

# Visual Analytics— Mental Models and Visual Perception

Dr. Ab Mosca (they/them)

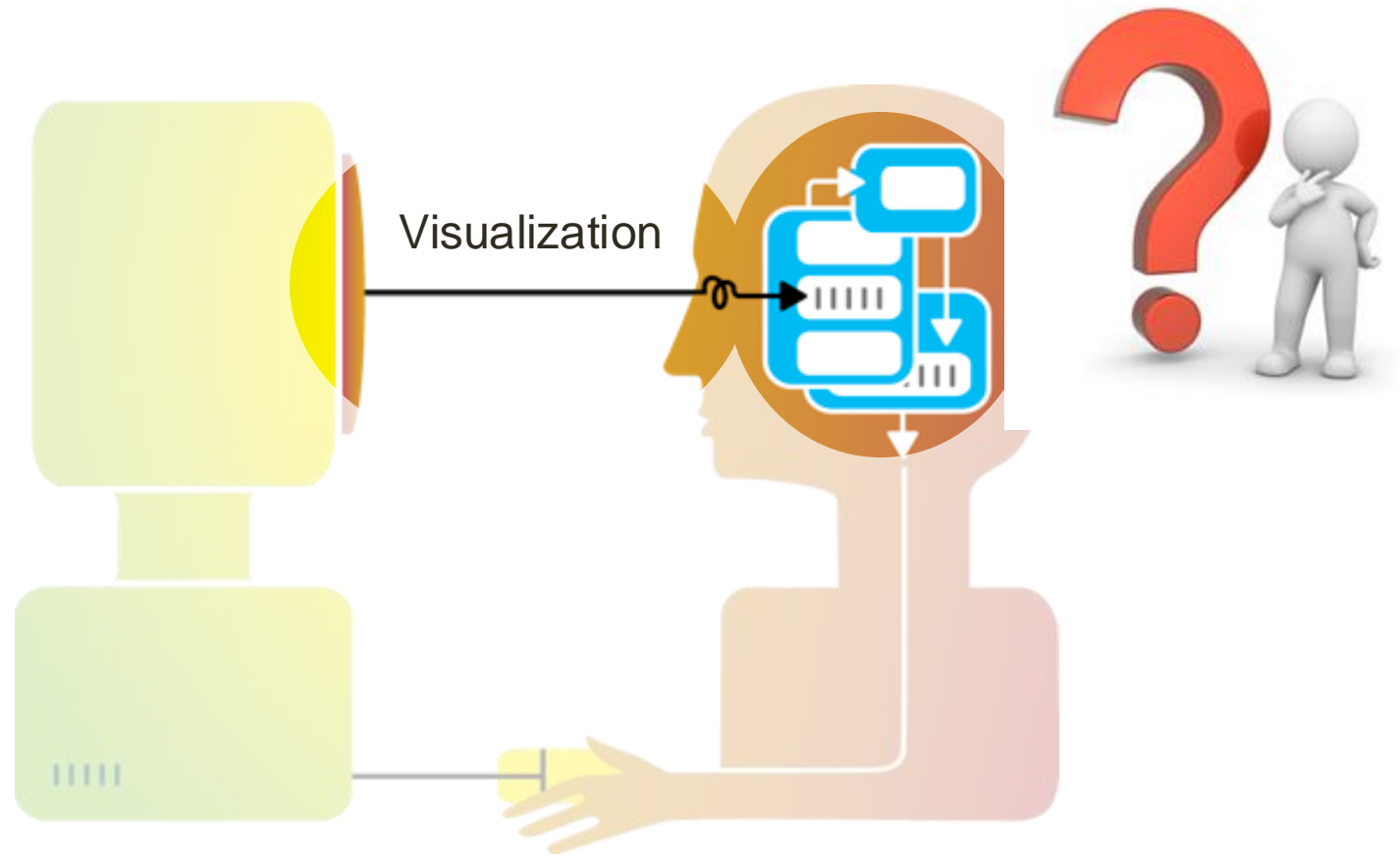
Slides based off slides courtesy of Jordan Crouser (<https://jcrouser.github.io/>)

# Plan for Today

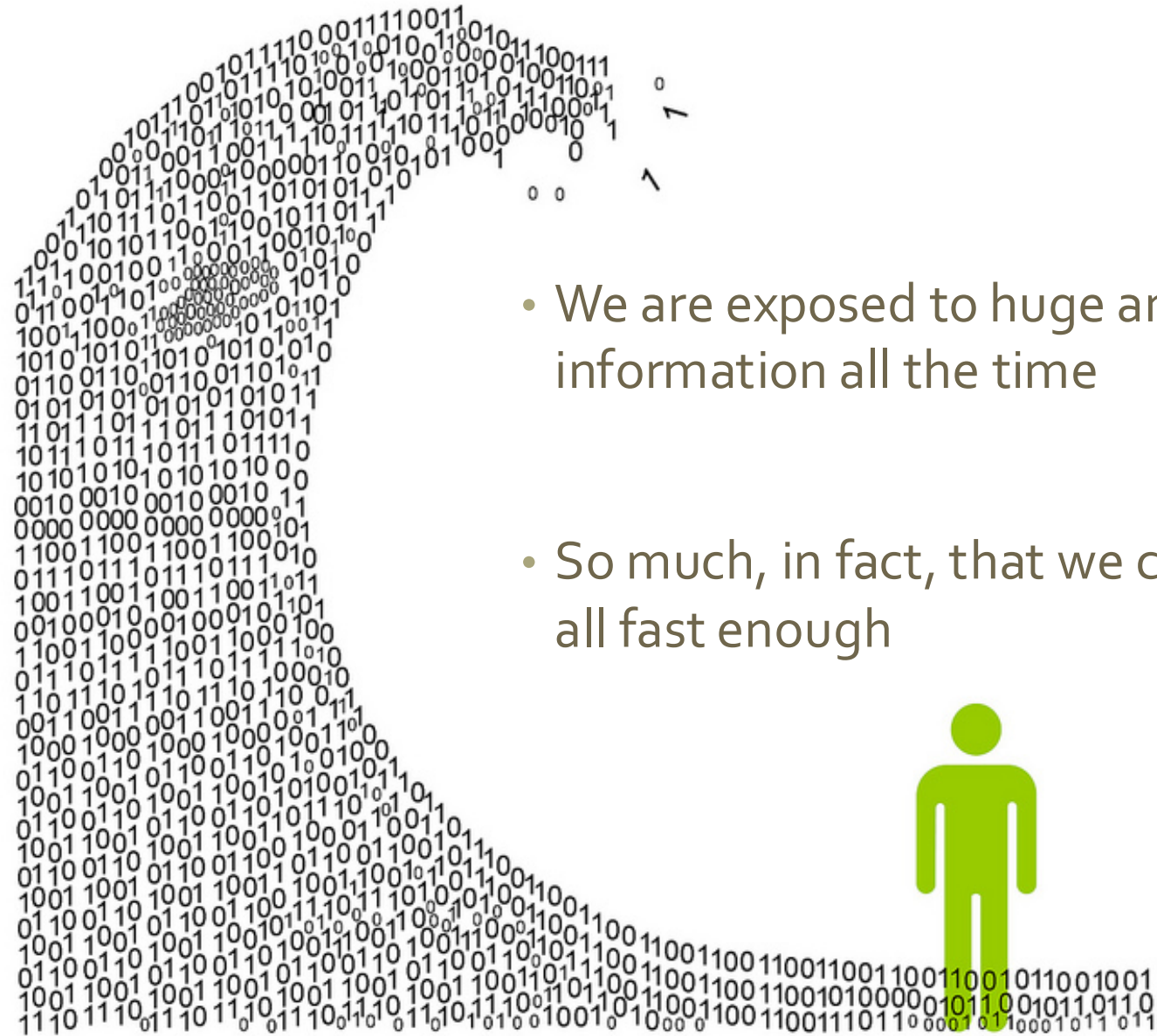
- Mental Models
- What is perception?
  - How does it work?
  - Pre-attentive processing
  - Perceptual problems
  - Estimating magnitude

Note: I'm going to flash a bunch of slides quickly today. If that doesn't work for you, you are welcome to step out, close your eyes, etc..  
(none of us will be offended and I will fill you in on anything crucial you missed!)

Visualization  
helps shape  
*mental models*



# Information overload



- We are exposed to huge amounts of information all the time
- So much, in fact, that we can't process it all fast enough

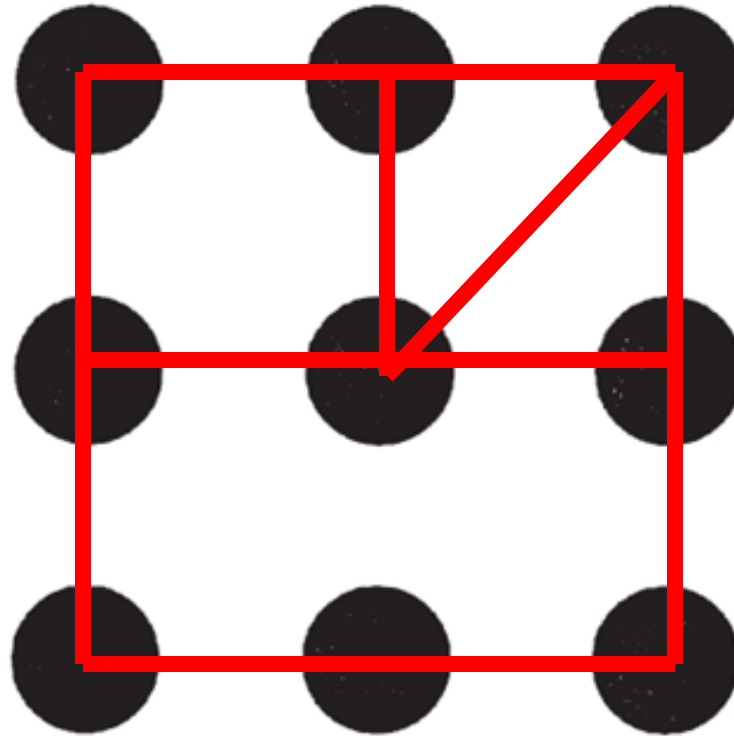
# Mental models



To cope, we construct **mental models**:  
abstracted, simplified versions of the world  
that are more manageable

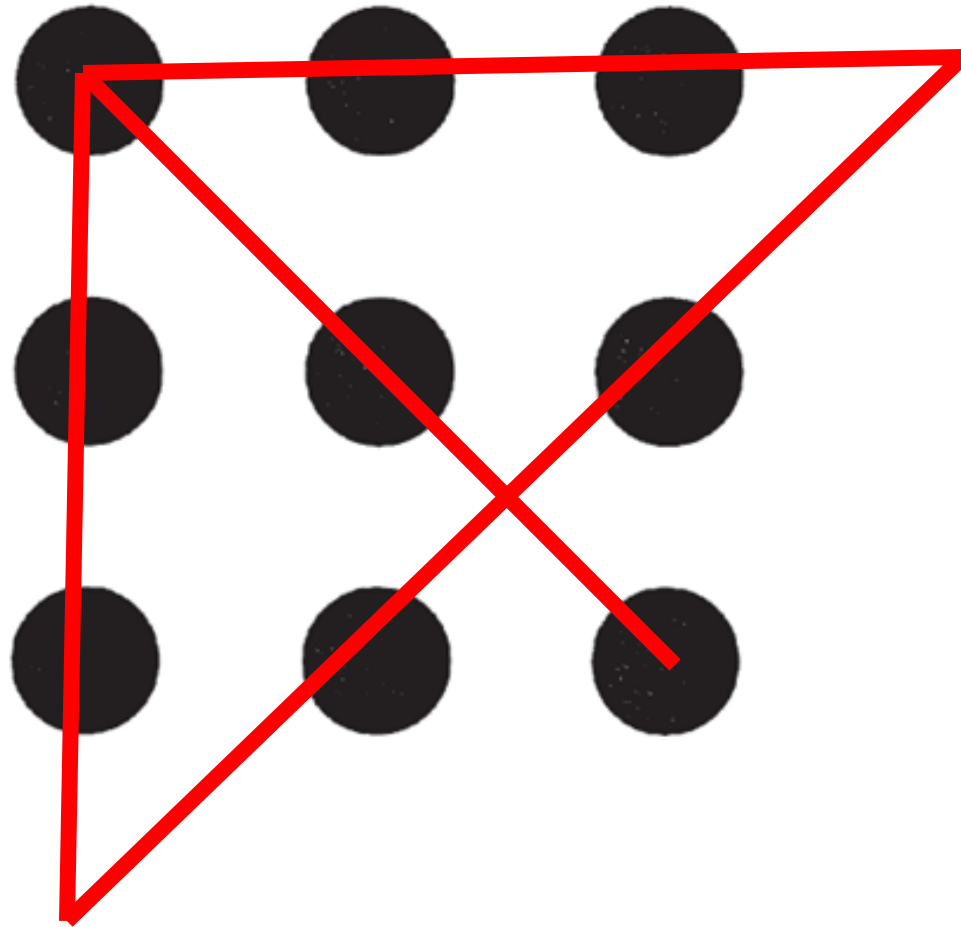
# The 9-dot problem

Task 1: Connect all 9 dots using only straight lines



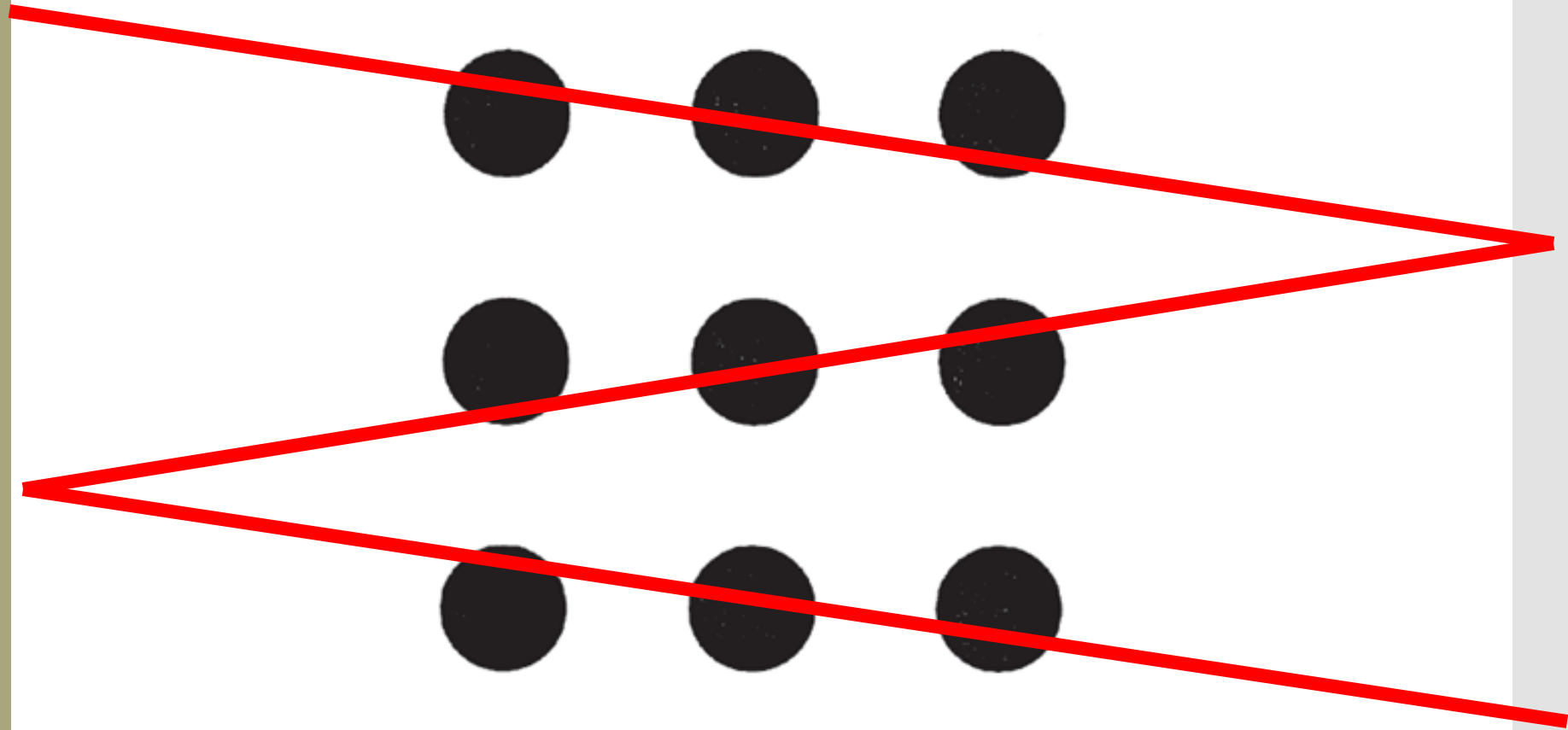
# The 9-dot problem

Task 2: Connect all 9 dots using 4 straight lines



# The 9-dot problem

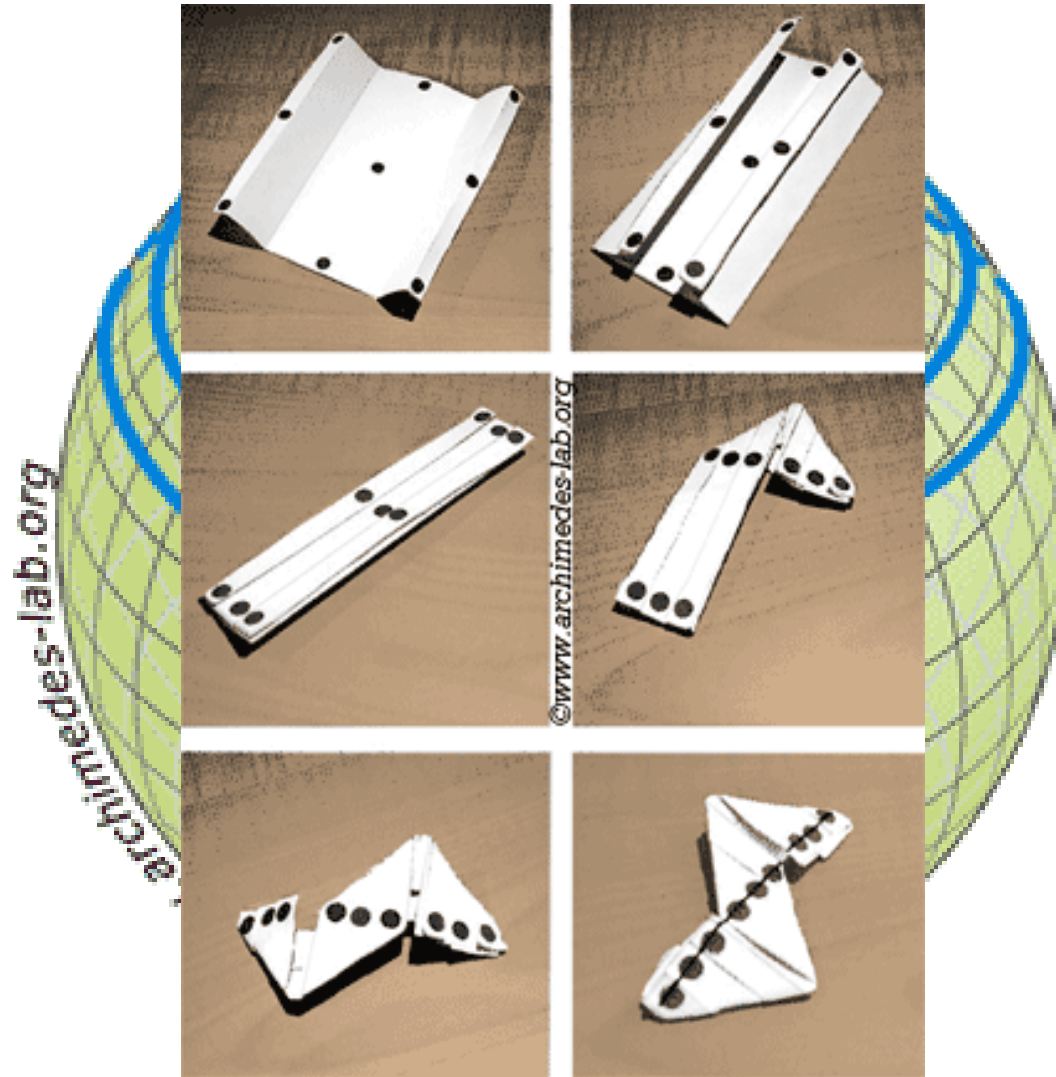
Task 3: Connect all 9 dots using 3 straight lines





# The 9-dot problem

Task 4: Connect all 9 dots using 1 straight line



# Mental Models: a Sketch



# Mental Models

## 1. We tend to see what we expect to see

- Mental models are built from prior experience
- We expect new input to “fit” the existing model
- Updates are **expensive**: given input that almost fits, we’ll distort information to avoid re-fitting the model
- **Expectation** is at least as strong as perception



# Mental Models

## 2. Mental models form quickly, & update slowly

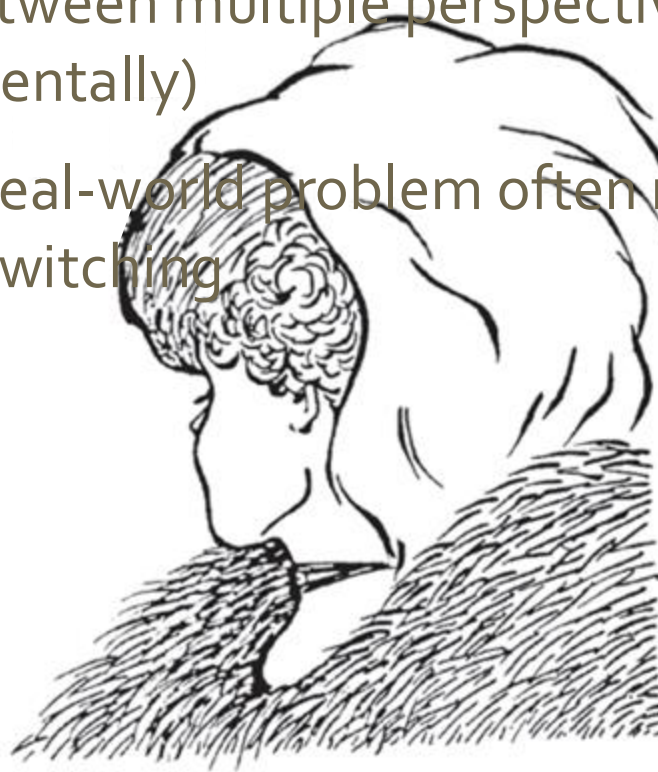
- “First impressions matter”
- Early information can have the highest impact
- The order in which we present pieces of information can shape how a person understands the whole
- Once a mental model is formed, it takes effort to alter it



# Mental Models

## 3. New information gets incorporated into the existing model

- Integrating competing perspectives is challenging
- Switching between multiple perspectives is also difficult (visually or mentally)
- **Tricky part:** real-world problem often require such perspective switching





# Mental Models

## 4. Initial exposure interferes with accurate perception



**Blur size**

128px  
64px  
32px  
16px  
8px  
None

# Mental Models

## 4. Initial exposure interferes with accurate perception

- Longer exposure to ambiguous data makes people **more confident** in their initial model
- This is true even if new data presents strong evidence that their model is **wrong**!
- Important: need to be intentional when we design, because incremental information can be **misleading**

Anyone remember what we talked about last time that related to exactly this?

# Mental Models

## The good:

- Well-tuned mental models let us process information quickly
- Frees up more processing power to synthesize information

## The bad:

- People (esp. experts) tend not to notice information that contradicts their mental model
- A “fresh pair of eyes” can be beneficial

## The ugly:

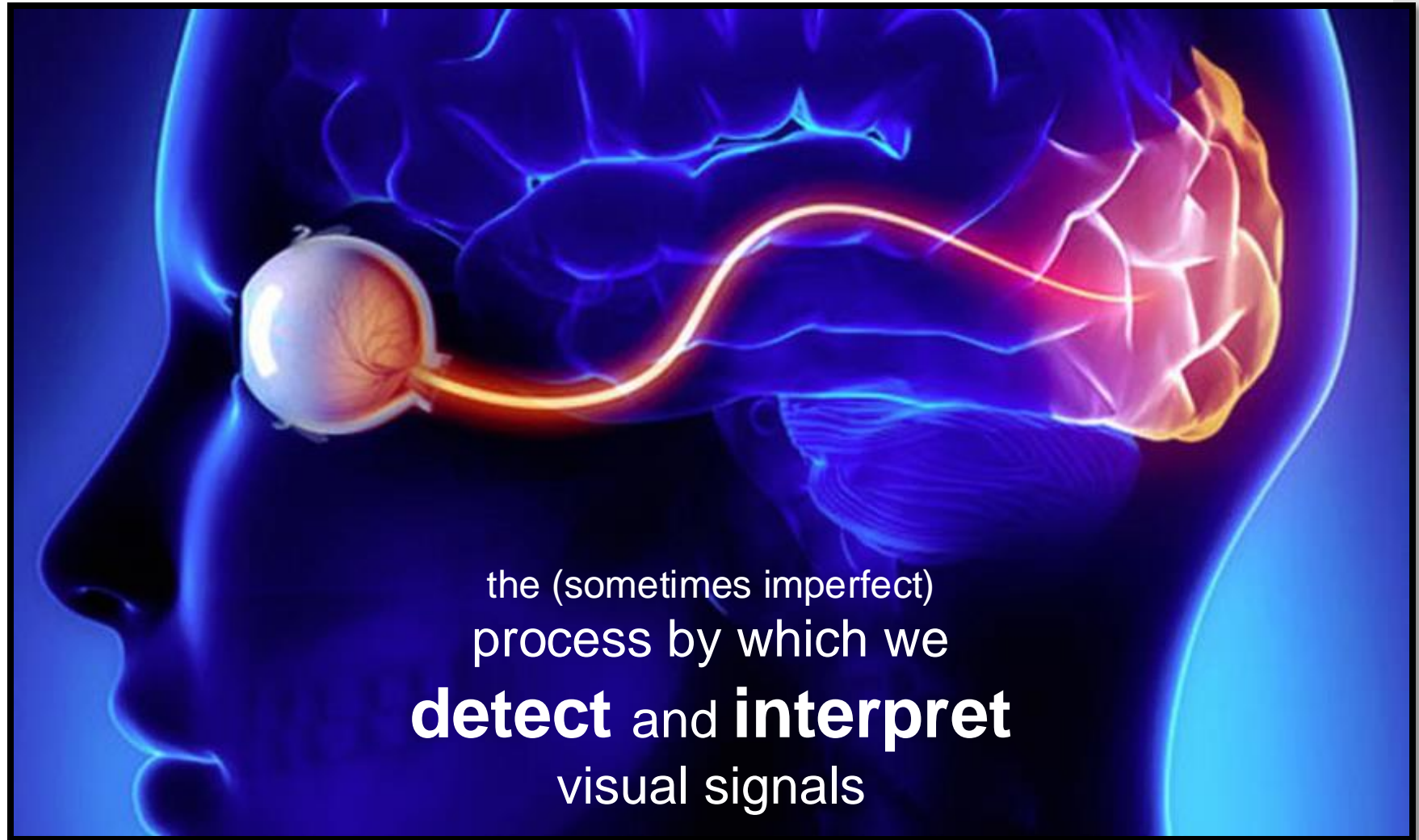
- Mental models are unavoidable: everyone has them, and they're all different
- **Key:** be aware of how mental models form, how they shape perception, and how to support (or challenge) them



What is  
perception?



# Visual perception (def.)



the (sometimes imperfect)  
process by which we  
**detect** and **interpret**  
visual signals

# The “gestalt effect”

**ge·stalt**

/gə 'SHtält,- 'SHtôlt/

*noun* PSYCHOLOGY

an organized whole that is perceived as more than the sum of its parts.

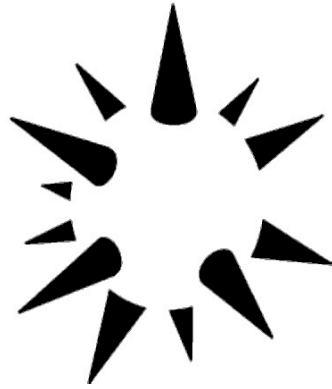


Translations, word origin, and more definitions

Our brain's ability to generate whole forms, instead of just collections of unrelated elements

# Gestalt effects

## Reification



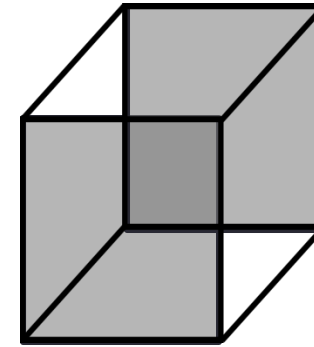
Demonstration of reification in perception from Lehar S. (2003) *The World In Your Head*, Lawrence Erlbaum, Mahwah, NJ. p. 52, Fig. 3.3

## Emergence

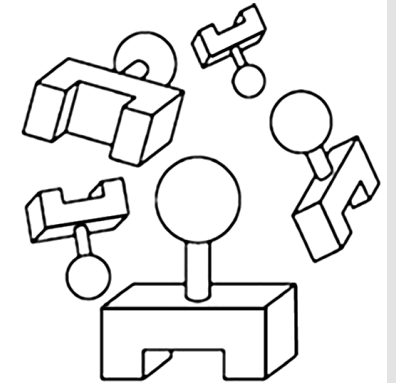


Life Magazine: 58;7 1965-02-19, p 120.  
Photographer: Ronald C James

## Multistability



## Invariance



Demonstration of invariance in perception from Lehar S. (2003) *The World In Your Head*, Lawrence Erlbaum, Mahwah, NJ. p. 53, Fig. 3.5

What does this  
mean for  
visualization?

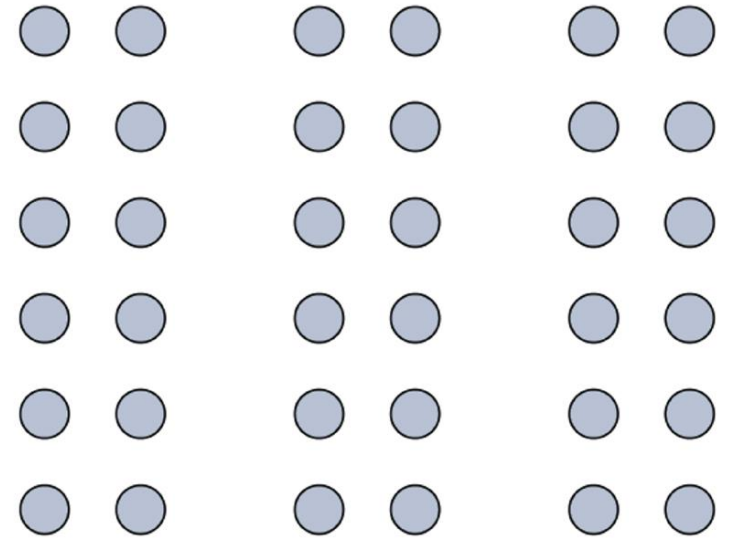
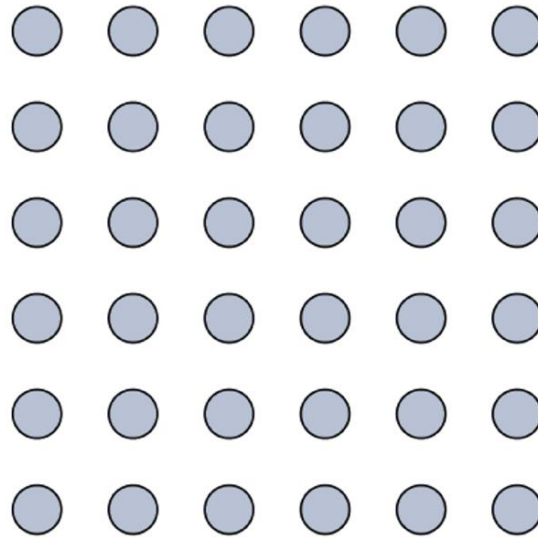
**Question:** what makes all this mental model stuff useful to us (designers and readers of data)?

**Answer:** in order to understand how people interpret and make sense of data, we need to know what **cues** they're picking up on – and how to situate those cues within a larger framework

→ 6 “Laws of Grouping”

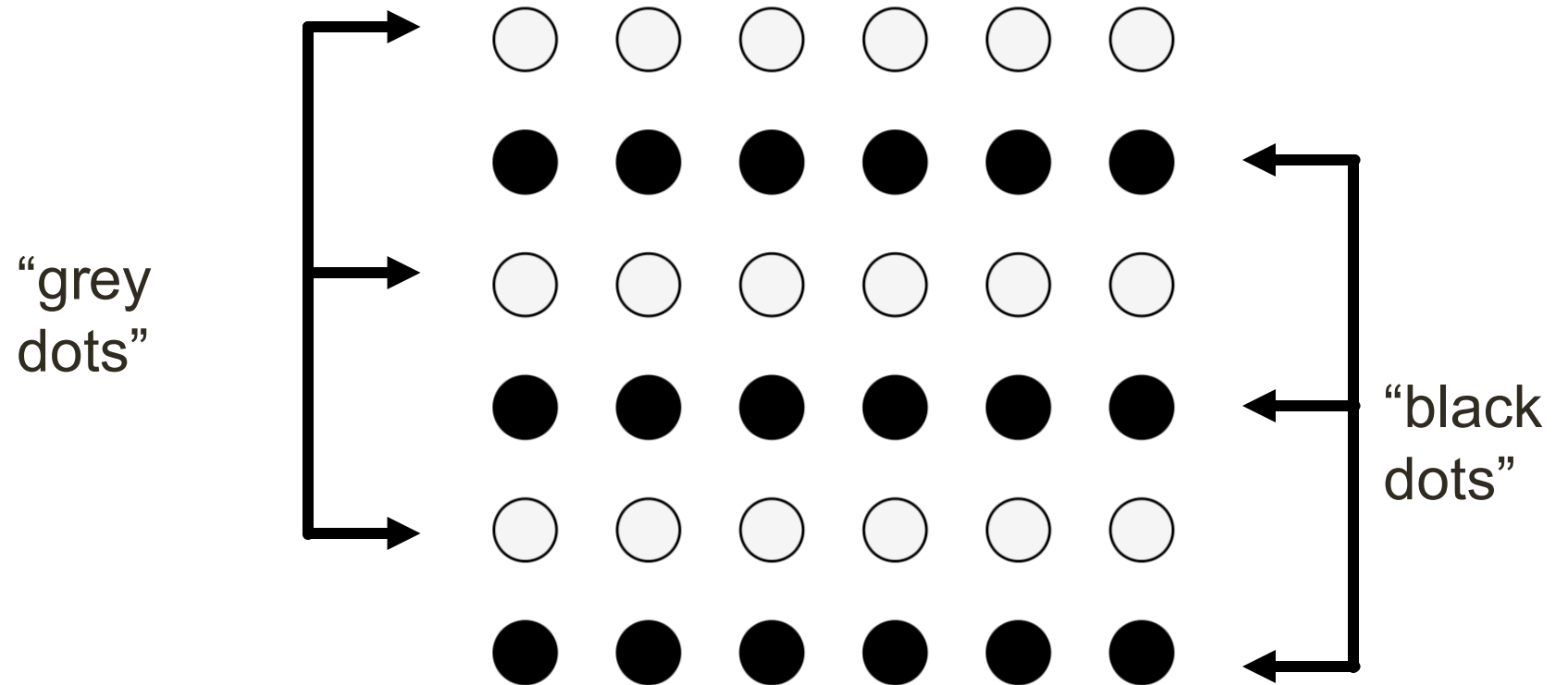
# Law of Proximity

We interpret objects that are **close** to each other as a group



# Law of Similarity

We interpret objects that are **visually similar** to each other as a group



## Law of Closure

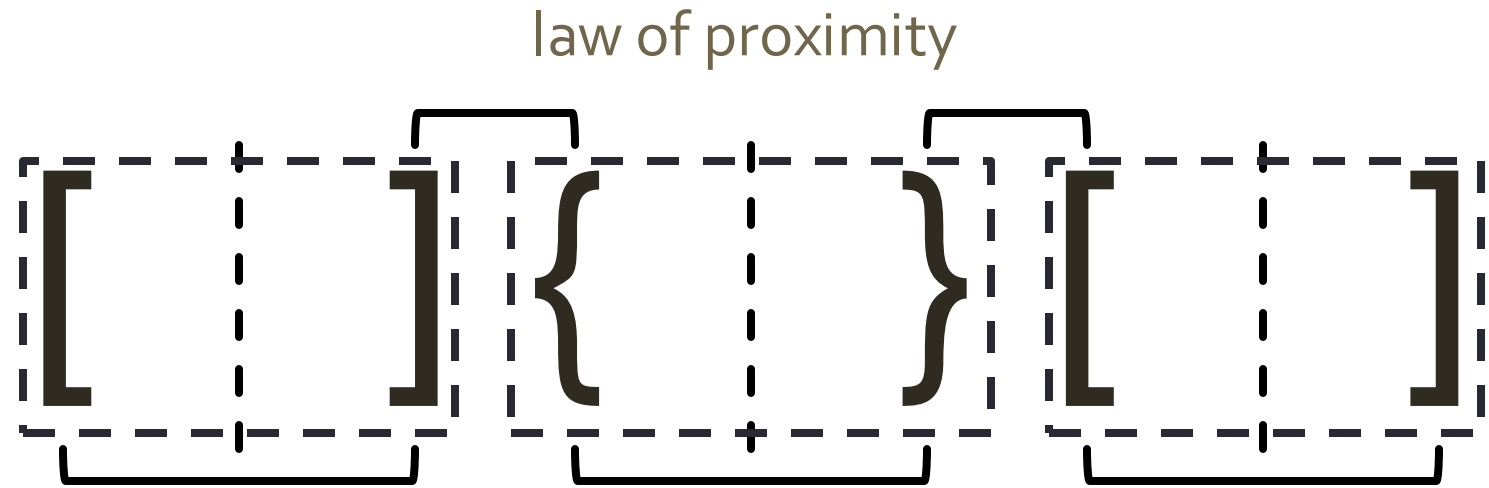
When parts of a picture are missing, we fill in the visual gap





We perceive objects as being symmetrical, arranged around a center point

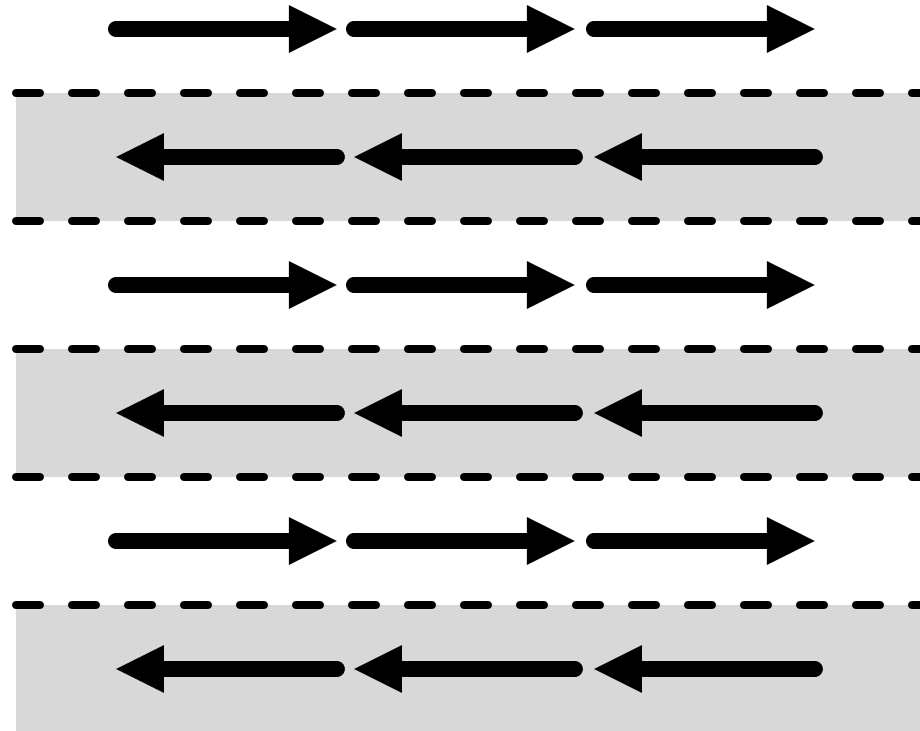
## Law of Symmetry



law of symmetry + law of similarity

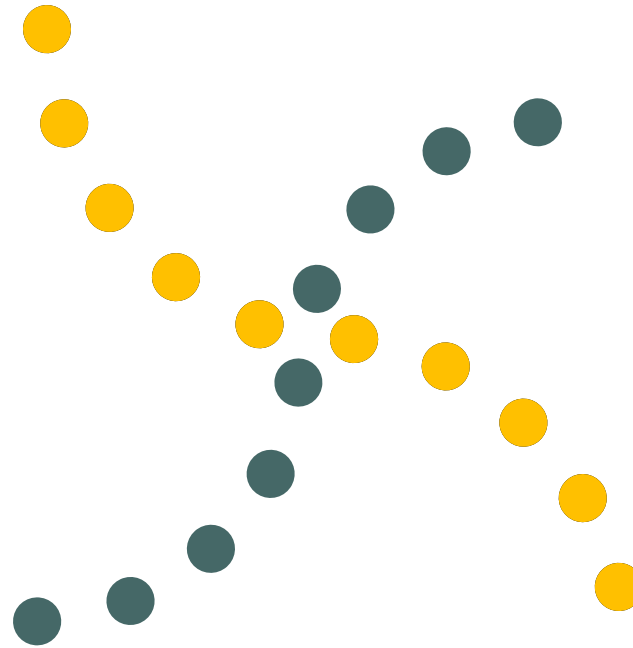
# Law of Common Fate

We group objects that we perceive to be moving along the same path



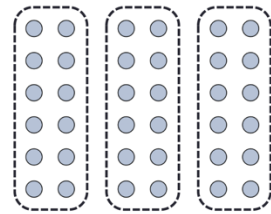
# Law of Continuity

We tend to group objects along the **smoothest path**

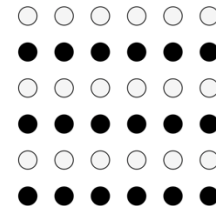


## Let's Practice

- Break into teams of 3
- Choose a visualization from the Tableau Vis of the Day collection: <https://public.tableau.com/app/discover/viz-of-the-day>
- **Goal:** identify as many examples of the Laws of Grouping (Gestalt Principles) in action in your sample visualization as you can



proximity



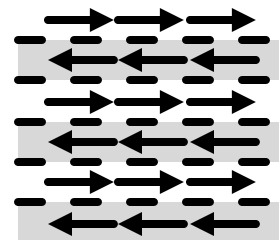
similarity



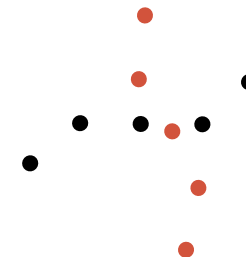
closure



symmetry



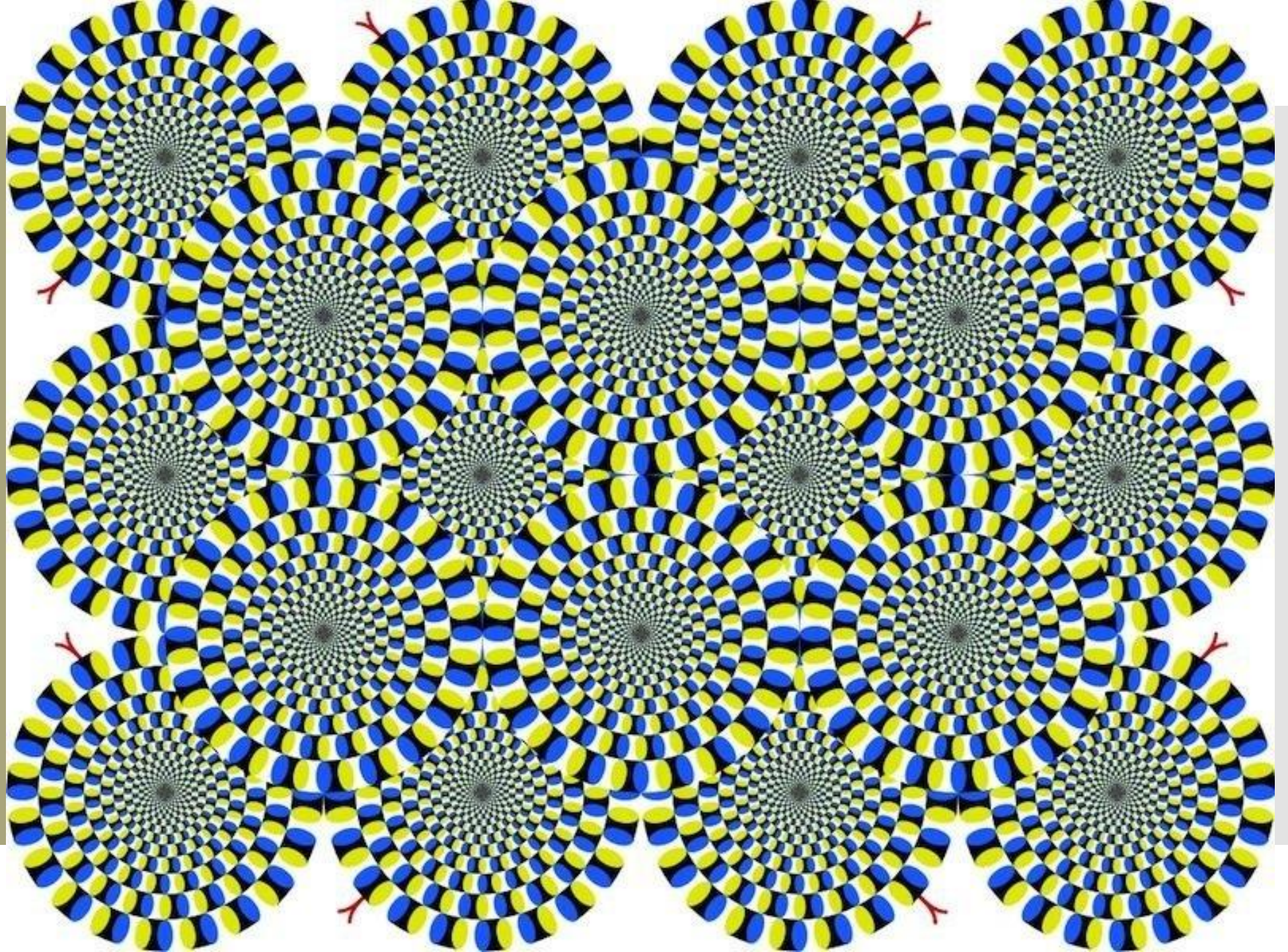
common fate



continuity

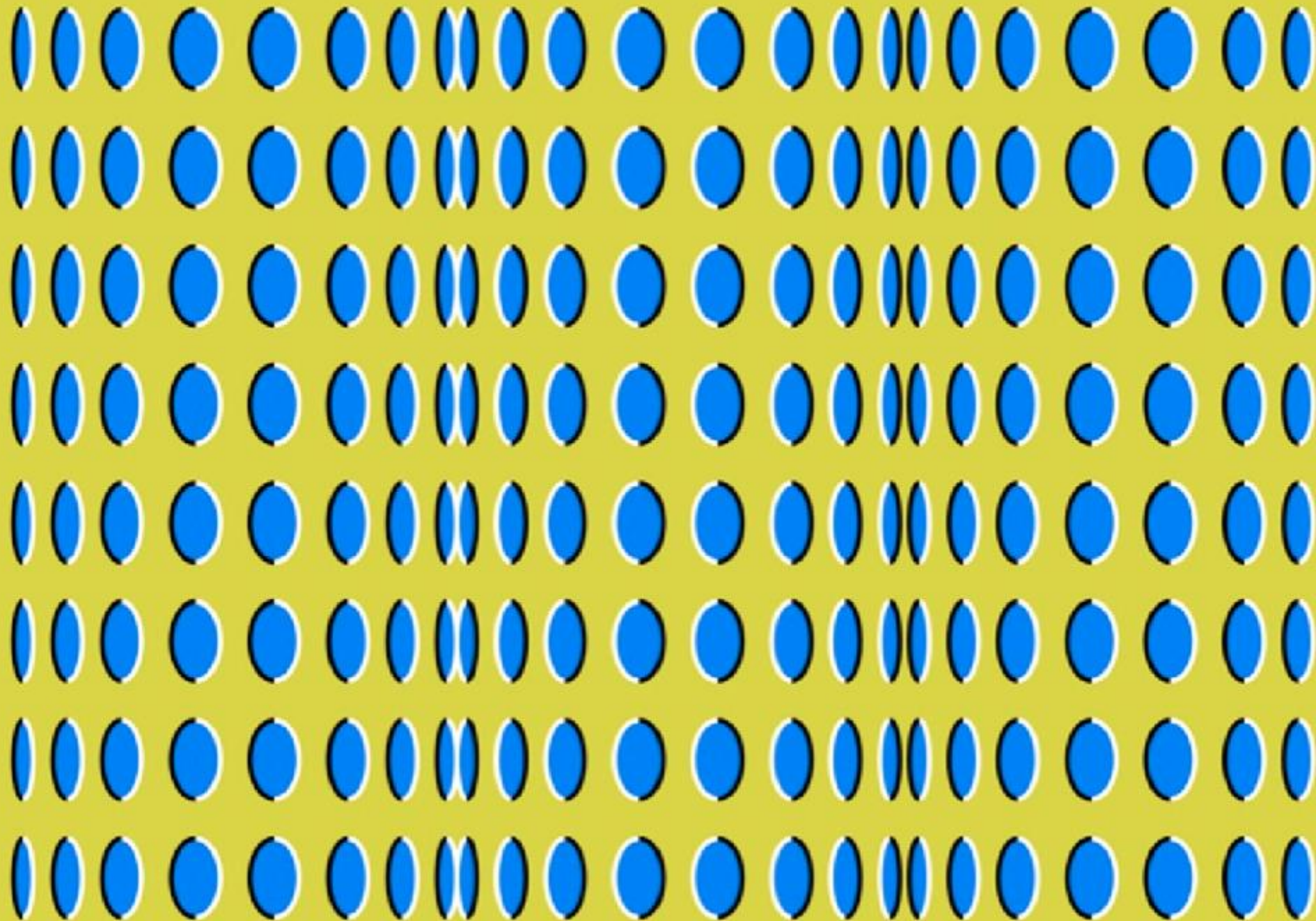


Do you see  
movement?





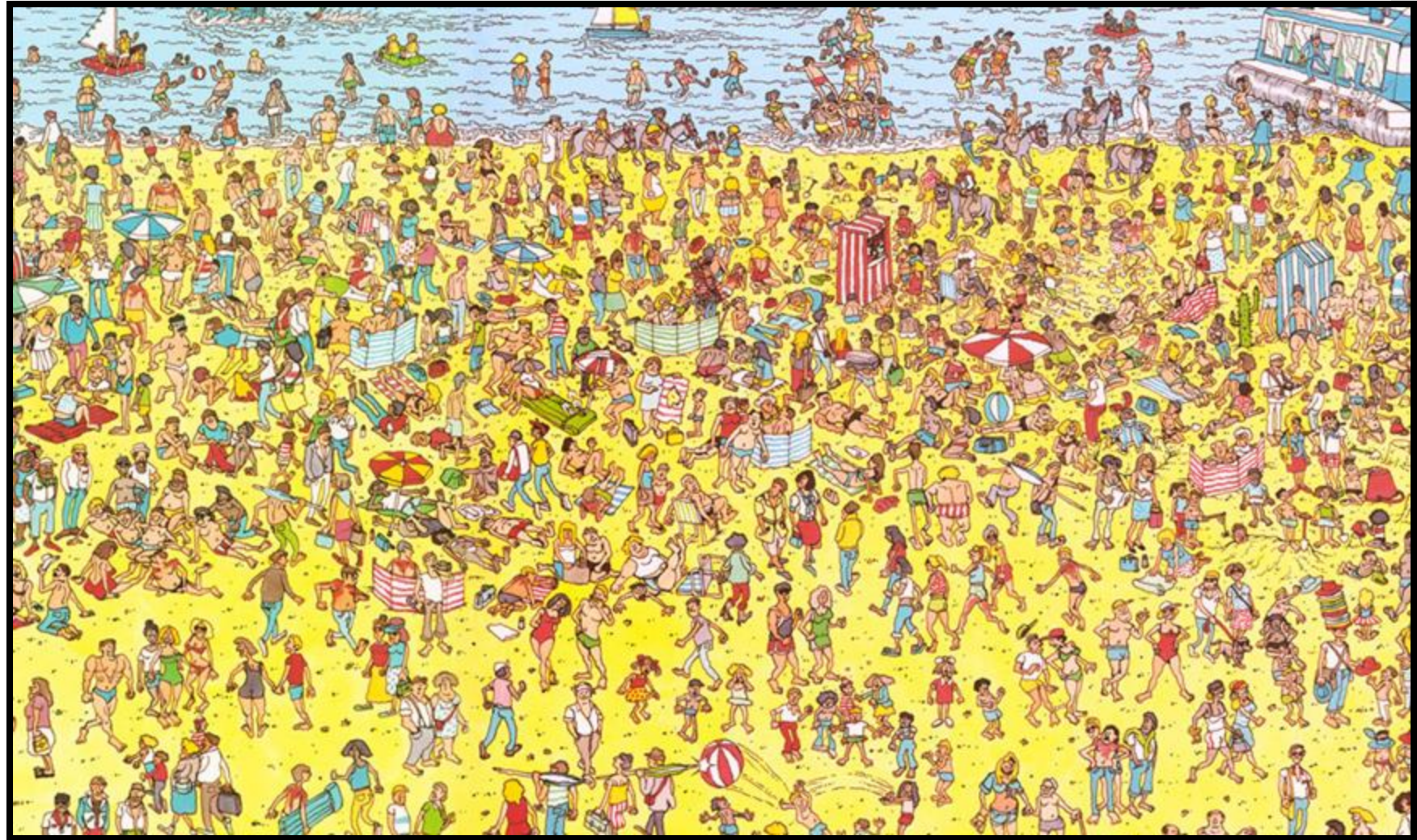
Do you see  
movement?





# Visual perception

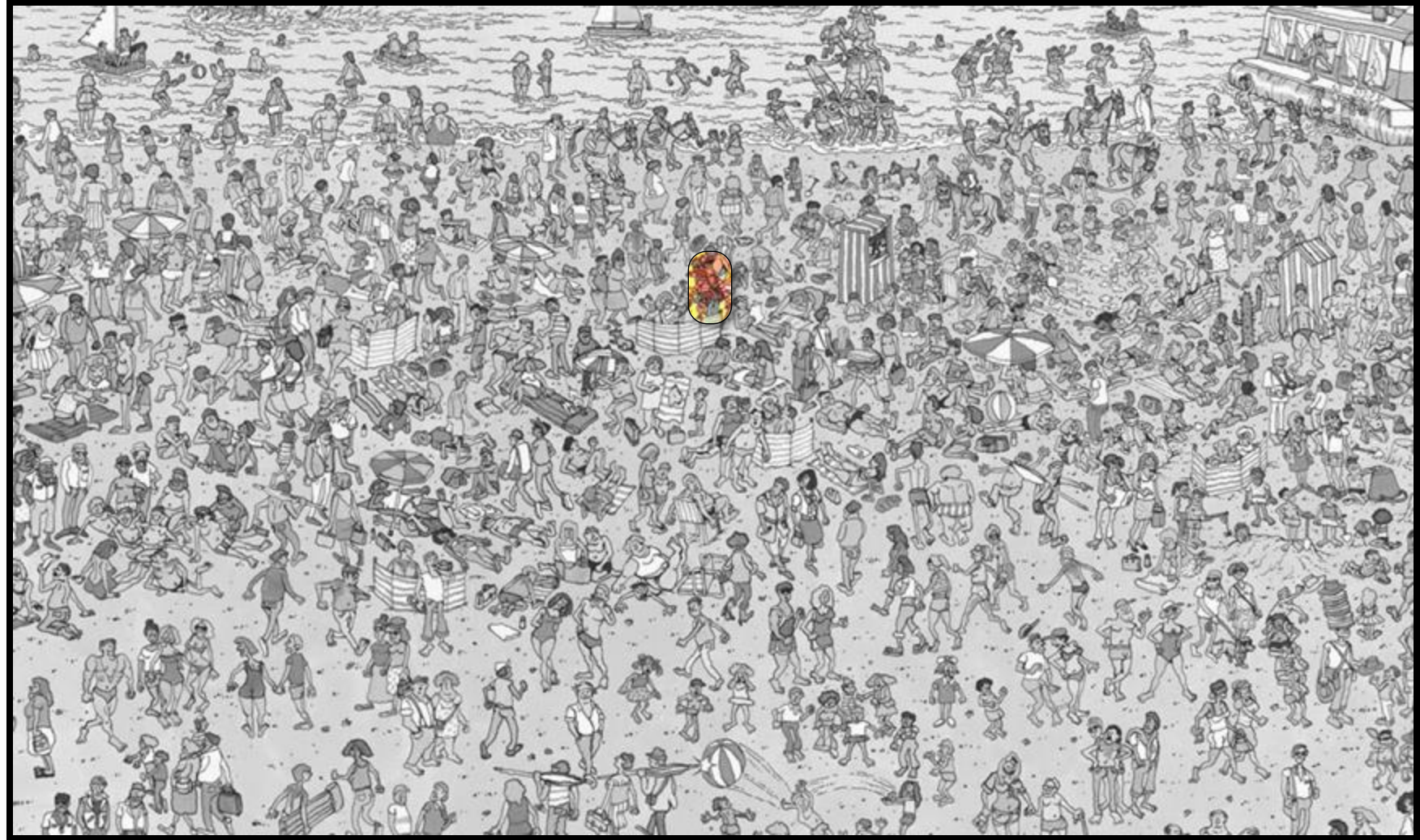
Some things are processed slowly





Others are incredibly fast

Visual  
perception



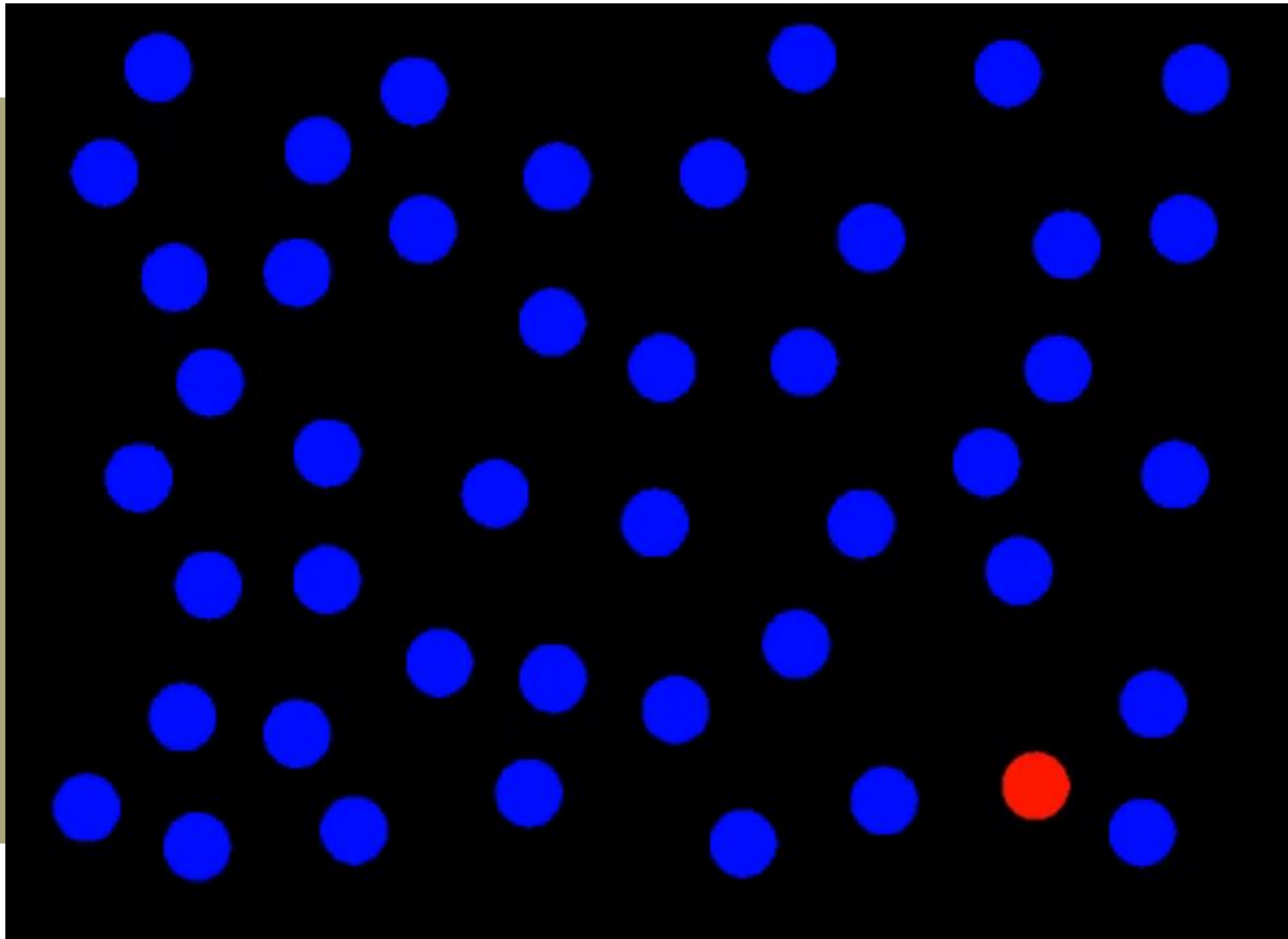


# Visual perception

Fast = “pre-attentive processing”

- Things that happen in <200ms of visual stimulation
- Performed in parallel across the entire visual field
- Example...

Perception:  
Pre-attentive  
Processing



What did you see?

Perception:  
Pre-attentive  
Processing



## Pre-attentive processing

“An understanding of what is processed pre-attentively is probably the **most important** contribution that visual science can make to data visualization” (Ware, 2004, p. 19)

## Pre-attentive processing facilitates:

- Target detection (presence or absence)
- Boundary detection / grouping
- Region tracking
- Counting and estimation

## Pre-attentive processing facilitates:

- Target detection (presence or absence)
  - Boundary detection / grouping
  - Region tracking
  - Counting and estimation
- 
- On the next slide I want you to count how many zeros you see as fast as you can. Raise your hand (do not shout the number) when you have the answer.

## Attentive counting

1281768756138976546984506985624982826762  
9809858458224519856458945098459985943585  
9891330249945959595772564675750678974567  
8845789819821677654876364968560912949686

**How many zeros are there?**

Attentive  
counting

**We'll do the same on the next slide for threes.**



## Pre-attentive counting

12817687561**3**8976546984506985604982826762  
980985845822450985645894509845098094**3**585  
90910**3**0209905959595772564675050678904567  
8845789809821677654876**3**64908560912949686

**How many threes are there?**

# Pre-attentive processing for visualization

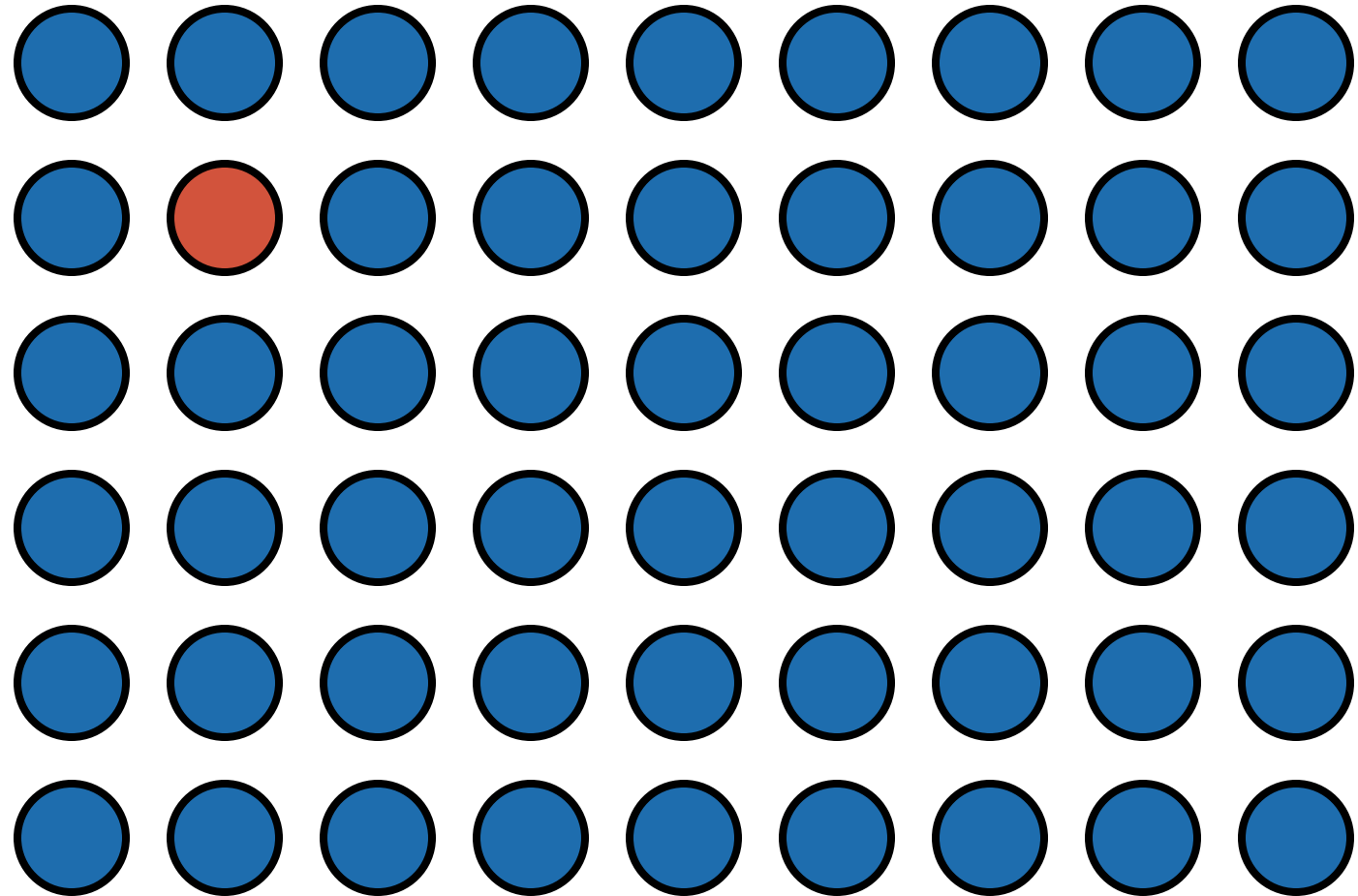
**Question 1:** how do we (vis designers) use pre-attentive processing to our advantage?

**Question 2:** what do we need to watch out for?

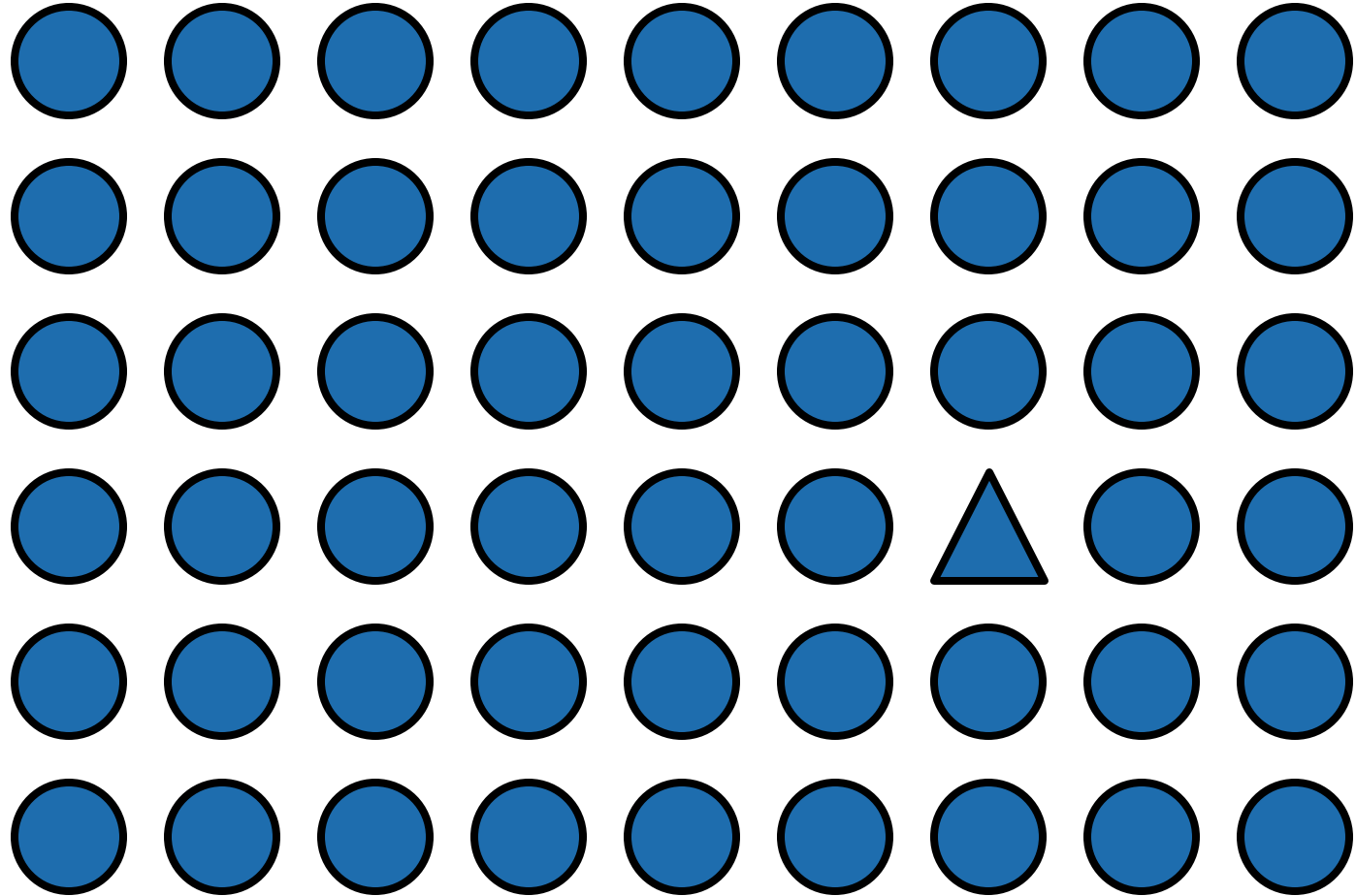
# Pre-attentive processing for visualization

There's only one instance of something on each of the next slides. What is it?

Pre-attentive  
processing:  
color (hue)

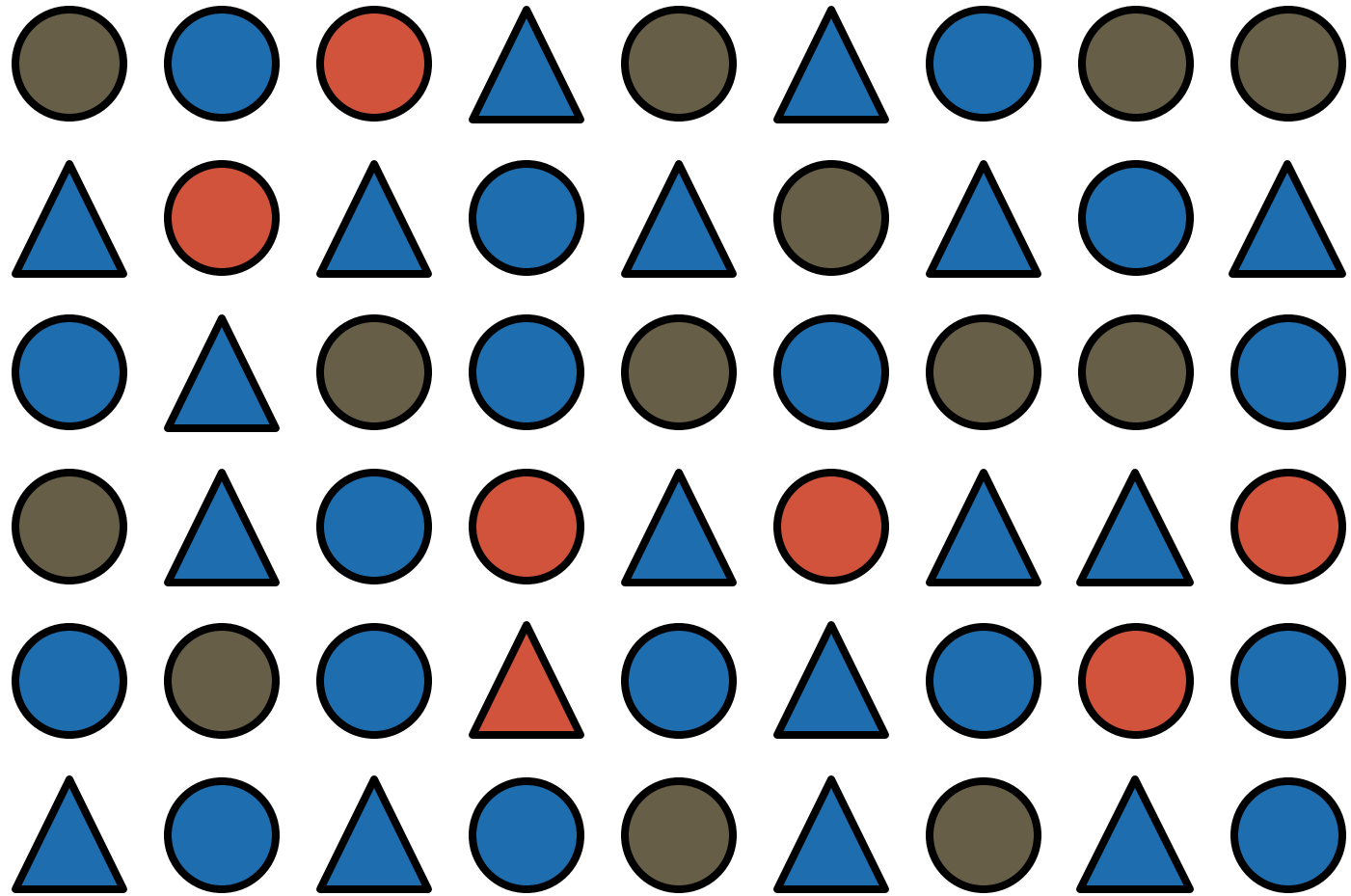


Pre-attentive  
processing:  
shape  
(curvature)





Pre-attentive  
processing:  
shape + color?



Discussion:  
what's going  
on here?

**Answer:** this is called “conjunction”

- If you search for **red** things, you get a bunch of **red** circles (as well as the **red triangle**).
- Similarly, if you search for **triangles**, you get a bunch of **blue triangles** (as well as the **red triangle**).
- Either way, you have to search through them all one by one!

## Pre-attentive processing for visualization

- Whatever draws our eyes draws our attention
- This can be useful
- It can also be problematic:

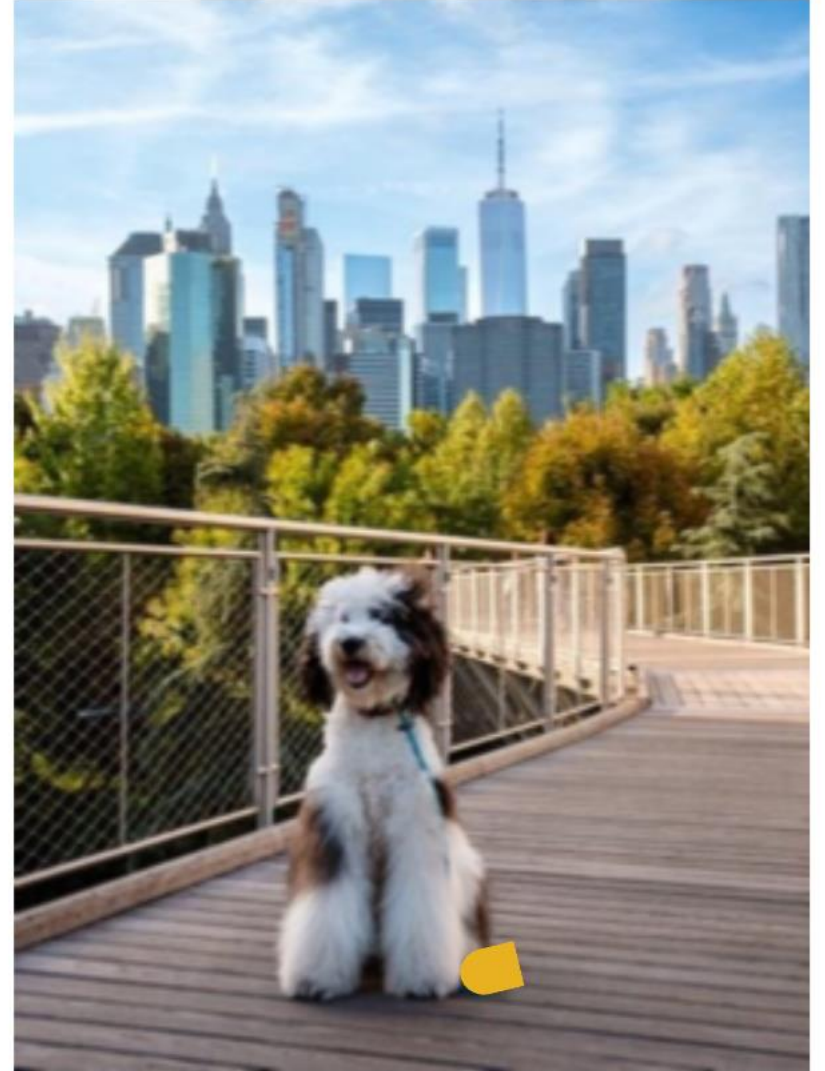
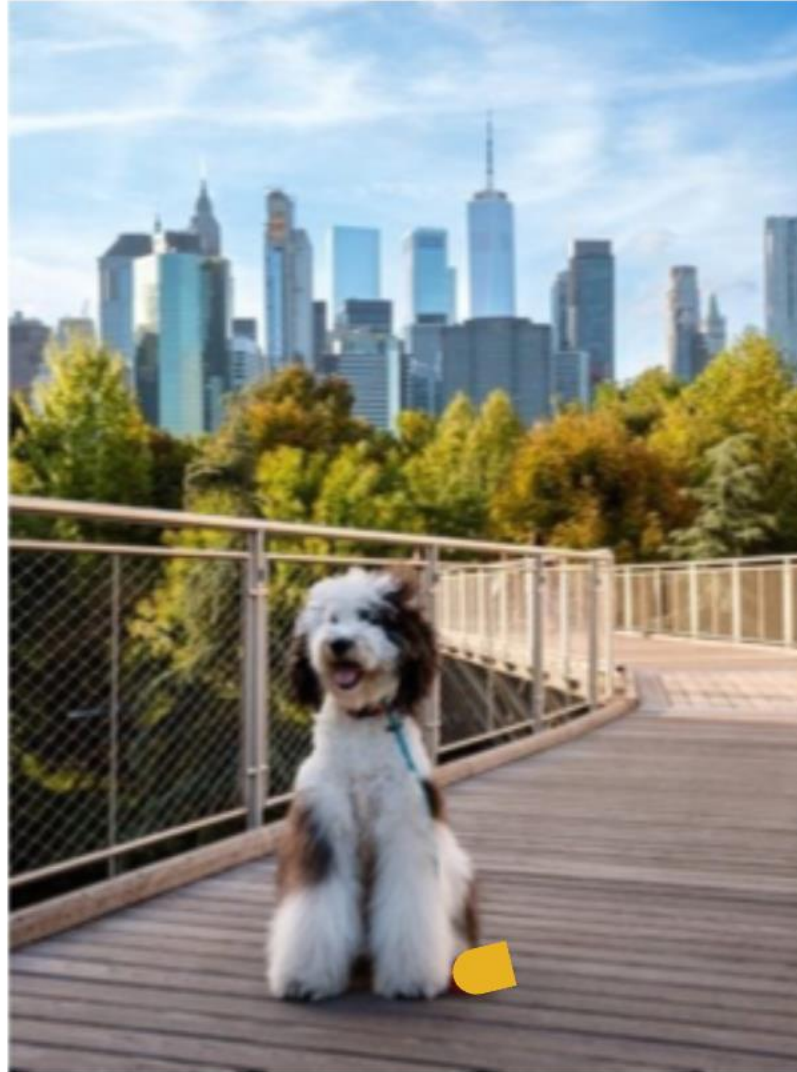
Pre-attentive  
processing for  
visualization:  
The downsides

Ex. flicker can cause change blindness



Can you see it now?

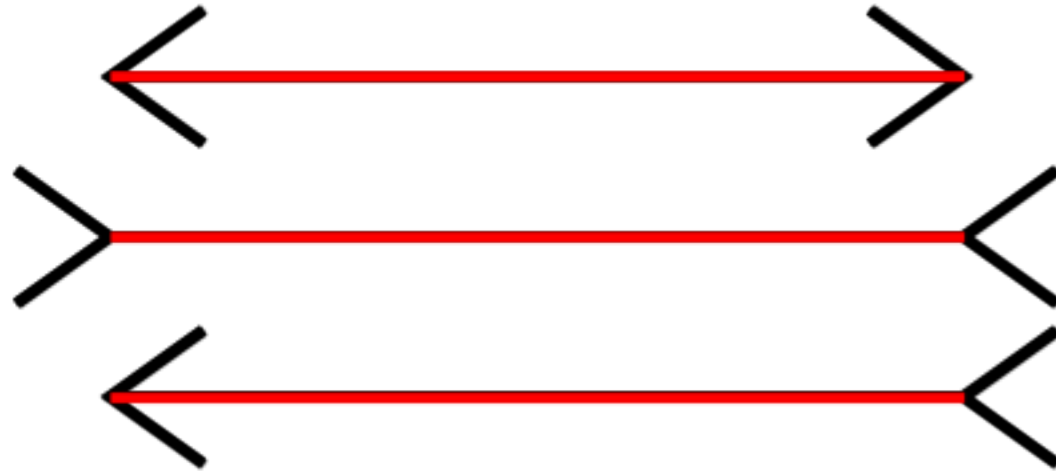
Pre-attentive  
processing for  
visualization:  
The downsides





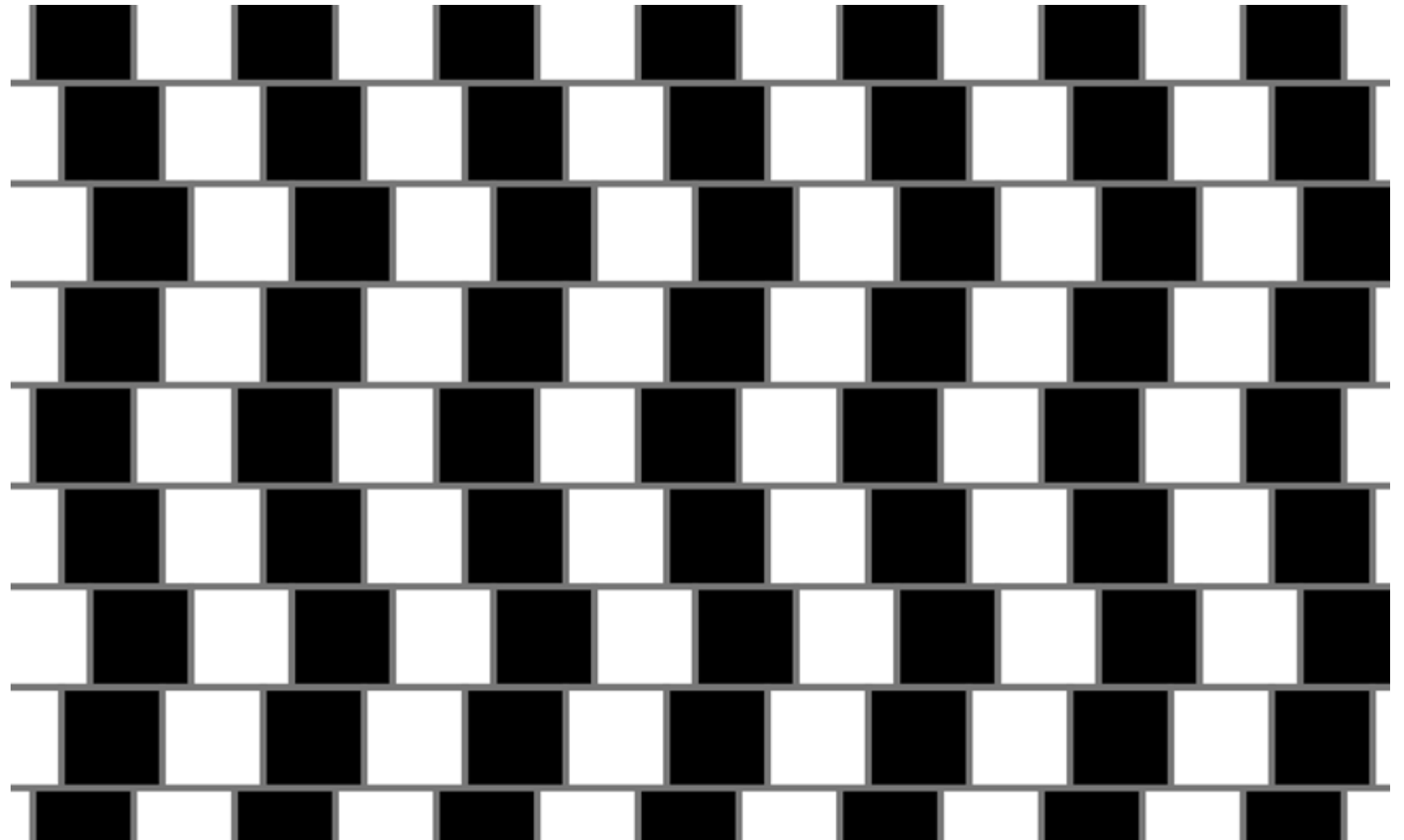
Pre-attentive  
processing for  
visualization:  
The downsides

Sometimes gestalt & pre-attention compete



Pre-attentive  
processing for  
visualization:  
The downsides

Sometimes gestalt & pre-attention compete



# Attentive processing

Okay, what about **attentive** processing?

## Magnitude estimation

**Question:** How much **bigger** is the lower bar?

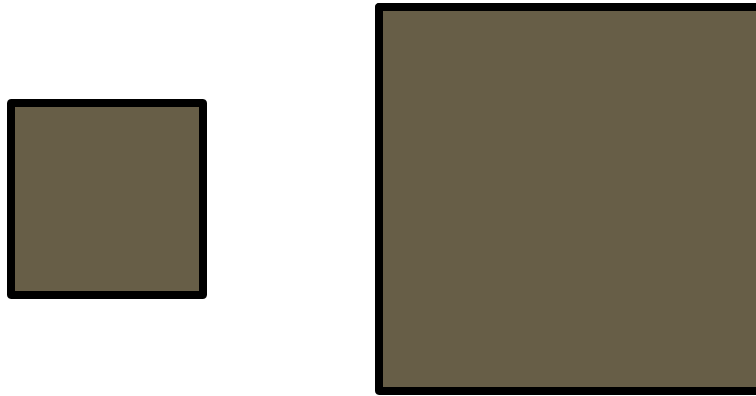
Attentive  
processing



**Answer:** 2x

## Magnitude estimation

**Question:** How much **bigger** is the right square?



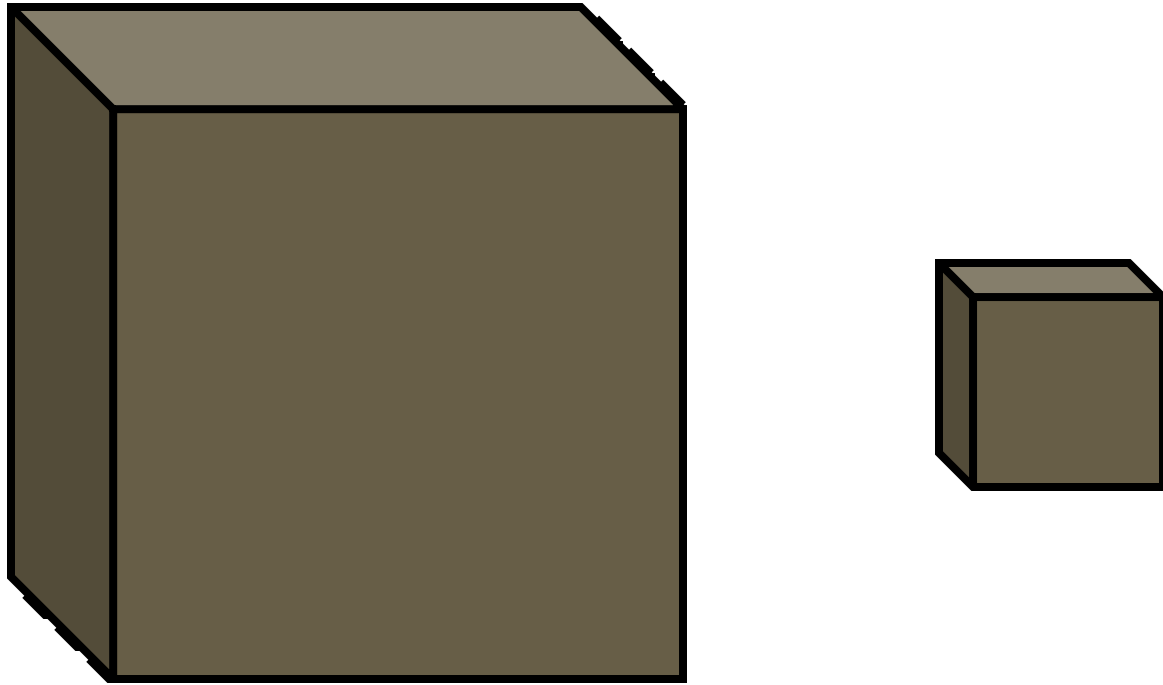
**Answer:** 4x

Attentive  
processing



## Magnitude estimation

**Question:** How much **bigger** is the left cube?



**Answer:** 27x

Attentive  
processing

# Attentive processing

## "Apparent" magnitude

