



# DSCI 554 LECTURE 10

**PATTERNS, MEMORY, VISUAL ENCODINGS, SEMIOLOGY AND GESTALT.**

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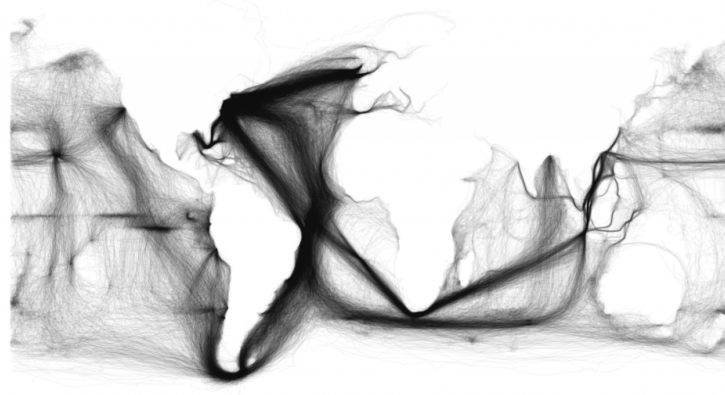
# OUTLINE

- Pattern recognition, memory
- Gestalt
- Marks and encodings

# PATTERN RECOGNITION

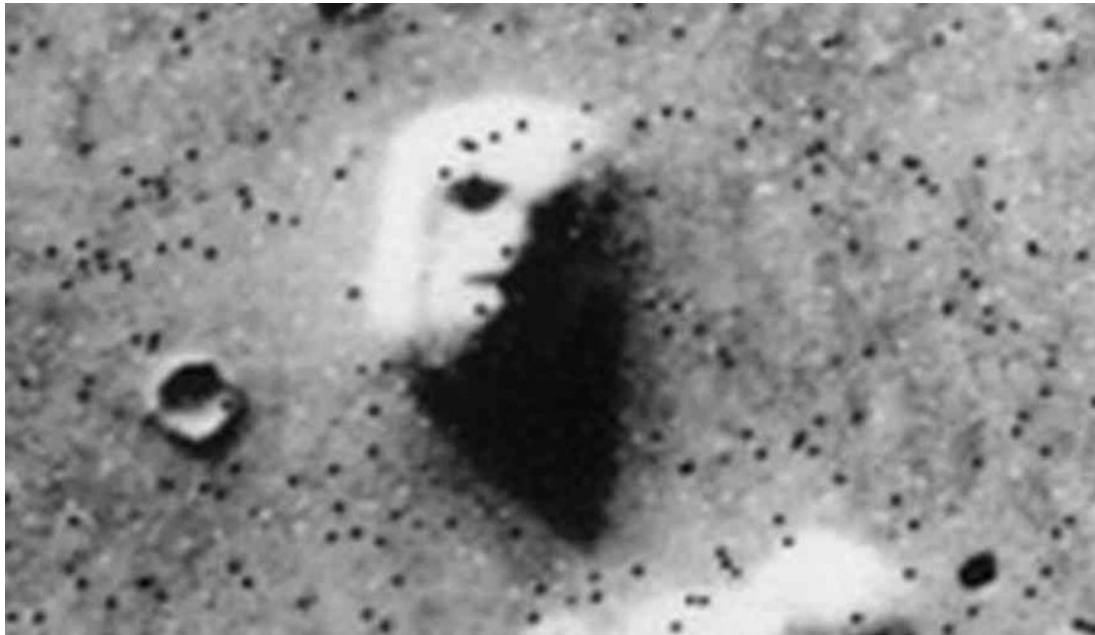
Information from a stimulus  $\Leftrightarrow$  information from memory

- Subconscious
- Involves the “*What*” visual pathway
- Top-down and bottom-up processing



# APOPHENIA

- Perception of images or sounds in random stimuli
- Priming increases likelihood of seeing the pattern
- Likely evolutionary process from Type I (false positive) and Type II (false negatives) errors



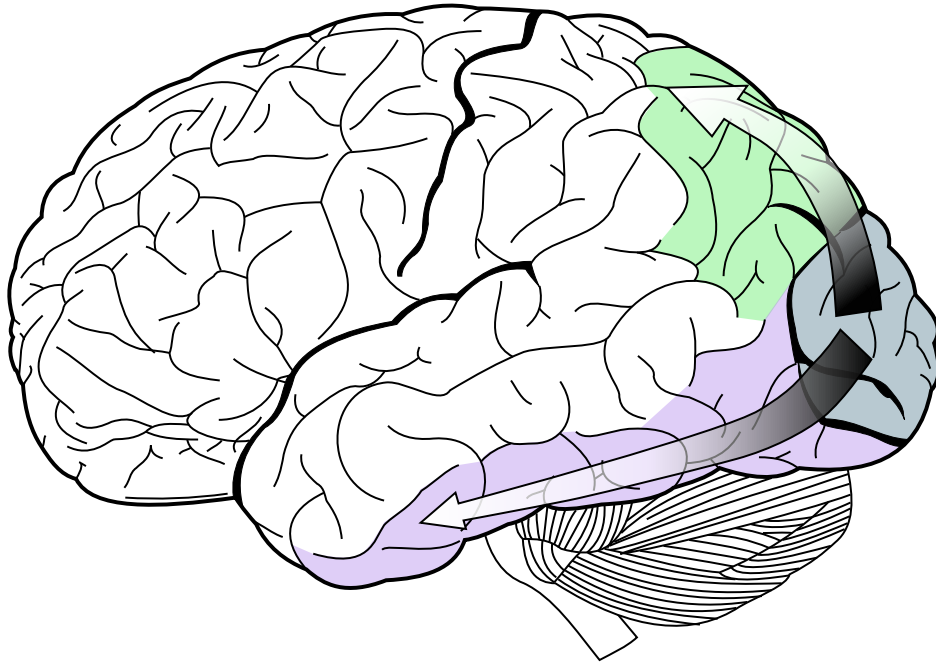
Part of the Cydonia (Mars) region, taken by the Viking 1 orbiter and released by NASA/JPL on July 25, 1976

# PRIMING

Effect in which exposure to one stimulus influences a response to a later stimulus. Works on VLTM.



# VISUAL PATHWAYS



**Where / Dorsal**  
relative object location  
for motor tasks

**What / Ventral**  
object identification  
and recognition

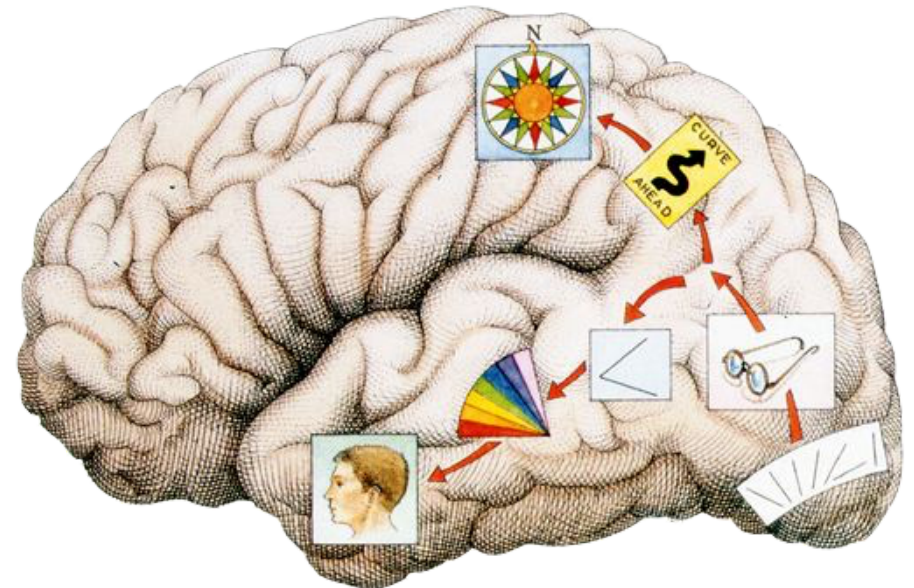
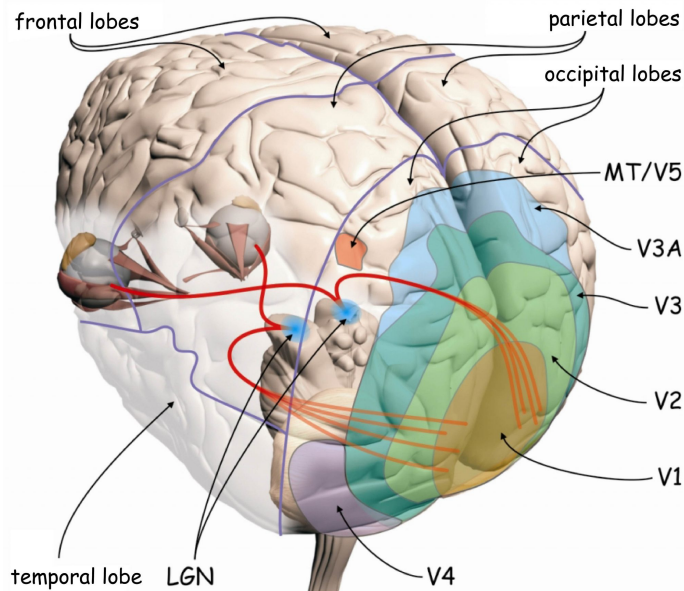
- Where and what pathways of the two stream hypothesis
- Works without visual input
- Visual aids needed for visual thinking due to limited memory resources and interactions due to limited attention



# VISUAL CORTEX & FEATURES PROCESSED

Visual cortex areas V1, V2, V3, V4, V5/MT (middle temporal))

Simple features are detected in earlier visual areas, large patterns and shapes in higher visual areas



Visual cortex and other cortical structures involved in vision. Graphic design: P.A. based on Logothetis (1999) and Zeki (2003)

# VISUAL CORTEX & INFORMATION

	Areas	Features processed	Example
Lower visual cortex	V1, V2	Simpler features	V1 neurons may fire to any vertical stimulus <sup>†</sup>
Higher visual cortex	V4, MT, and IT	Complex patterns	IT neurons may fire only to a specific face <sup>‡</sup>



# VISUAL CORTEX & INFORMATION

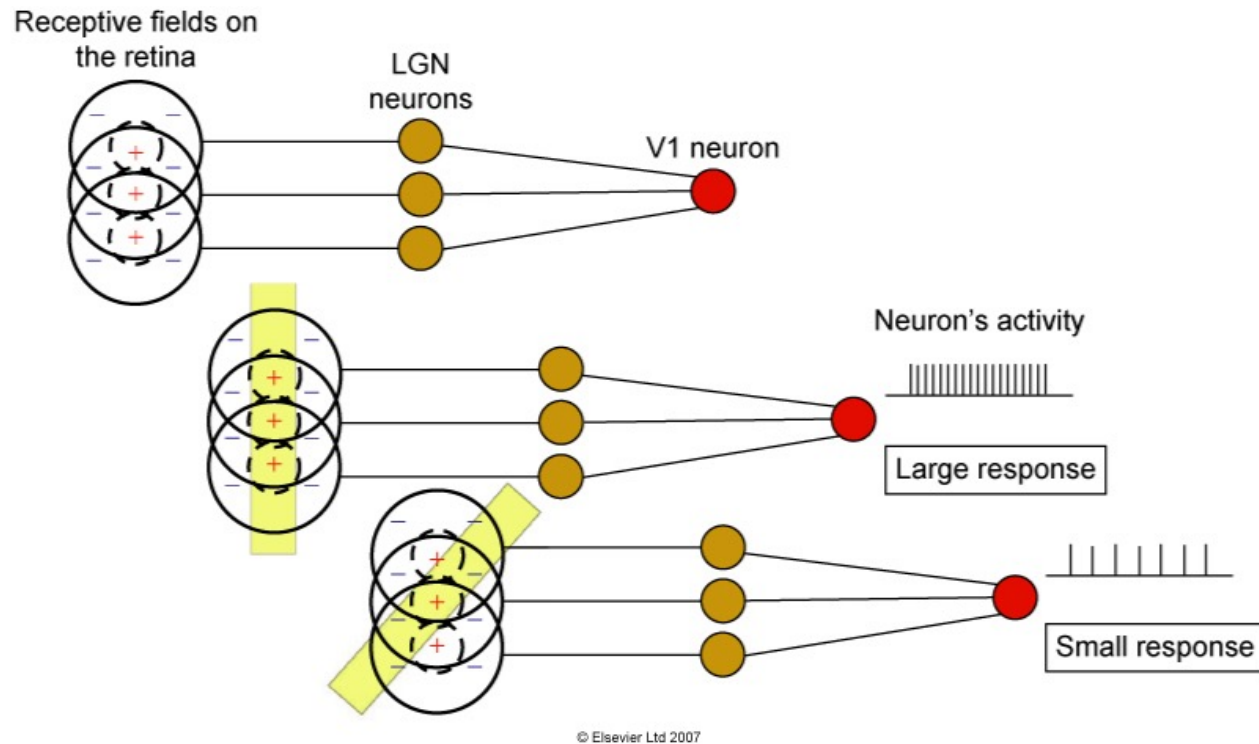
	Areas	Features processed	Example
Lower visual cortex	V1, V2	Simpler features	V1 neurons may fire to any vertical stimulus <sup>†</sup>
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	Lower visual cortex	Higher visual cortex
Information	Low	High
Localization	High	Low
Specificity	Low <sup>†</sup>	High <sup>‡</sup>
Experience	Universal	Individual



# V1 NEURONAL TUNING

- Single V1 neurons are generally tuned to a particular characteristic
- Results from convergence (group of cells form a receptive field for one neuron)



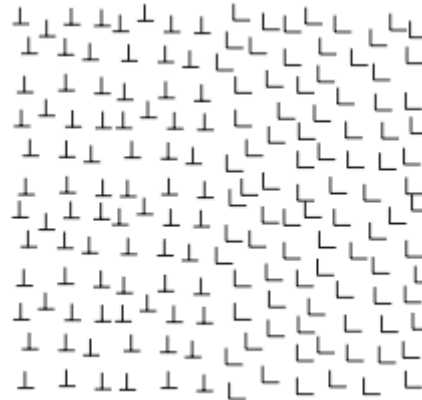
Some neurons of V1 are tuned to vertical lines, others to diagonal lines

# LOWER VISUAL CORTEX

- Typically takes  $\sim 40\text{ms}$  (preattentive\*)
- Strong tuning to orientation, spatial frequency and color
- Extremely sensitive tuning for horizontal and vertical lines



- Feature hierarchy, e.g., corners generate more powerful responses than edges

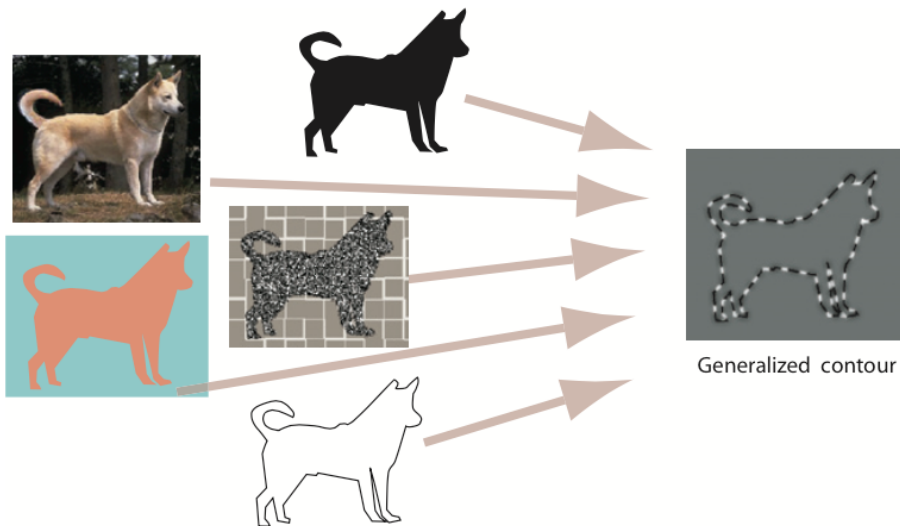


Ware, Colin, Visual queries: The foundation of visual thinking, 2005.

\* Pre-attentive  $\leq 200\text{ms}$ , in contrast saccades  $\sim 200\text{ms}$  to initiate, last 20-200ms

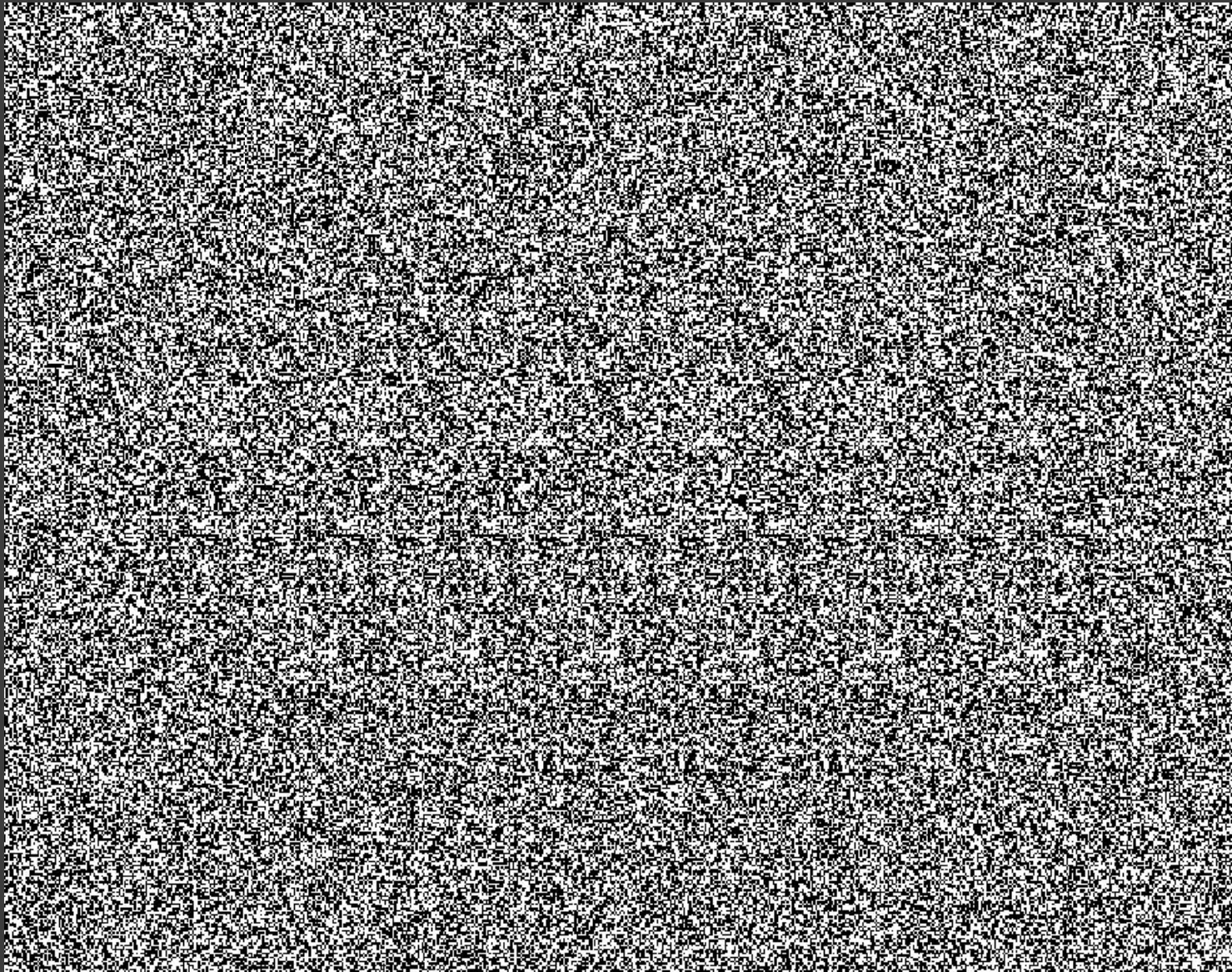
# HIGHER VISUAL CORTEX

- $\geq 100\text{ms}$
- Increased sensitivity to more global organization of the scene
- Tuning to groups of patterns, motion patterns of large patterns
- Specialized regions extract and represent generalized object structure, e.g., generalized contours are easily understood in sketches



Ware, Colin, Visual queries: The foundation of visual thinking, 2005.

- Tuning to motion patterns of large patterns

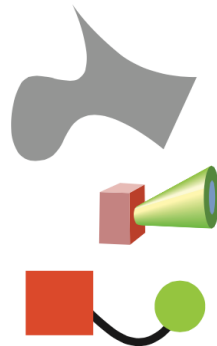


V4 response to motion of a large pattern.  
Likely adaptation to tracking camouflaged objects.

# APPREHENDABLE CHUNK

Apprehendable chunks are:

- Learnable composite pattern
- Unlearned patterns that can be apprehended in one fixation
- Consist of about three components



Ware, Colin, Visual queries: The foundation of visual thinking, 2005.

# SELECTIVE ATTENTIONAL TUNING

Feature level tuning  
can allow us to attend  
to different layers of  
information

Text on a background containing  
similar feature elements will be  
very difficult to read even though  
the background color is different.

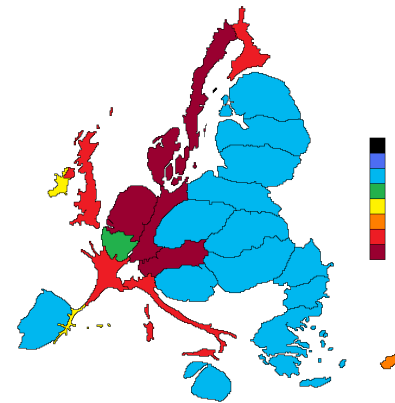
Can focus on a layer of a set of superposed layers. This property is used in thematic maps to display different data.

Disrupted when patterns are too similar. This is similar to a conjunction search in pre-attentive features.



# GROUPS OF PATTERNS ARE ROBUST TO DISTORTIONS

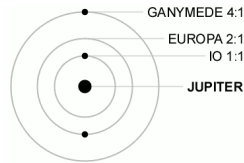
Neurons in higher visual cortex respond strongly despite distortions



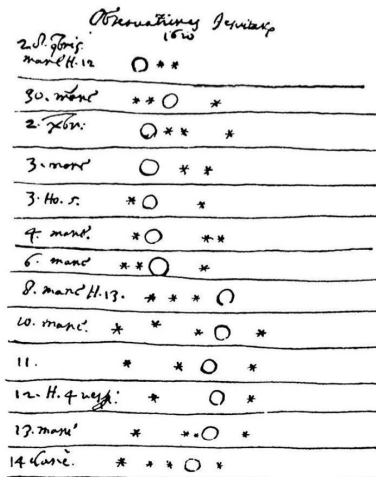


# SKETCHES

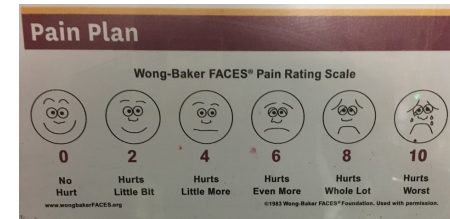
- Easily understood complex patterns
- Require less work to understand than full-color, textured images



Galilean moons.



Drawing by Galileo.























Wong-Baker Faces Pain Rating Scale

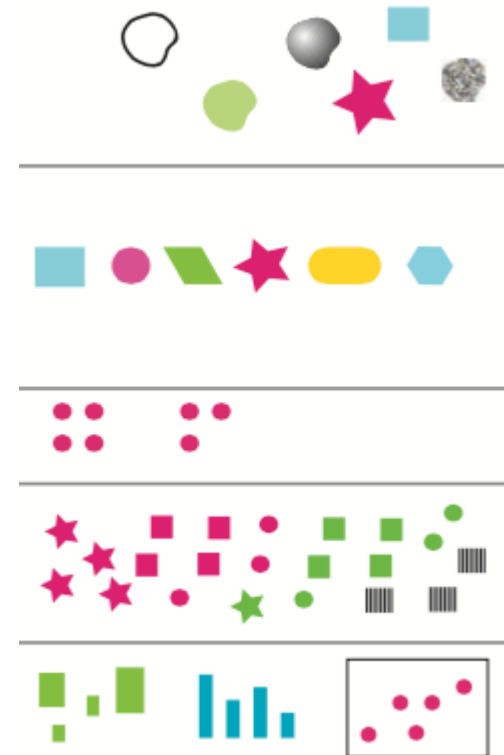


Happy-or-not Smiley Terminal™

# ICONS & SPATIAL METAPHORS

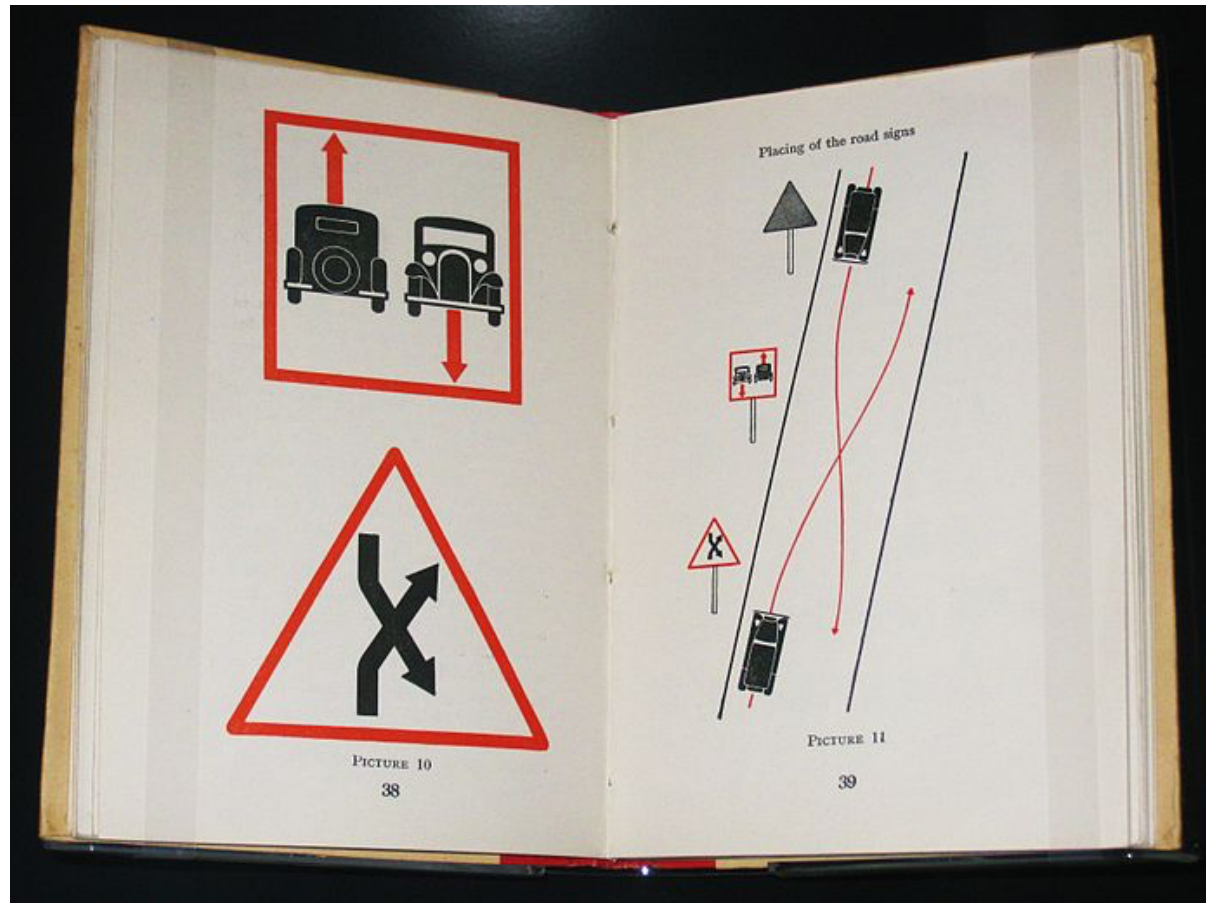
 address-card	 address-card-o
 anchor	 archive
 arrows-h	 arrows-v
 asterisk	 @ at
 balance-scale	 ban
 bar-chart-o (alias)	 barcode
 bathtub (alias)	 battery (alias)
 battery-2 (alias)	 battery-3 (alias)
 battery-full	 battery-half
 bed	 beer

Font Awesome icons



Ware, Colin, Visual queries: The foundation of visual thinking, 2005.

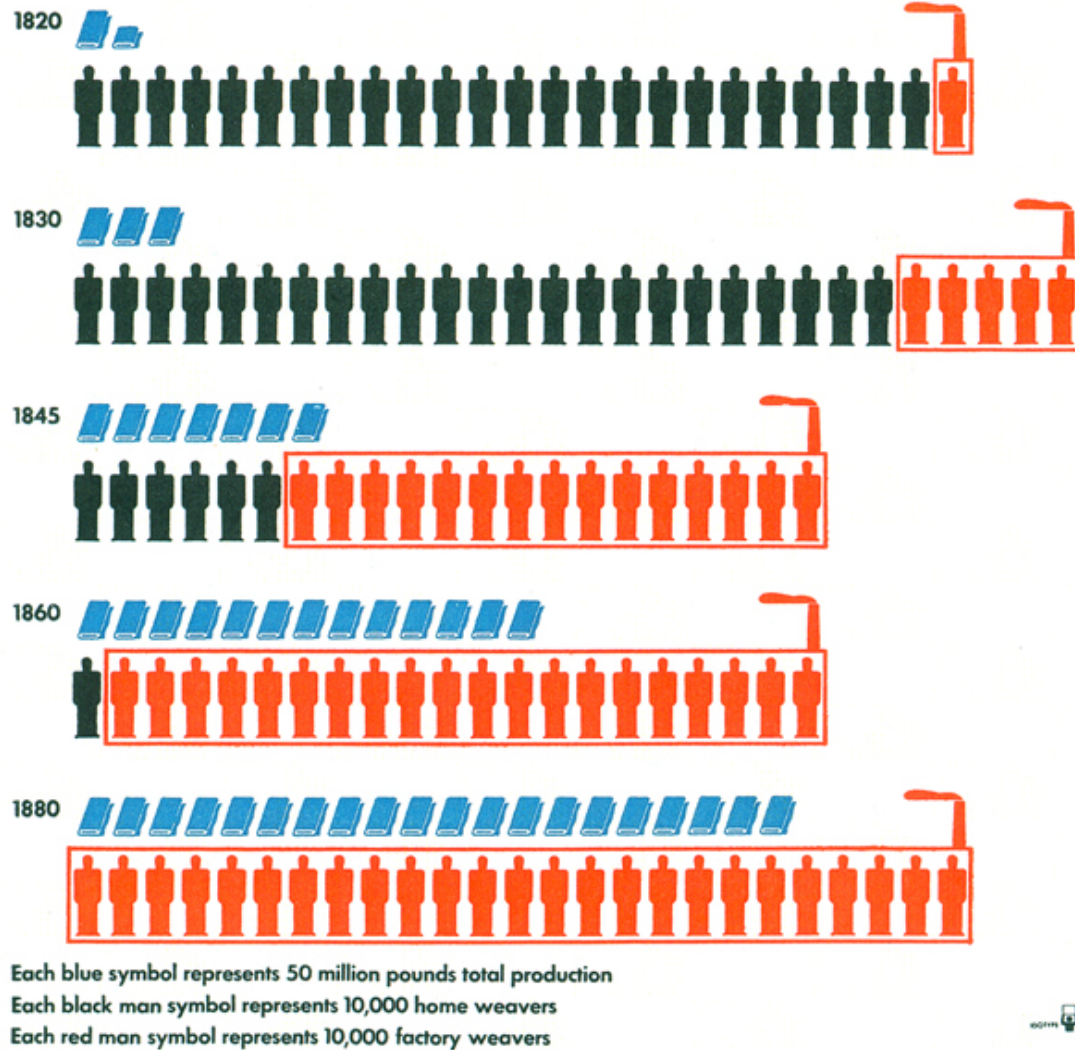
# ISOTYPE\* [OTTO & MARIE NEURATH - 1935]



Neurath's International picture language, 1936

\* Isotype: International System Of TYpographic Picture Education: a symbolic representation of qualitative and quantitative information via easily interpretable icons

## Home and Factory Weaving in England



O. Neurath, Modern Man in the Making, 1939. Home and Factory Weaving in England

# VISUAL MEMORY

← Visual Persistence

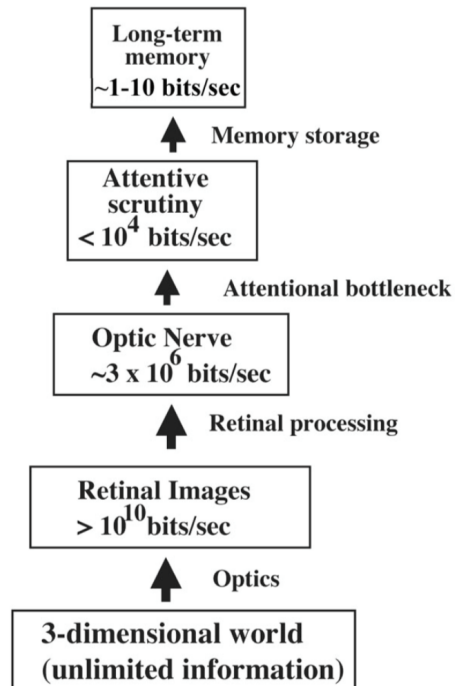
Information Persistence →

Iconic Memory	Visual Short-term Memory (VSTM)	Visual Long-term Memory (VLTM)
Unlimited capacity	Limited capacity	Large capacity
Retention: $\leq 1s$	Retention: $\leq 30s$	Retention: <i>indefinite</i>
<ul style="list-style-type: none"> <li>○ High bandwidth</li> <li>○ Works unconsciously</li> <li>○ Provides temporal integration</li> <li>○ Continuity during saccades</li> </ul>	<ul style="list-style-type: none"> <li>○ Buffer that stores temporary information</li> <li>○ Constructs and manipulate visual images</li> </ul>	<ul style="list-style-type: none"> <li>○ Capacity increases over childhood, declines with old age.</li> <li>○ Encodes information semantically for long term storage</li> <li>○ Subject to fading, recalls help preserve it</li> </ul>



# ATTENTIONAL BOTTLENECK

Result of limited VSTM capacity



AN INFORMATION PYRAMID

Anderson C., Van Essen D., and Olshausen A, Directed visual attention and the dynamic control of information flow, 2005.



# MILLER'S LAW

*The Magical Number Seven, Plus or Minus Two*

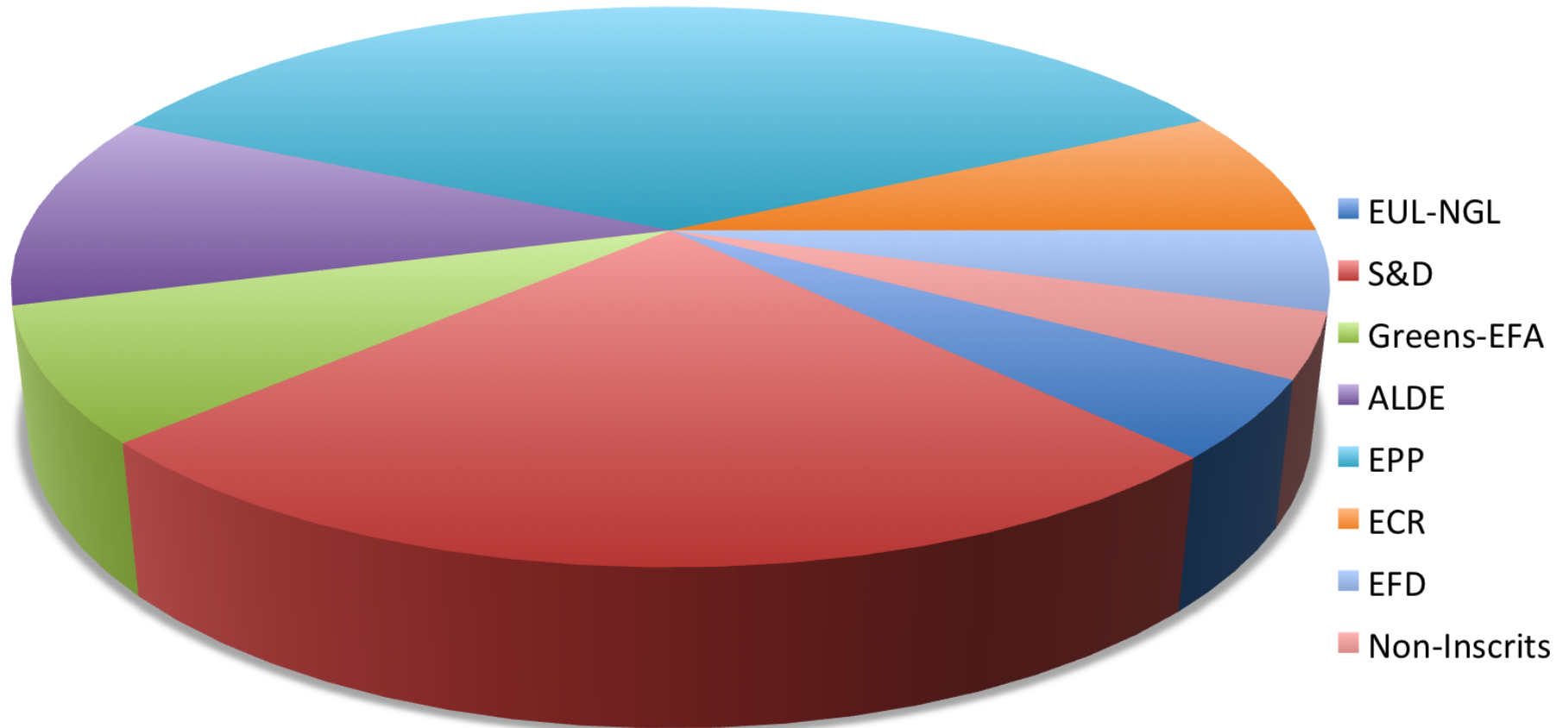
# MILLER'S LAW

## *The Magical Number Seven, Plus or Minus Two*

- Actual limit depends on the type information:
  - 5-9 items in a 1-D information judgment task [Miller, 1956\*]
  - 4-5 items with characters [Sperling, 1960]
  - 3-4 items with basic visual features & interference task [Luck & Vogel, 1997]



# European Parliament Party Breakdown

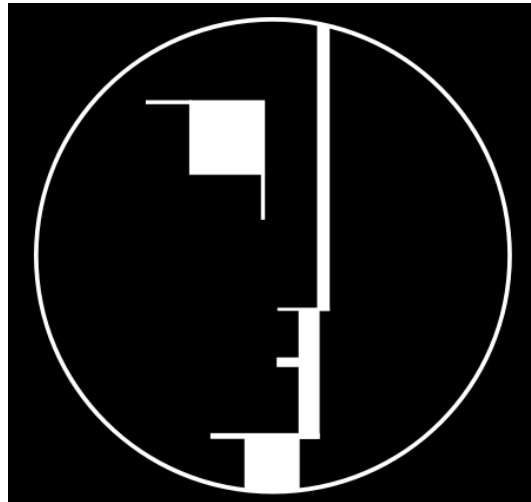


# OUTLINE

- Pattern recognition, memory
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# GESTALT THEORY OF PERCEPTION [1890]

- An organized whole that is perceived as more than the sum of its parts
- Gestalt means *shape* in German
- Psychology theory to understand the design implications of how we perceive patterns



Bahaus logo of Berlin art school

# GESTALT PRINCIPLES

Emergence

We perceive images as a whole

Reification

We perceive more than the stimulus contains

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Multi-stability

Some stimuli are perceived as changing between two or more interpretations

Invariance

Simple objects are recognized independent of pose, deformations, lighting, and features



# GESTALT LAWS

## Pithiness (Prägnanz)

We order our experience in a manner that is regular, orderly, symmetric, and simple

### Symmetry



We perceive objects as being symmetrical and forming around a center point

## Figure and ground

We tend to separate an object from its background

### Focal points

Elements with a point of interest, emphasis or difference will capture and hold attention

## Parallelism

Parallel elements are seen as more related than elements not parallel

### Past experience

Elements are perceived according to past experience

# GESTALT LAWS OF GROUPING

## Proximity

Elements close together are perceived as grouped

## Similarity

Objects with similar appearance are perceived as grouped

## Closure

Parts of an object tend to be grouped together and we perceive the whole figure

## Continuity

We perceive the pieces to form a continuation as parts of a whole object

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## Common fate

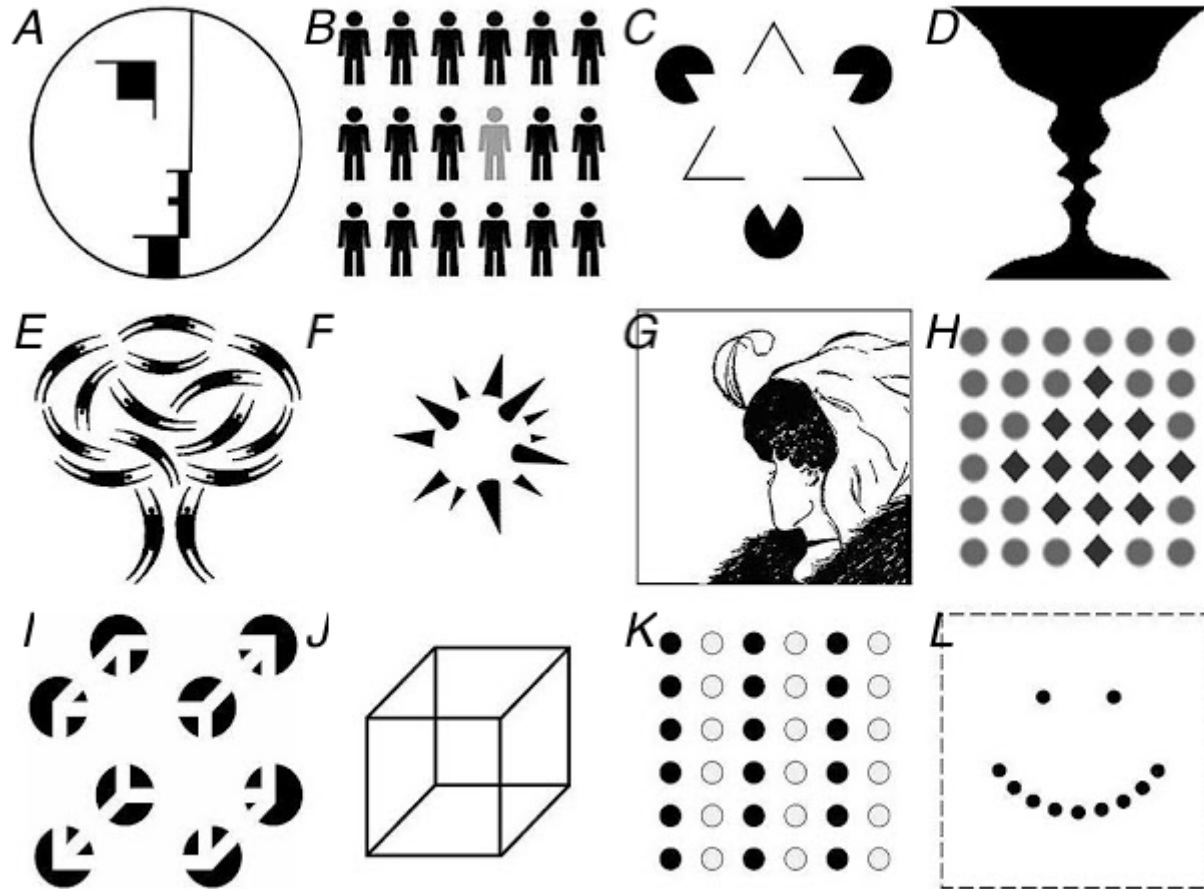
Objects moving in the same direction are perceived as grouped

## Connection

Objects that are connected are perceived as a group

## Common region

Objects enclosed by a boundary are perceived as a group



A: common region

B: focal point, similarity, proximity

C: principle of reification, closure

D: principle of multi-stability, figure and ground

E: principle of invariance, proximity, similarity

F: principle of reification, closure

G: principle of multi-stability, figure and ground,

H: similarity, proximity

I: principle of reification, closure

J: principle of multi-stability

K: similarity, proximity

L: common region, proximity, continuity

# OUTLINE

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# SEMIOLOGY OF GRAPHICS [BERTIN 1967]



Jaques Bertin, French cartographer and theorist

- Visual language is a sign language
- Sender encodes information in signs, receiver decodes information from signs
- Semiotics (semiology) is the study of signs and symbols and their use or interpretation



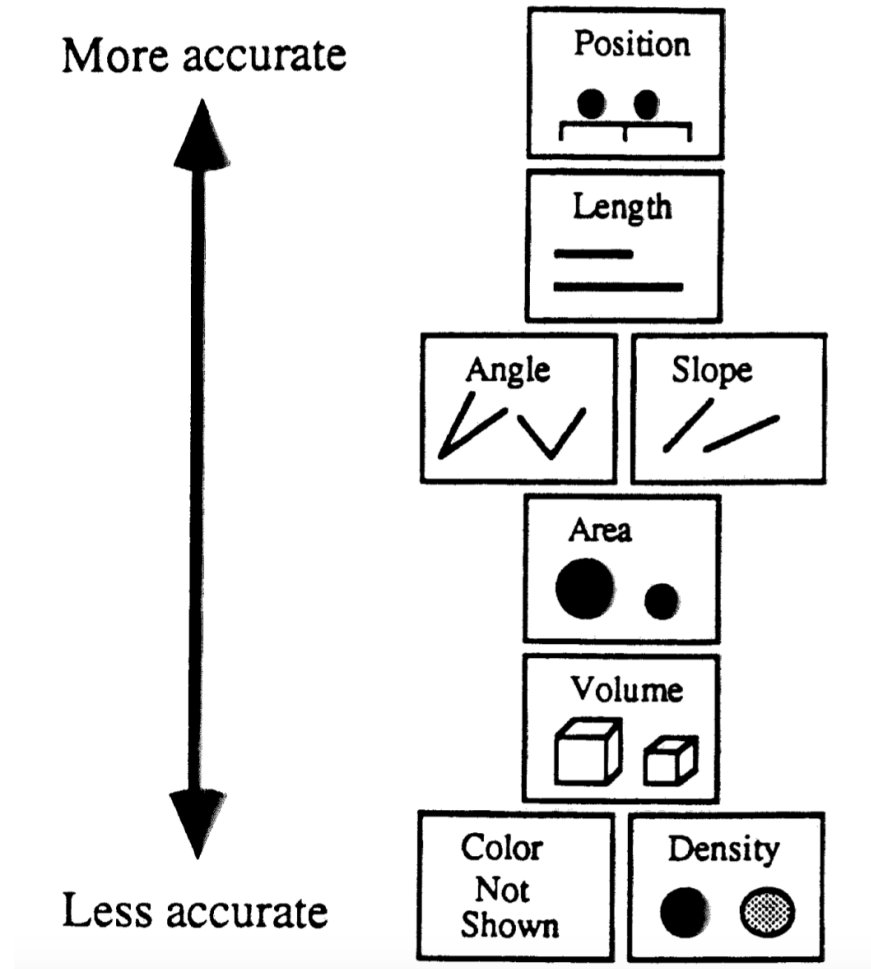
# MARKS (VISUAL VARIABLES) AND CHANNELS (ENCODINGS)

		MARKS: POINTS			LINES			AREAS				
<b>CHANNELS:</b>	<b>POSITION</b>	<b>LES VARIABLES DE L'IMAGE</b>										
		POINTS			LIGNES			ZONES				
	<b>GREY VALUE</b>	XY 2 DIMENSIONS DU PLAN	x	x	x	/	~	/	14 15 19 16 21 2	2 1 18 2 1 21 15 14 15 1	OQ	≠
	<b>SIZE</b>	Z TAILLE	█	█	█	/	~	/	█	█	OQ	≠
	<b>TEXTURE</b>	VALEUR	█	█	█	/	~	/	█	█	O	≠
	<b>COLOR</b>	<b>LES VARIABLES DE SÉPARATION DES IMAGES</b>										
	<b>ORIENTATION</b>	GRAIN	█	█	█	/	~	/	█	█	O	≠
	<b>SHAPE</b>	COULEUR	█	█	█	/	~	/	█	█	≠	≠
		ORIENTATION	█	█	█	/	~	/	█	█	≠	≠
		FORME	█	█	█	/	~	/	█	█	≠	≠

O : ordinal, Q: continuous, ≠ different, = similar

Semiology of Graphics, J. Bertin, 1967

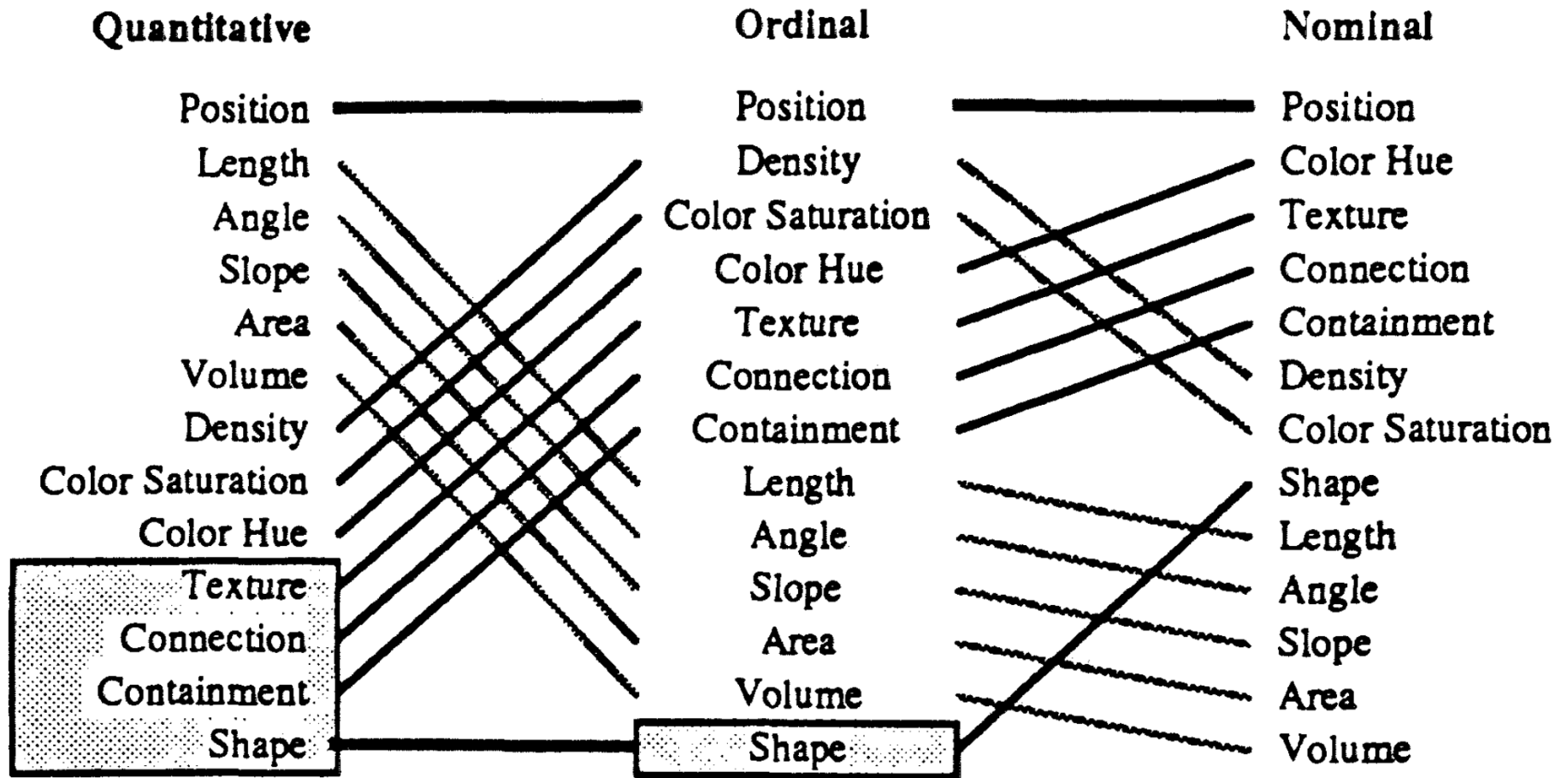
# ACCURACY OF PERCEPTUAL TASKS [MCKINLEY 1986]



Higher tasks are accomplished more accurately than lower tasks.

≡ Mackinlay, J., Automating the design of graphical presentations of relational information. ACM Transactions On Graphics, 1986.

# ACCURACY OF PERCEPTUAL TASKS BY DATA TYPE [MCKINLEY 1986]



Ranking of perceptual tasks. Tasks in gray boxes are not relevant to these types of data.

Mackinlay, J., Automating the design of graphical presentations of relational information. ACM Transactions On Graphics, 1986.

