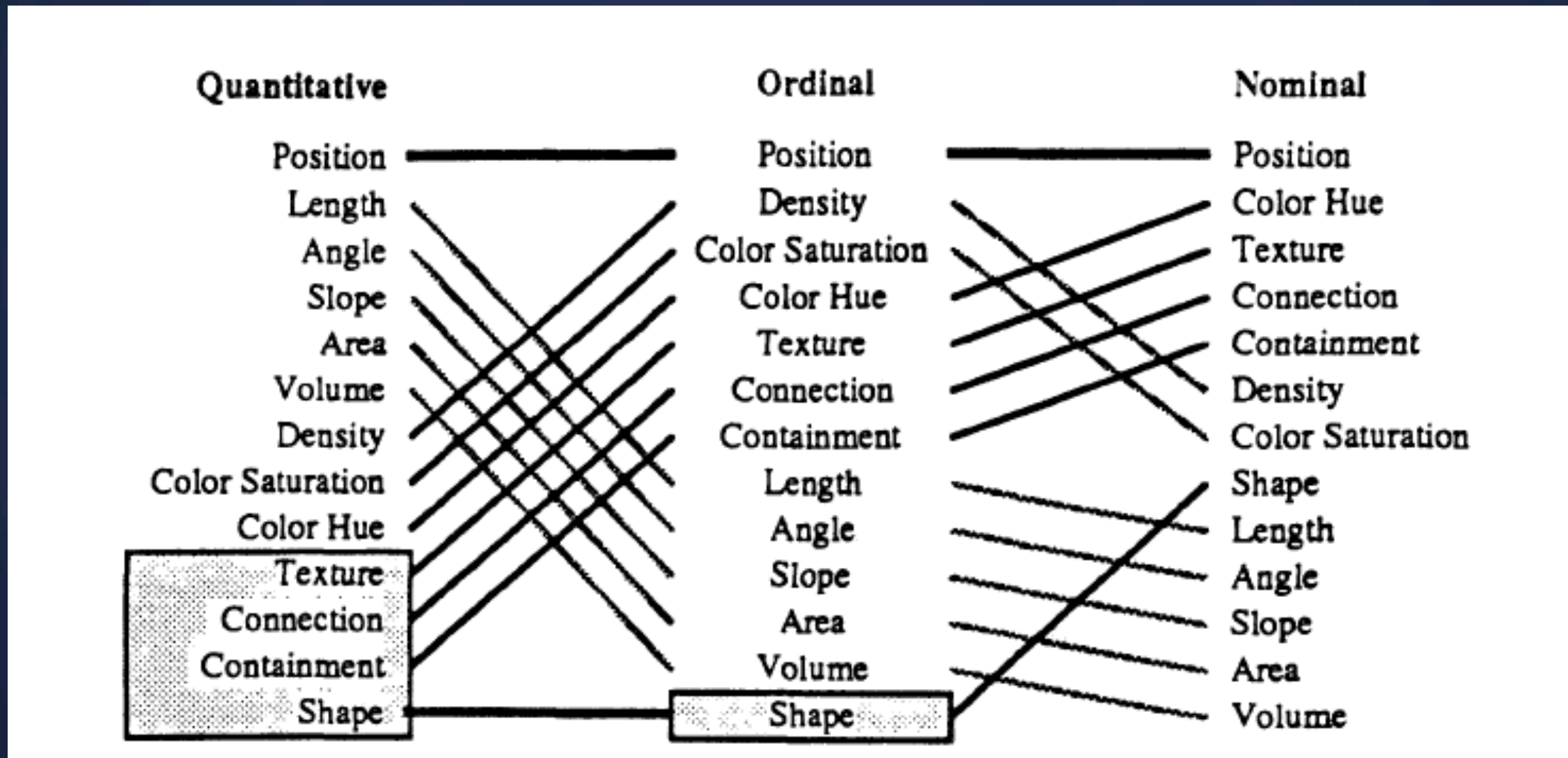
Encodings

Hierarchy of accuracy



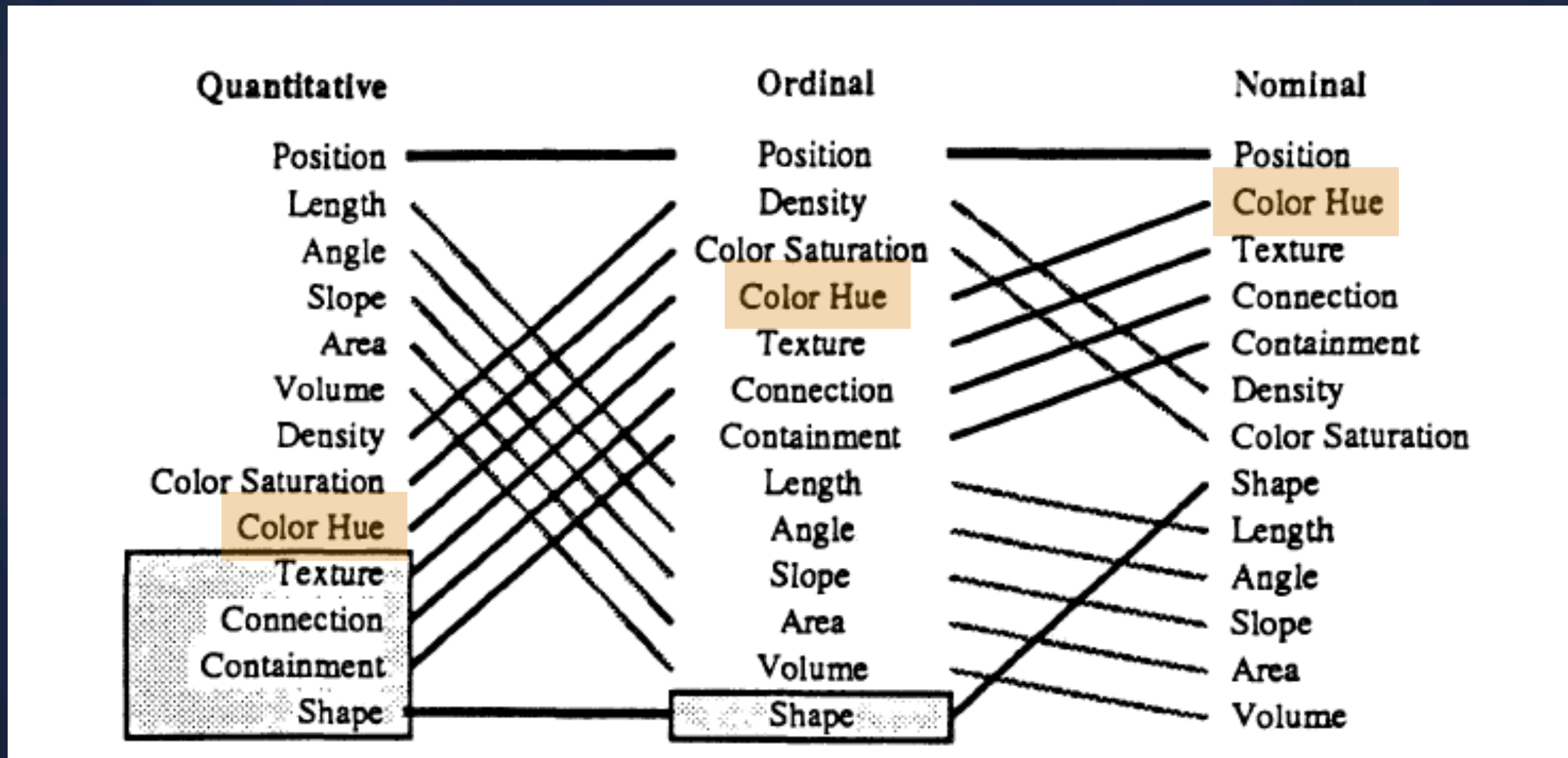
Encodings

Rankings of perceptual tasks



Encodings

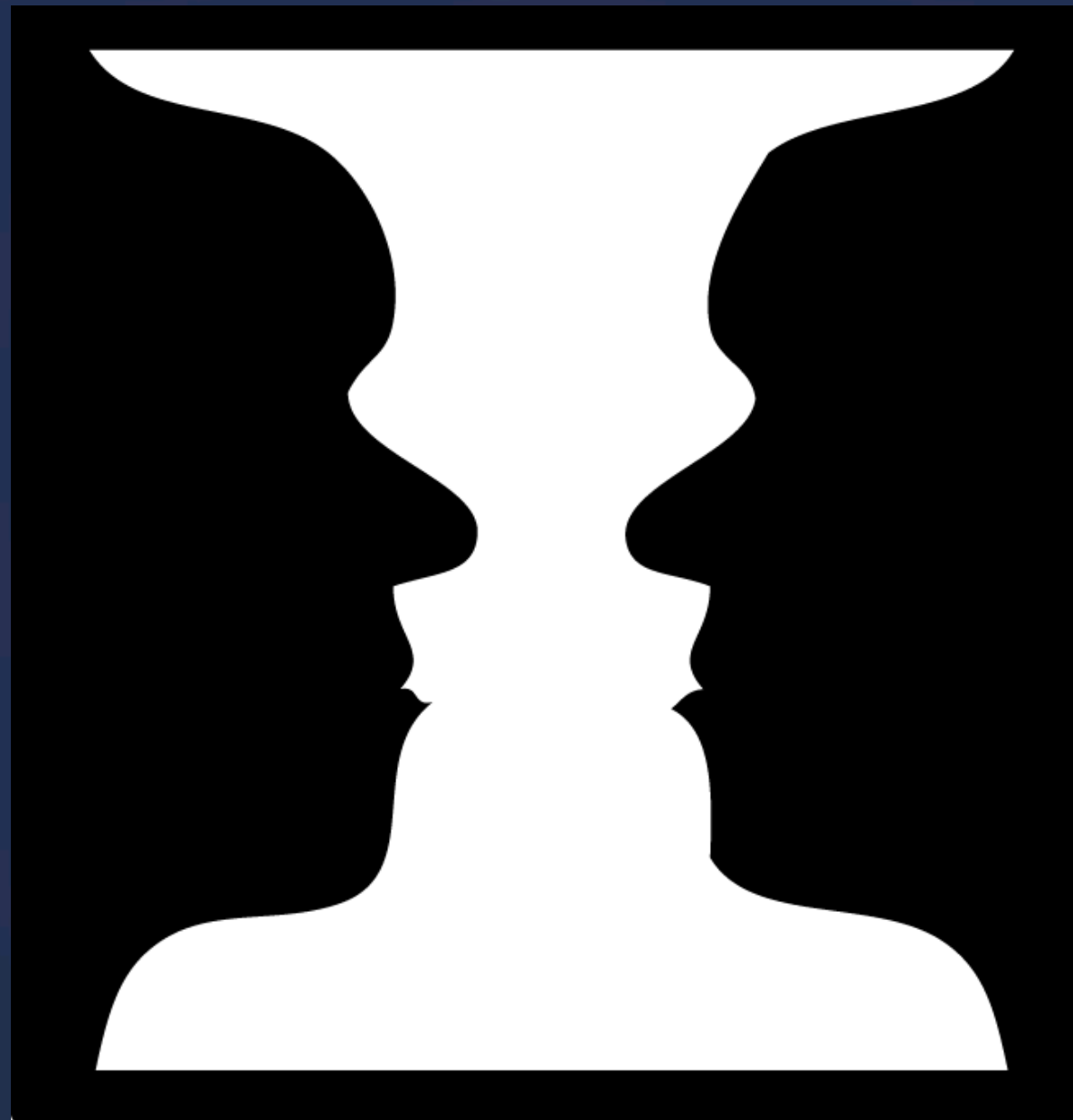
Rankings of perceptual tasks



Gestalt Grouping

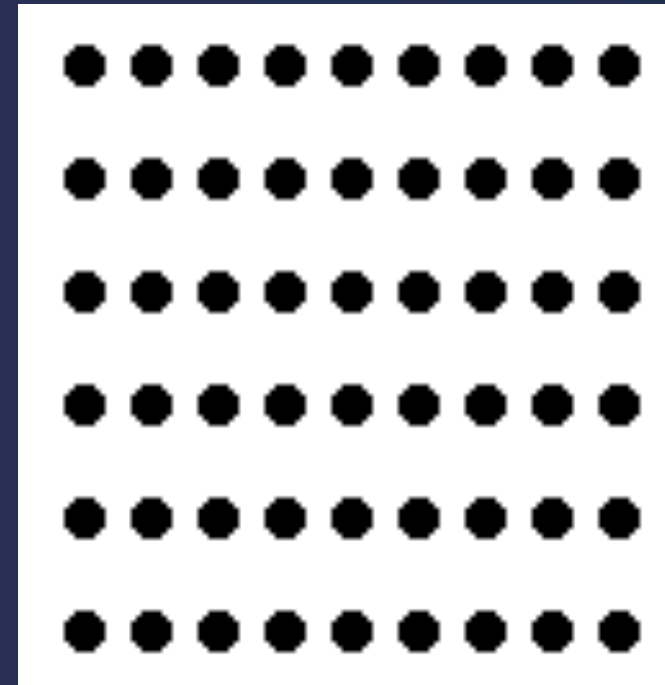
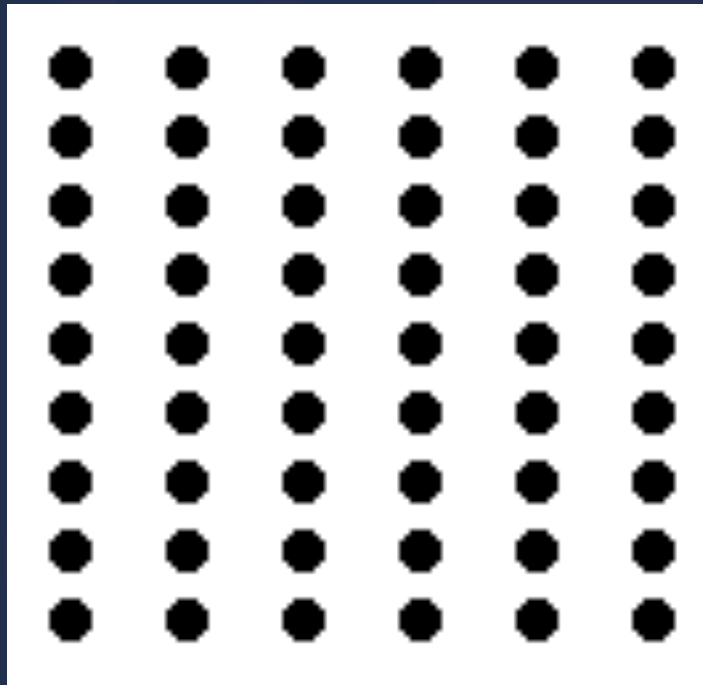
Principles

Figure & Ground



Principles

Proximity



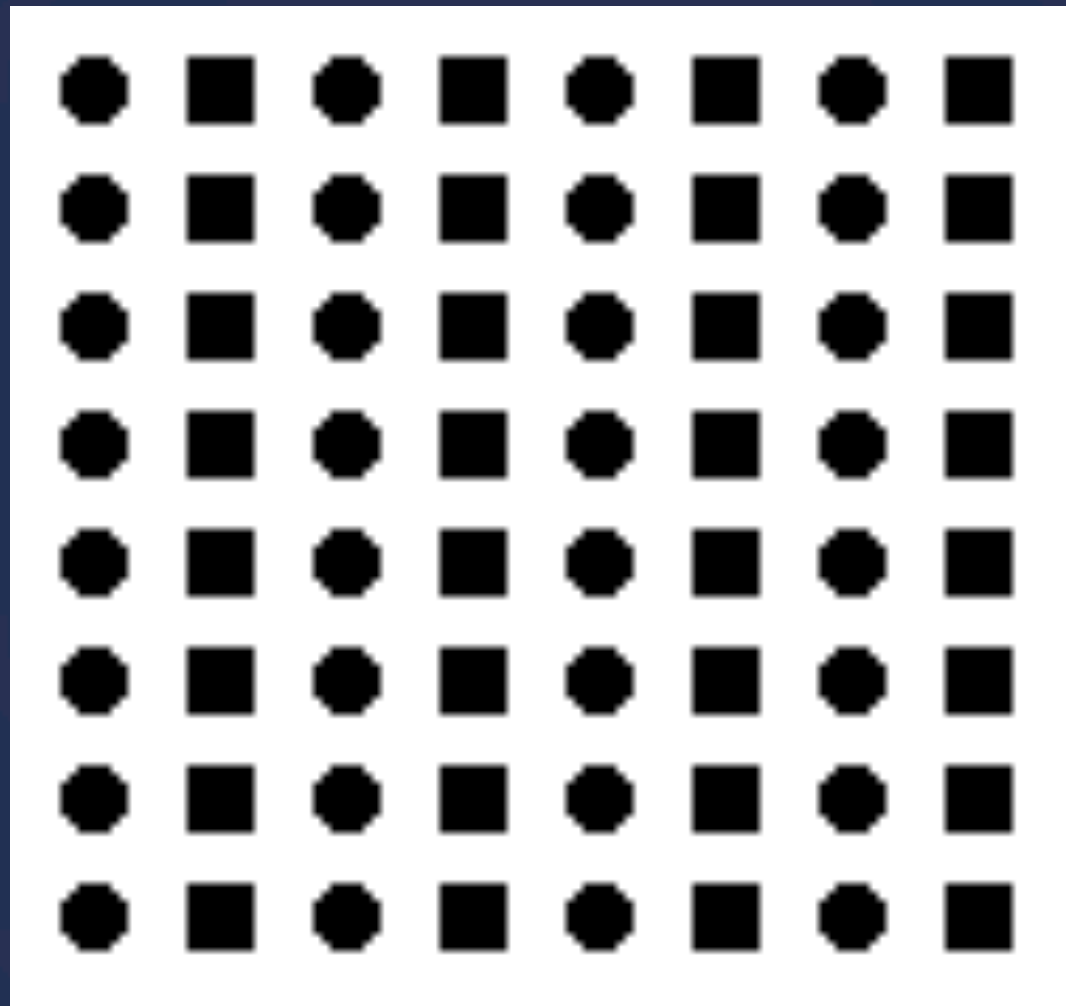
Principles

Proximity



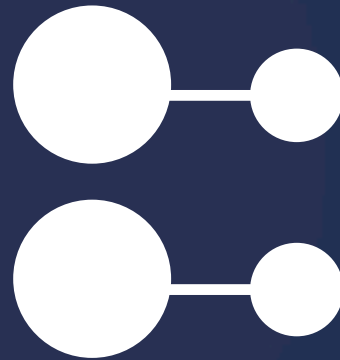
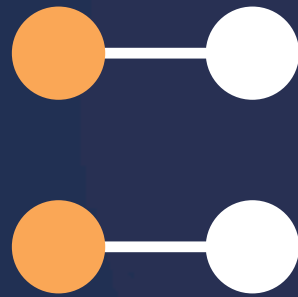
Principles

Similarity



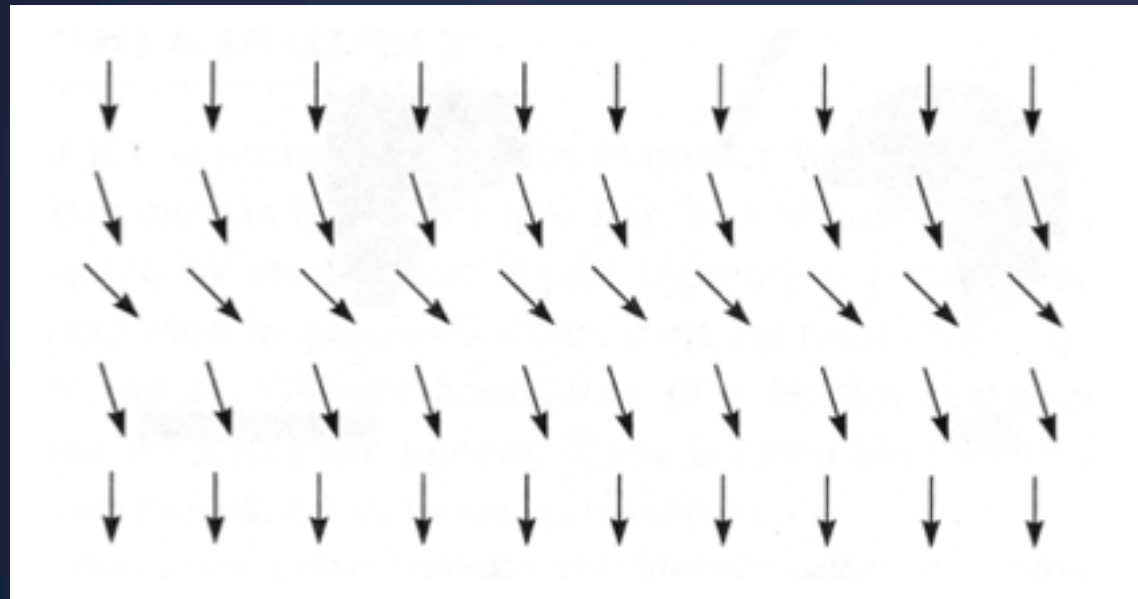
Principles

Connectedness



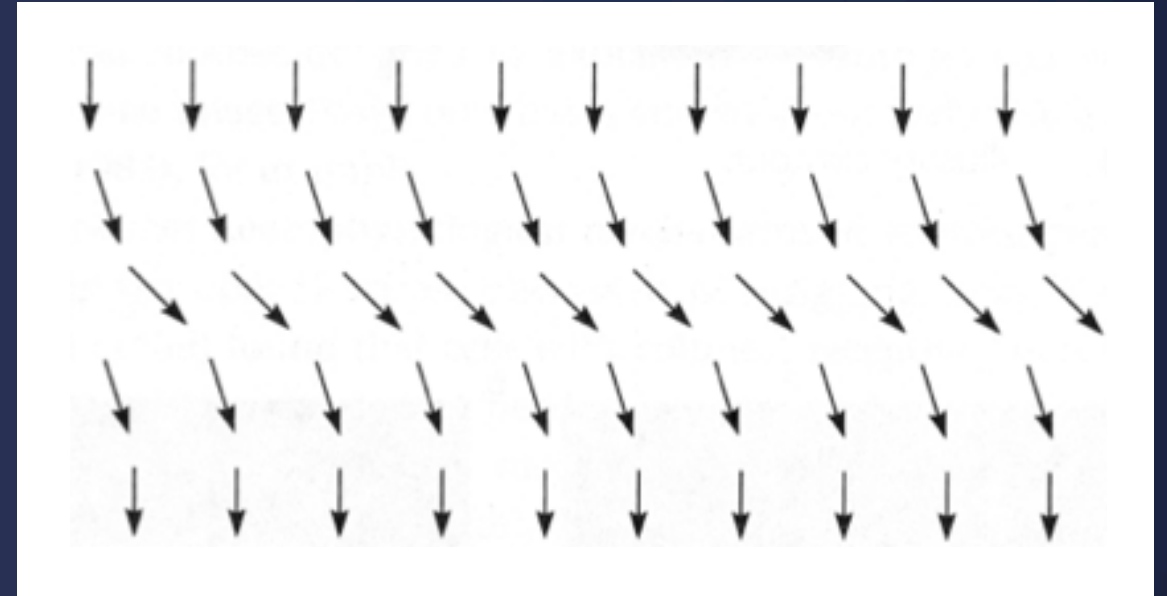
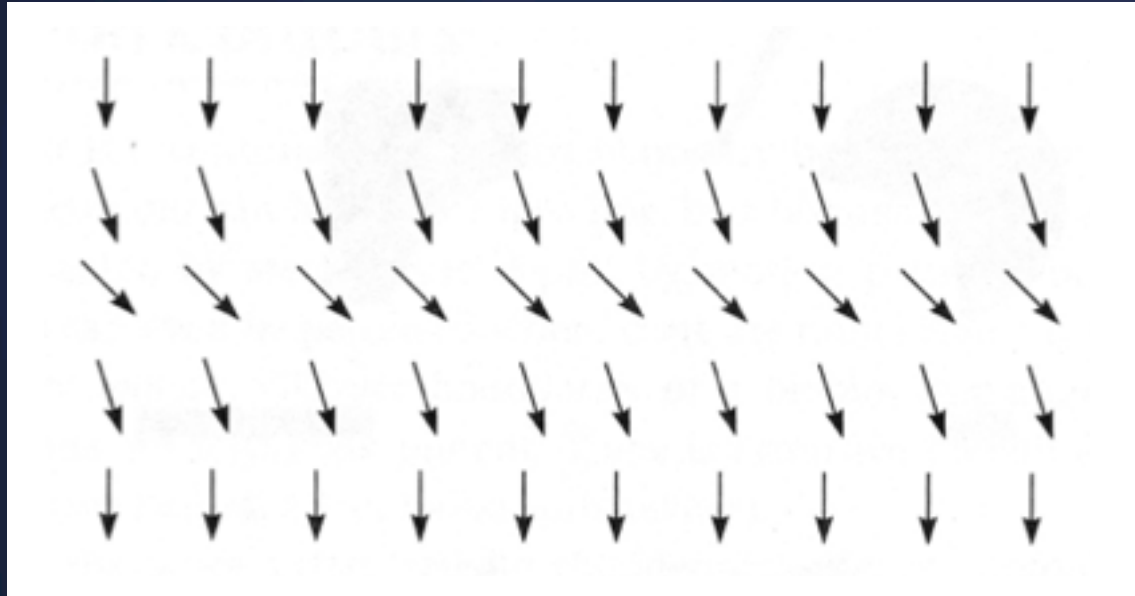
Principles

Continuity



Principles

Continuity



Principles

Closure



Principles

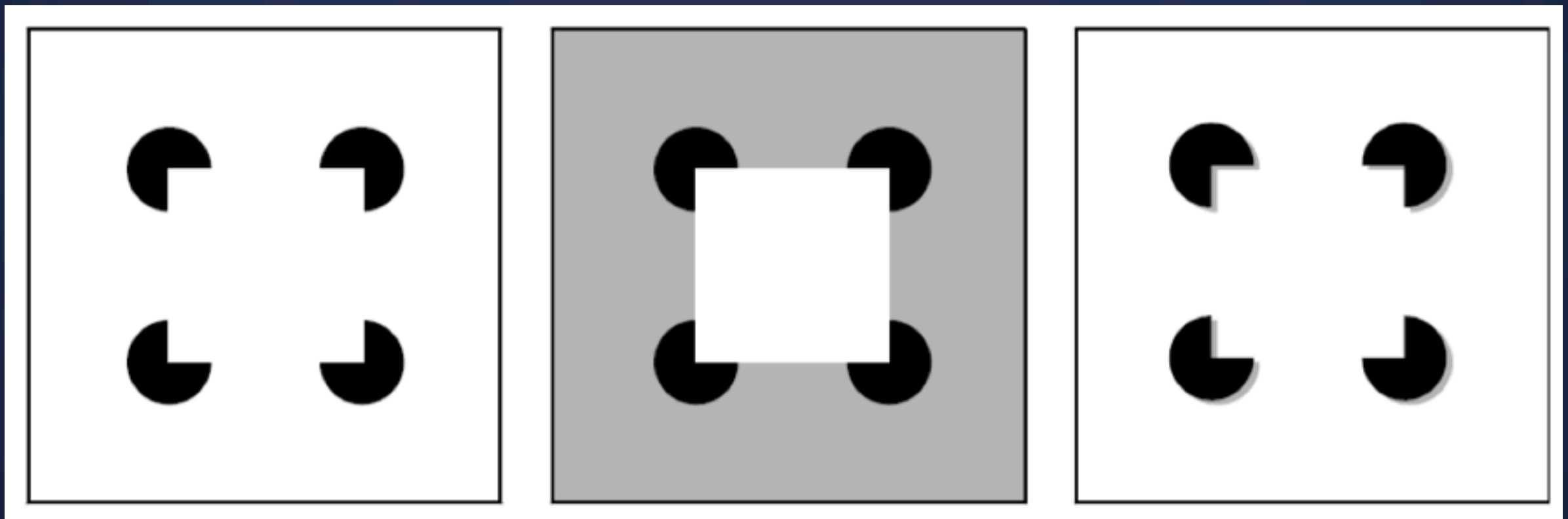
Closure



Illusory contours [from Durand 02]

Principles

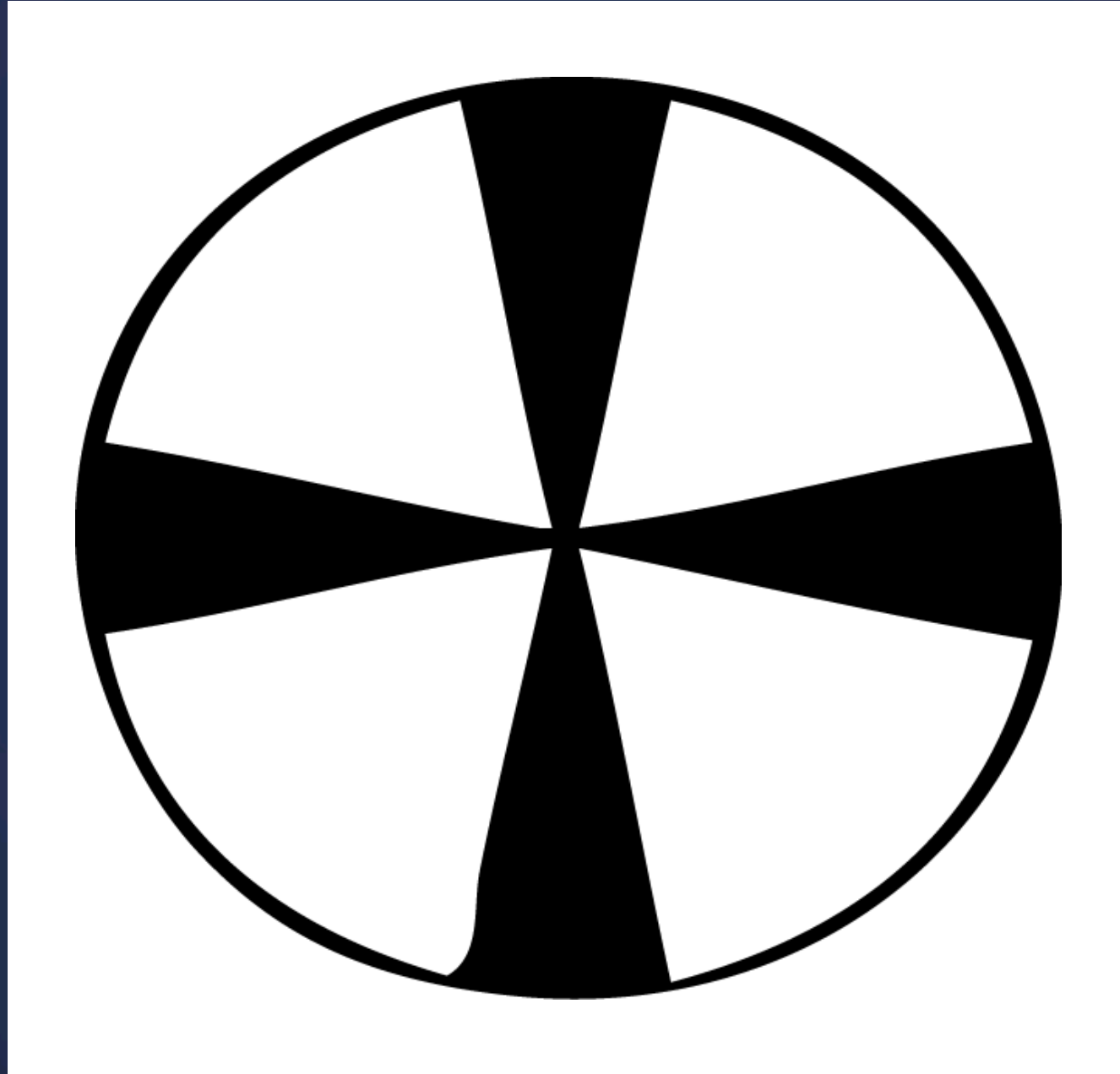
Closure



Illusory contours [from Durand 02]

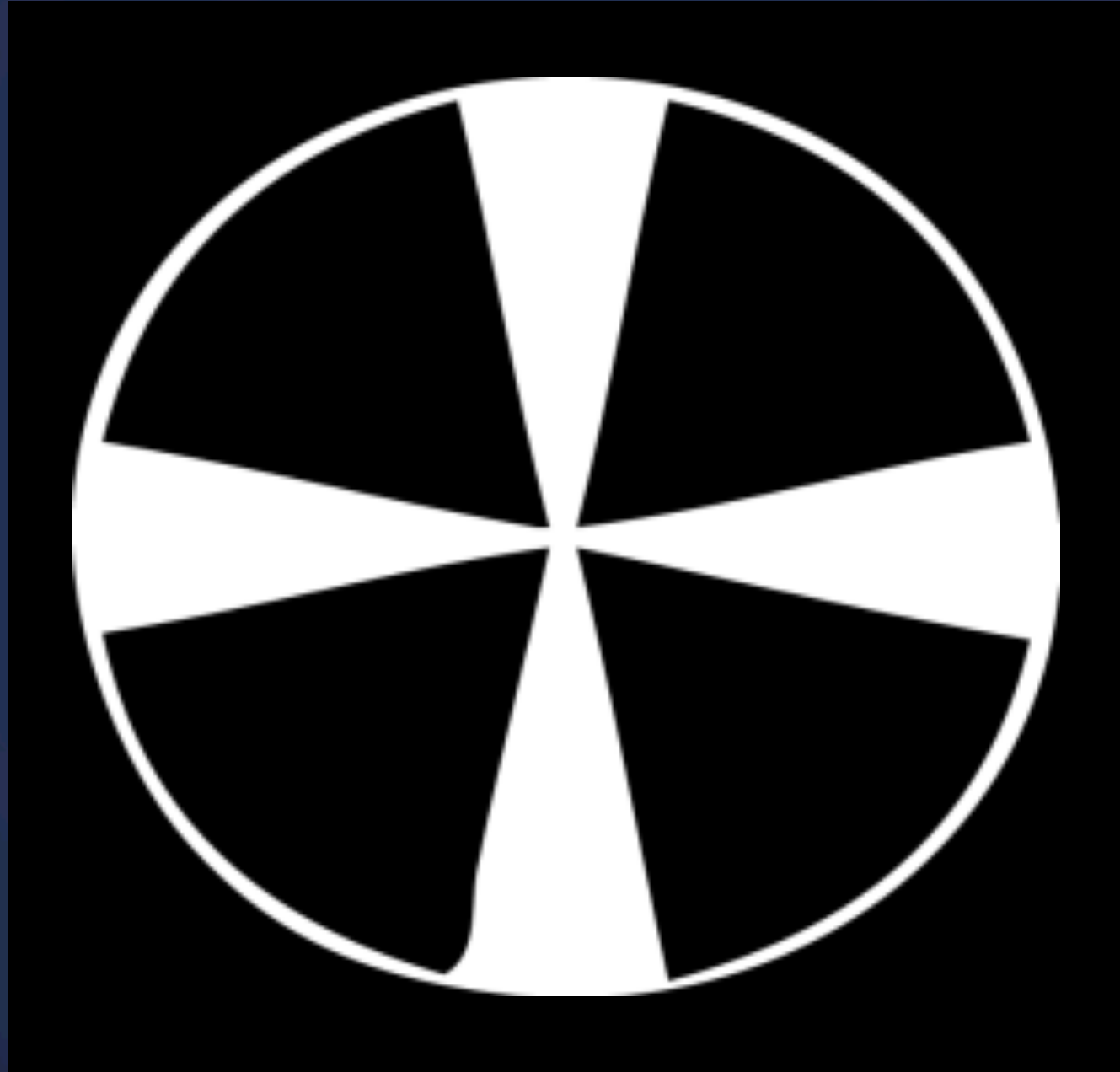
Principles

Smallness



Principles

Smallness



Principles

Surroundedness



Principles

Surroundedness

TIE

Recap

Feedback Assignment 2

What's in the data?



North America



Europe



Asia



South America



Oceania



Africa



Feedback Assignment 2

What's in the data?



Geographic data can – but doesn't need to be – on a map

North America



Europe



Asia



South America



Oceania



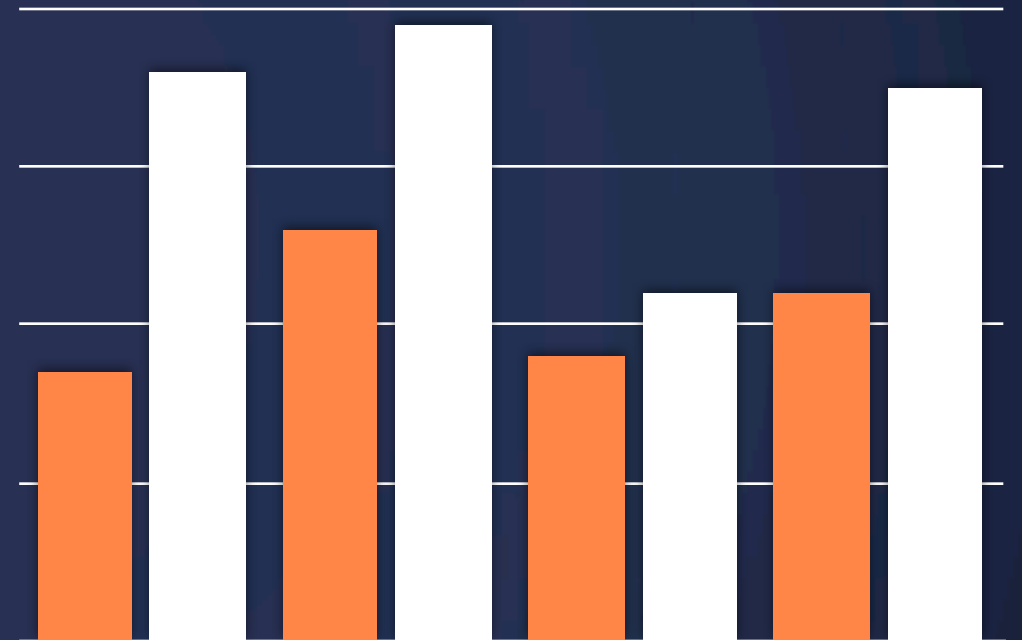
Africa



Feedback Assignment 2

Common Pitfalls

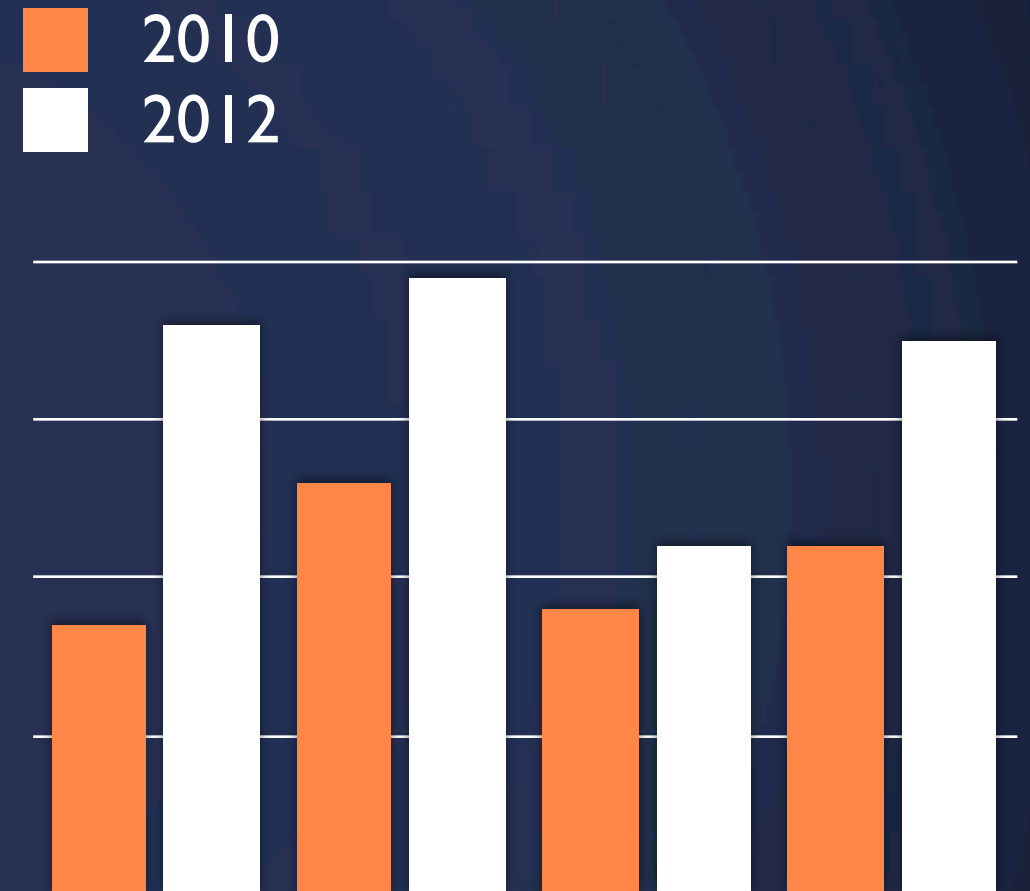
- **No Labels**
- No Axis
- No Title
- Too many elements
- Color Choice
- Distracting decorations



Feedback Assignment 2

Common Pitfalls

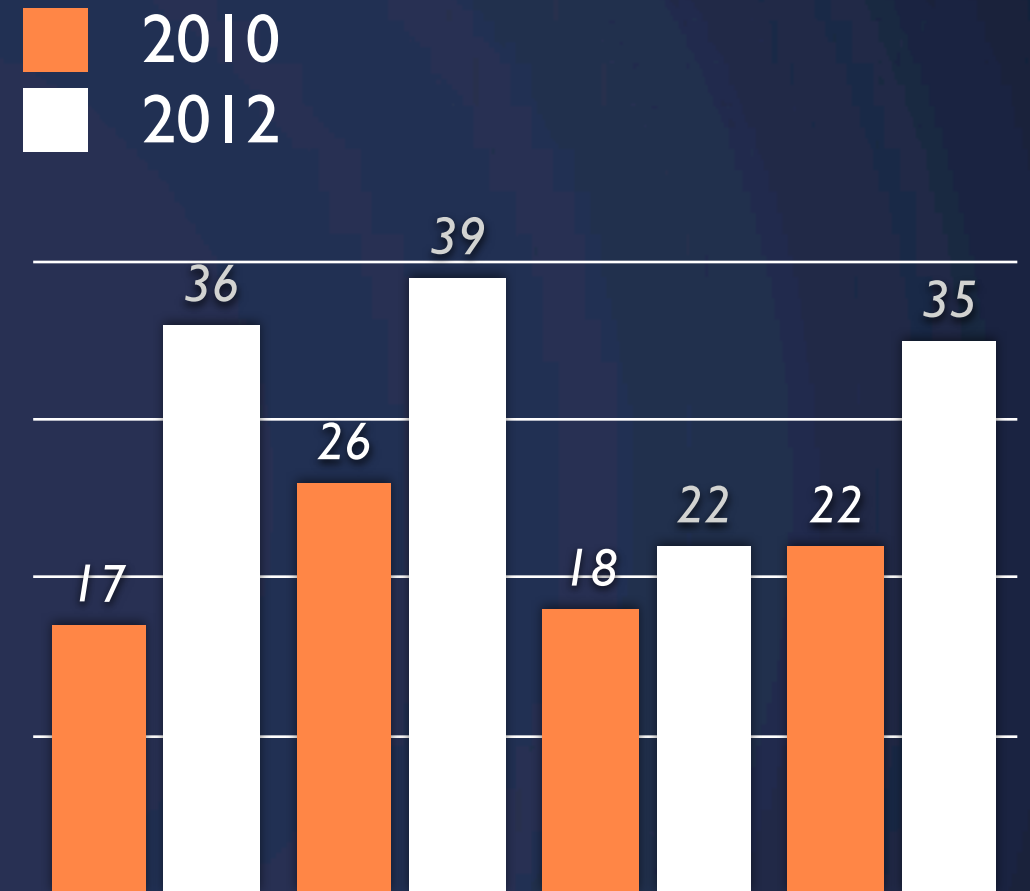
- **No Labels / Legend**
- No Axis
- No Title
- Too many elements
- Color Choice
- Distracting decorations



Feedback Assignment 2

Common Pitfalls

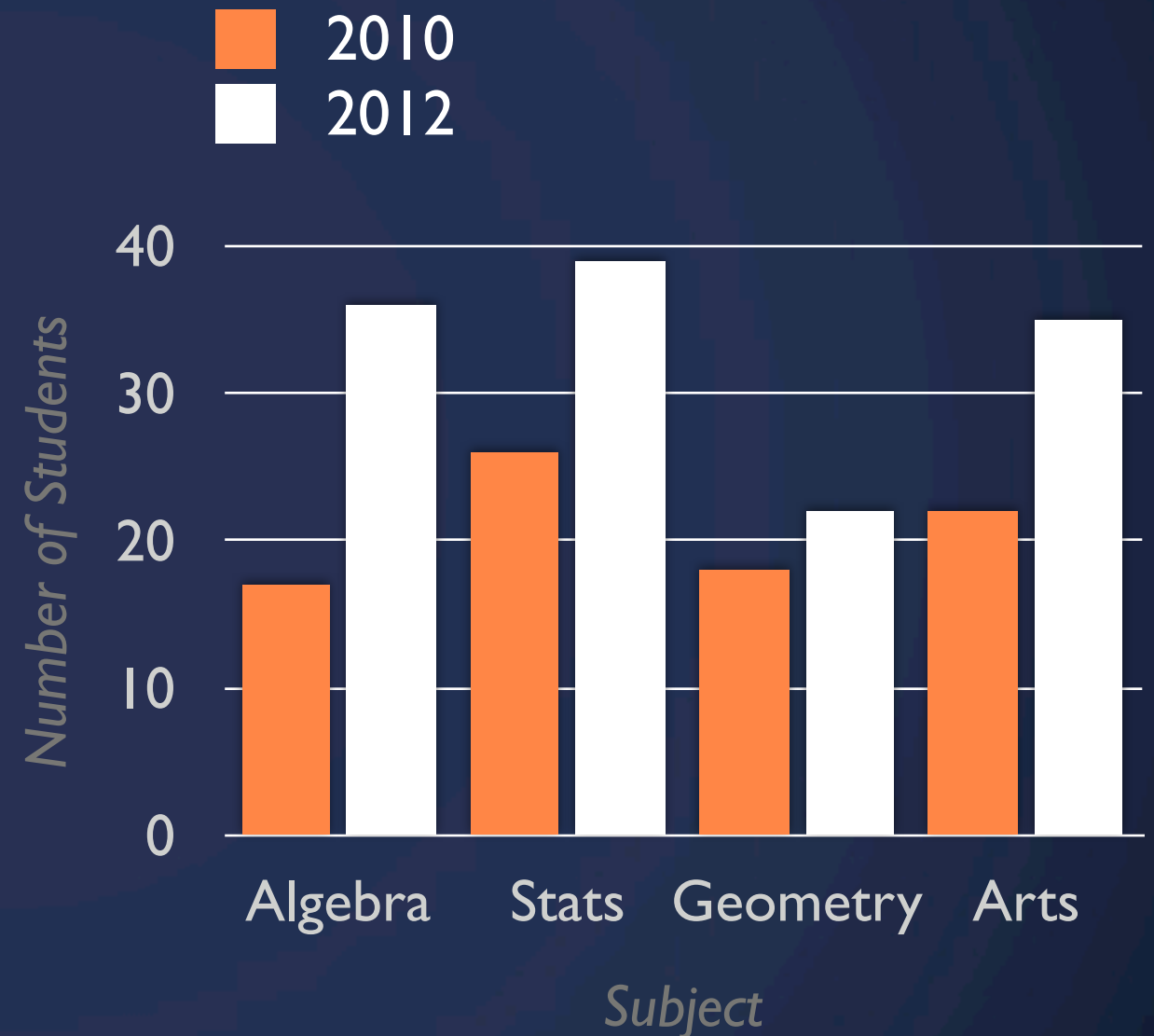
- No Labels / Legend
- No Axis
- No Title
- Too many elements
- Color Choice
- Distracting decorations



Feedback Assignment 2

Common Pitfalls

- No Labels / Legend
- **No Axis / Axis Titles**
- No Title
- Too many elements
- Color Choice
- Distracting decorations

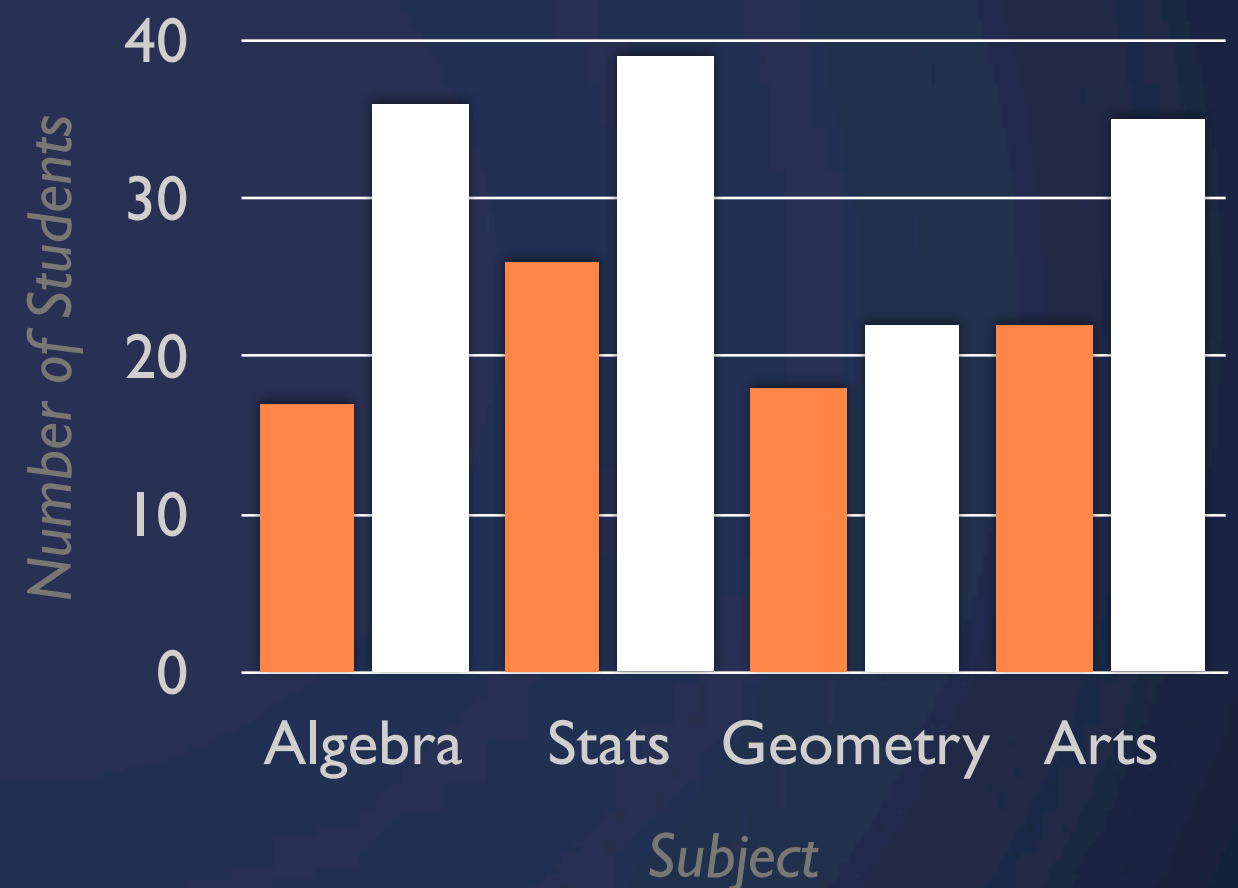


Feedback Assignment 2

Common Pitfalls

- No Labels / Legend
- No Axis / Axis Titles
- **No Title**
- Too many elements
- Color Choice
- Distracting decorations

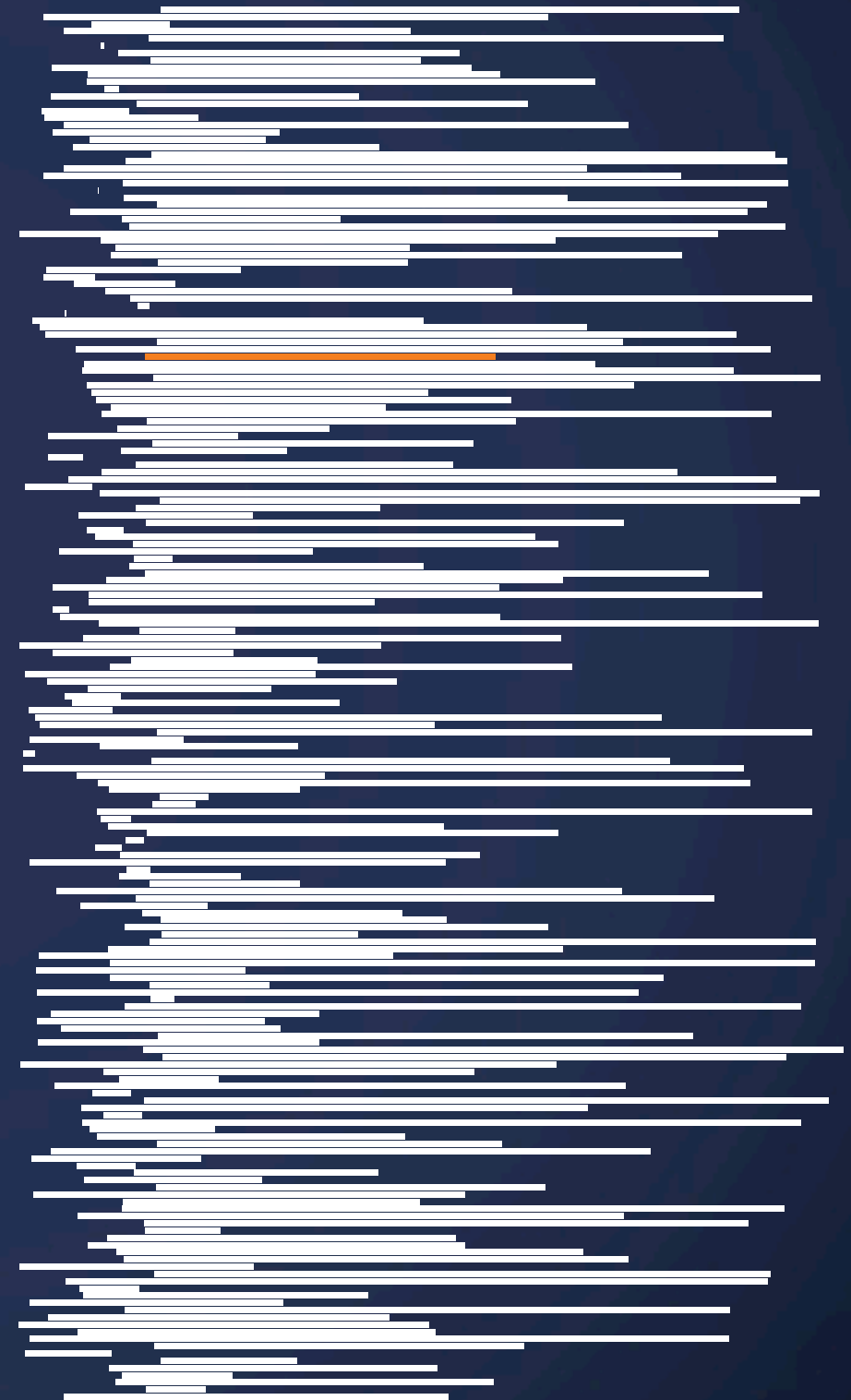
Student Breakdown by Subject



Feedback Assignment 2

Common Pitfalls

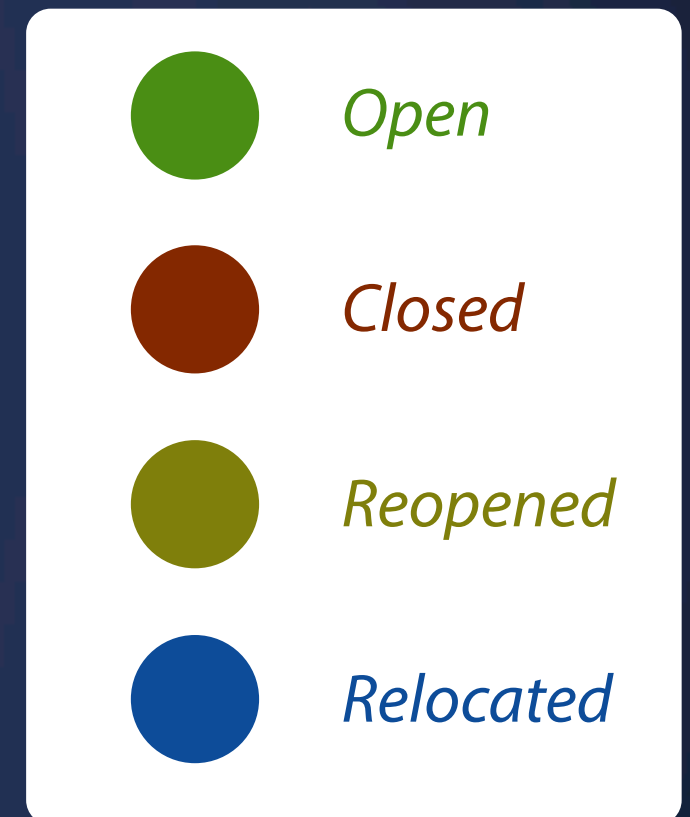
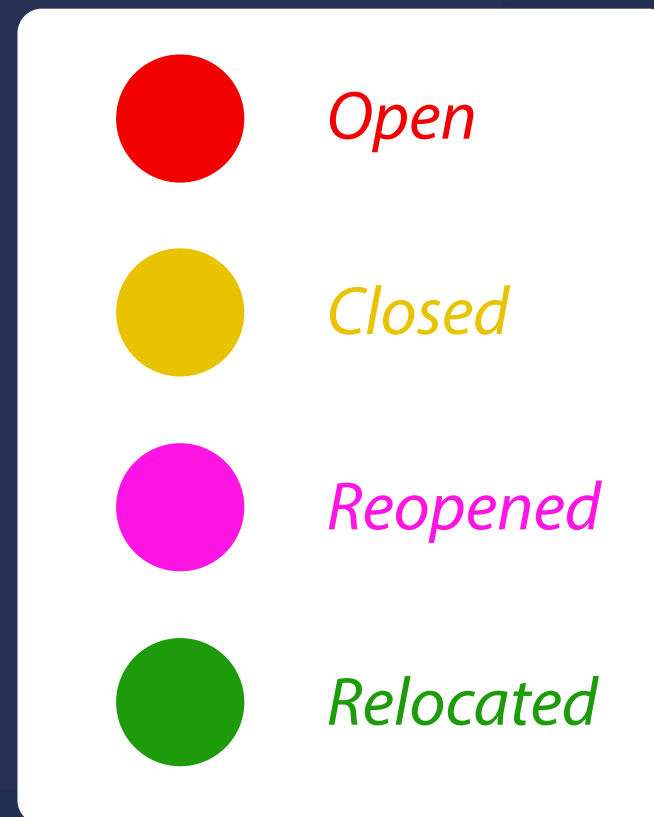
- No Labels / Legend
- No Axis / Axis Titles
- No Title
- **Too many elements**
- Color Choice
- Distracting decorations



Feedback Assignment 2

Common Pitfalls

- No Labels / Legend
- No Axis / Axis Titles
- No Title
- No Caption (if inline)
- **Color Choice**
- Distracting decorations

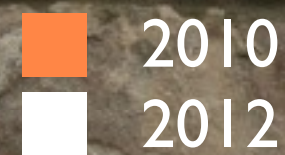
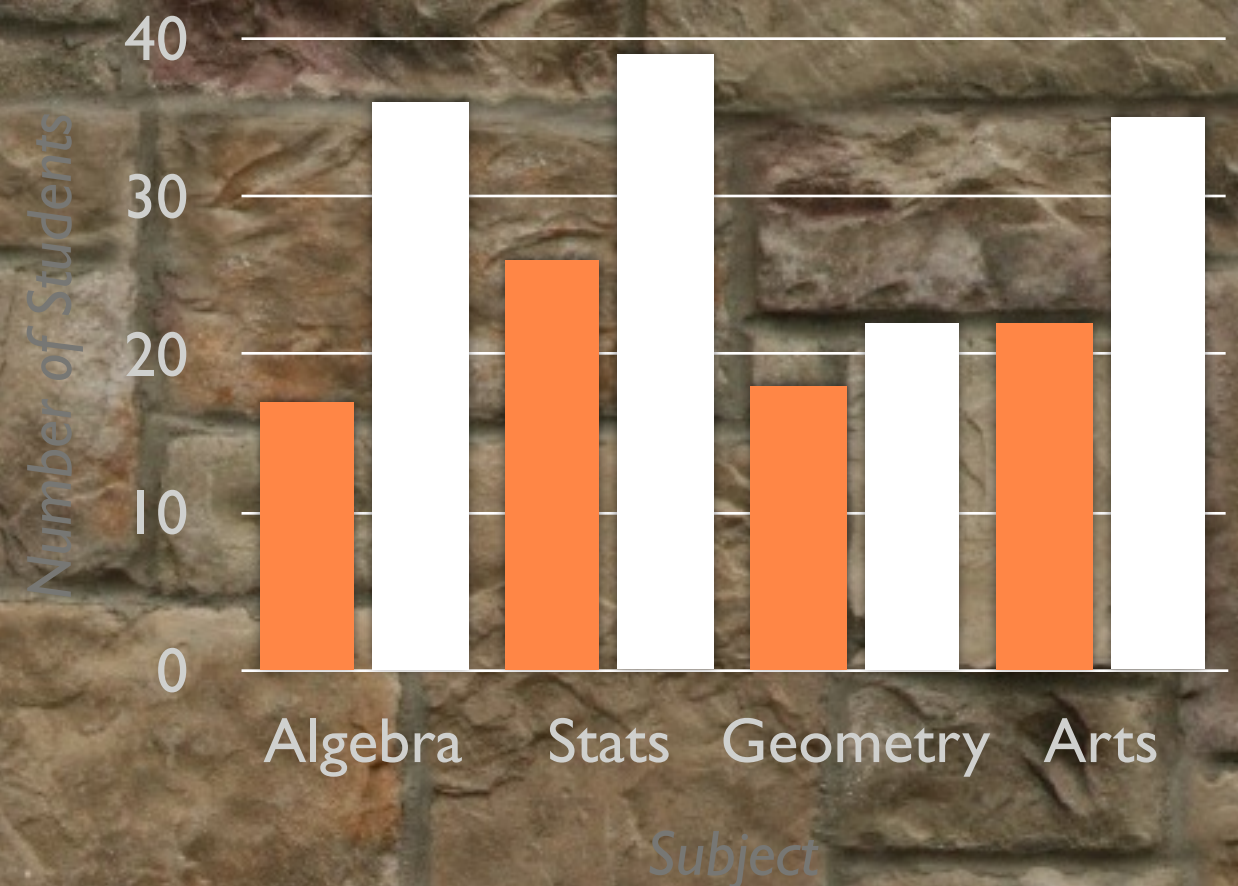


Feedback Assignment 2

Common Pitfalls

- No Labels / Legend
- No Axis / Axis Titles
- No Title
- No Caption (if inline)
- Color Choice
- **Distracting decorations**

Student Breakdown by Subject

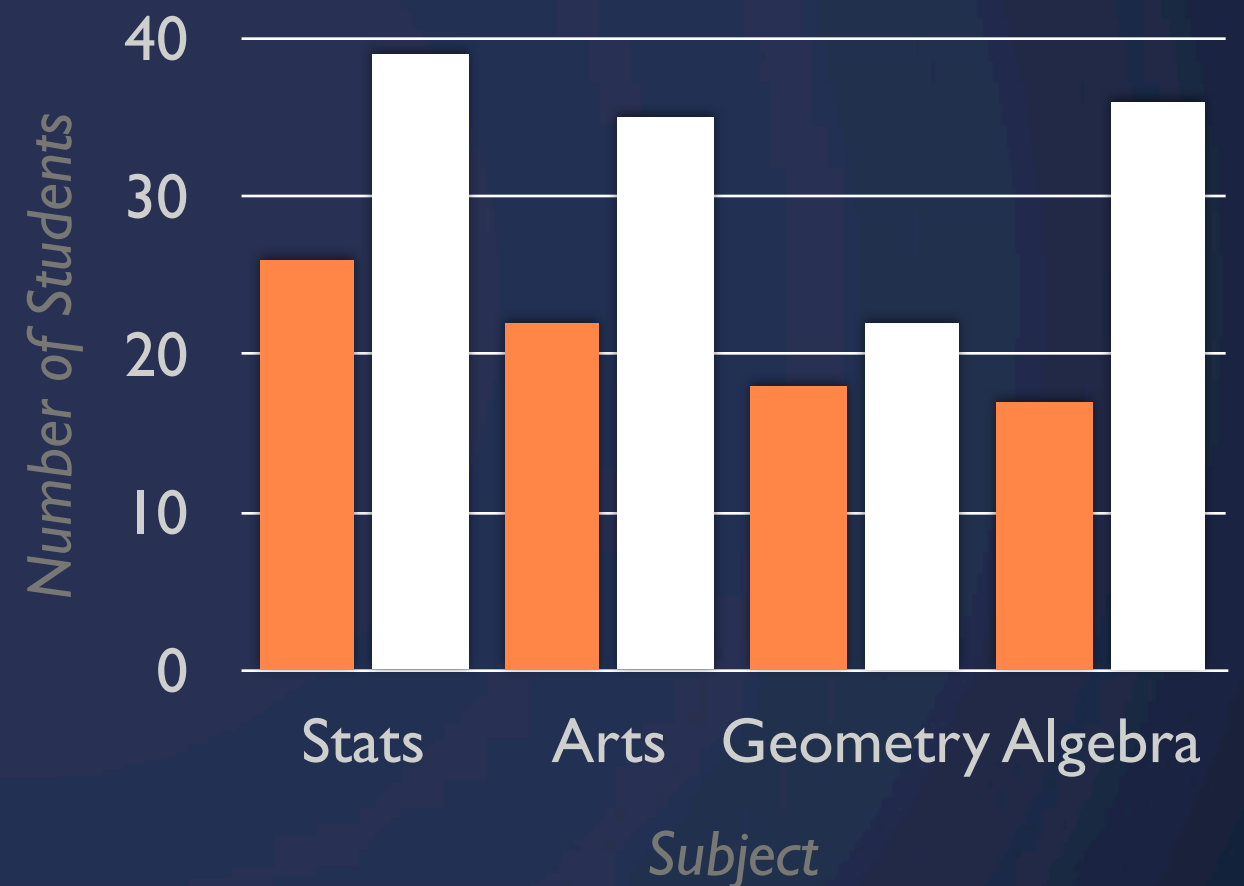


Feedback Assignment 2

Improvements

- Filter Data
- Arrange / Sort By Data
- Create new groupings (decade, continent)
- Ask For Feedback

Student Breakdown by Subject



Lab Thursday

Raphaël.js

Next Lecture

Color