

# Thinking with Interactive Visualization

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## Outline

- The problem solving system
- Pre-attentive (what is low cost)
- Patterns
- 2D vs 3D?
- Visual thinking and the cost of knowledge



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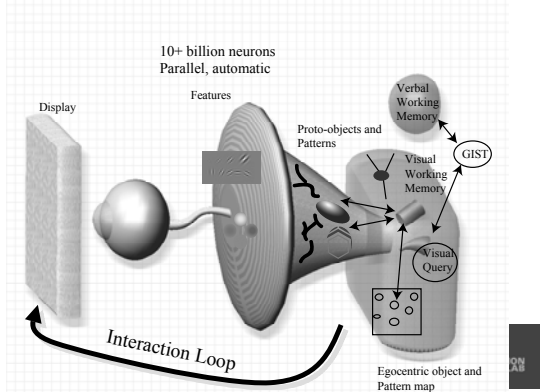
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## Architecture for visual thinking



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## Pre-Attentive Processing

897390570927940579629765098294  
08028085080830802809850- 802808  
567847298872t y4582020947577200  
21789843890r 455790456099272188  
897594797902855892594573979209



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## Color is Pre-Attentive (Pops out)

897390570927940579629765098294  
08028085080830802809850- 802808  
567847298872t y4582020947577200  
21789843890r 455790456099272188  
897594797902855892594573979209



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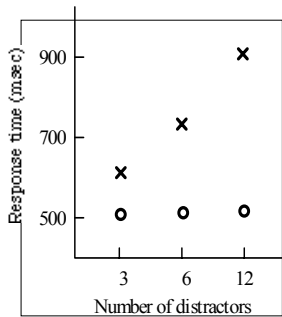
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## Generic Pre-Attentive Experiment



- Number of irrelevant items varies
- Pre-attentive 10 msec per item or better.



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## Preattentive popout cues

- Color
- Shape
- Motion
- Size
- Simple Shading
- Conjunctions do not popout



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## Conjunctions of motion and shape do pop out. (color also?)

- McLeod, P., Driver, J. and Crisp, J. (1988)  
Visual search for a conjunction of movement and form is parallel. *Nature* 332, 154-155.
- Driver, J., MacLeod, P. and Dienes, Z. (1992)  
Motion coherence and conjunction search: Implications for guided search theory. *Perception and Psychophysics*. 51, 1, 79-85.



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## MEGraph: Experimental system

- Allows for various topological range highlighting methods



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## Stage 2 Pattern perception

- Gestalt principles
- Proximity
- Continuity
- Connectedness
- Closure



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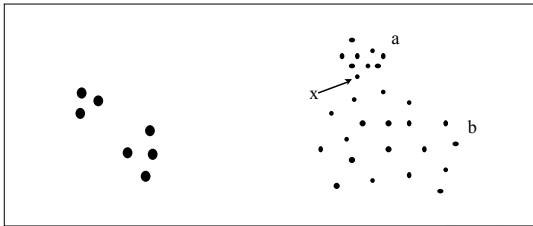
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## Proximity

- Emphasize relationship by proximity
- Spatial Concentration



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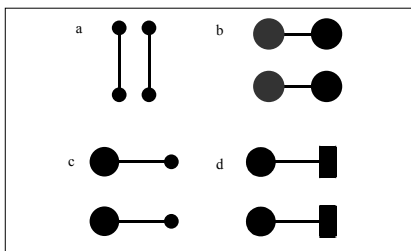
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## Connectedness

- Connectedness assumed in Continuity



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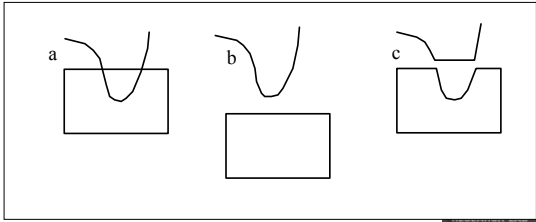
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## Continuity

- Visual entities tend to be smooth and continuous



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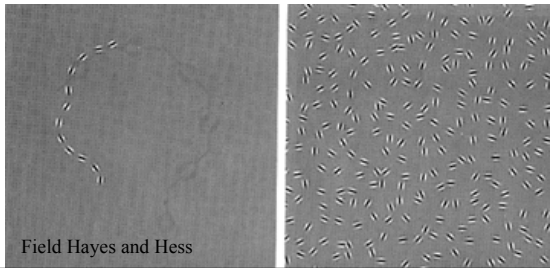
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## Neural basis



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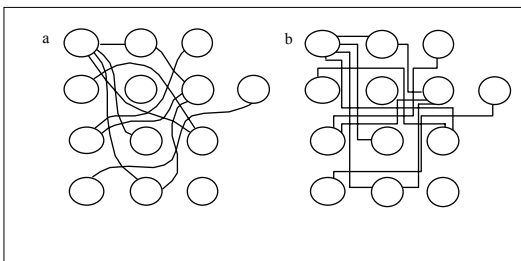
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## Continuity in Diagrams

- Connections using smooth lines



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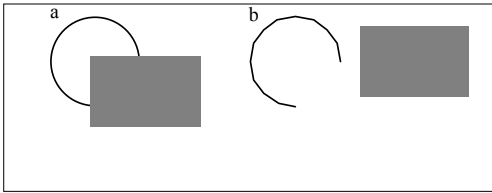
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# Closure

- Prefer closed contours



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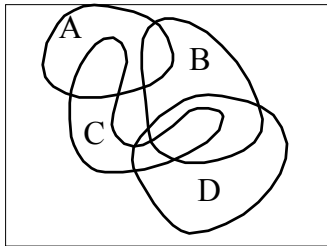
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# Closure (cont.)

- Closed contours to show set relationship



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# Extending the Venn-Euler Diagram



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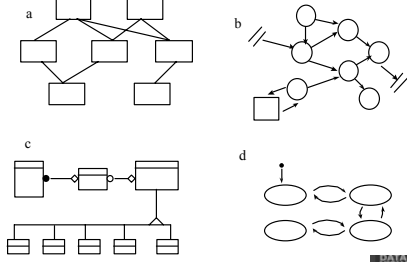
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# Patterns in Diagrams

- Entities – objects
- Relationships – links, color, etc



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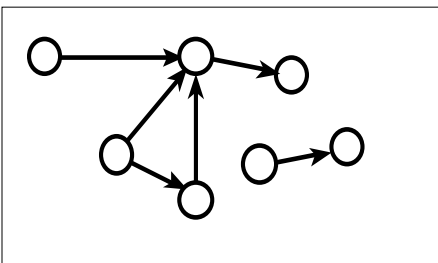
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# A causal graph



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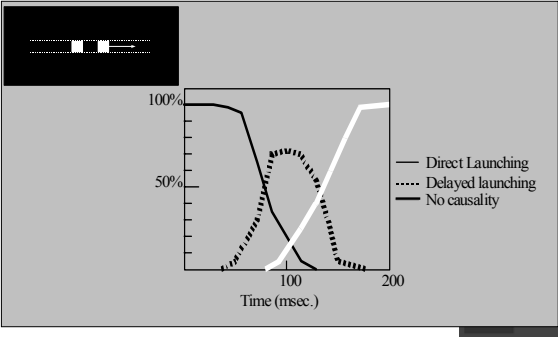
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# Michotte's Causality Perception



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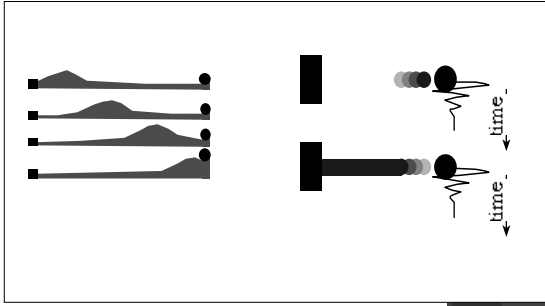
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# Visual Causal Vectors




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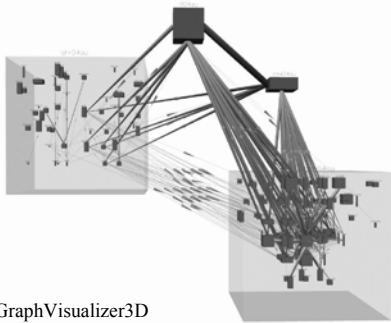
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# 3D pattern perception

- Use 3D?



GraphVisualizer3D

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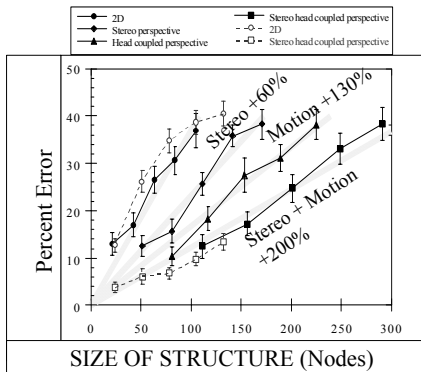
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## Issues

- Can see a larger graph
- Must have stereo and motion
- But consider the cost of interaction



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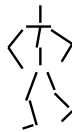
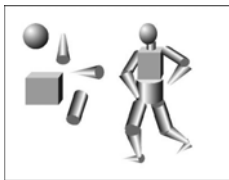
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## Another form of 3D Structured Object Perception

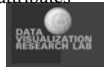


3D Primitives "Geons"  
Structural skeleton



Shape from shading  
is also primitive

Color and texture are  
Secondary attributes



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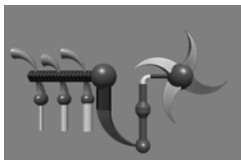
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## Geon Diagram (Pourang Irani)

- Major entities should be represented with simple 3D shape primitives
- Links can be represented by connecting geons (the structural skeleton)
- Geons should be shaded to make 3D shape visible
- Secondary attributes -> color and surface texture
- Layout of structure should be primarily in 2D plane



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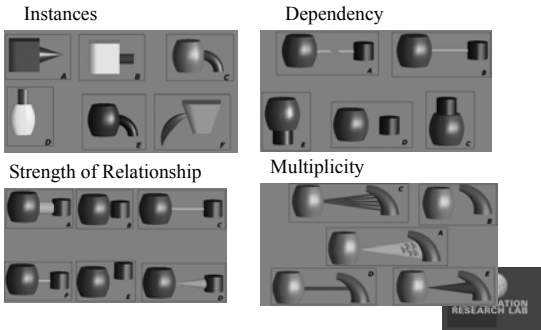
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# Natural semantics



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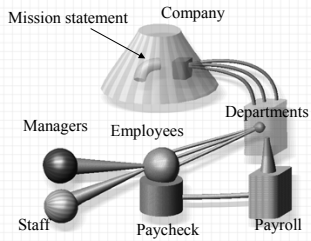
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# Geon Diagram with semantics



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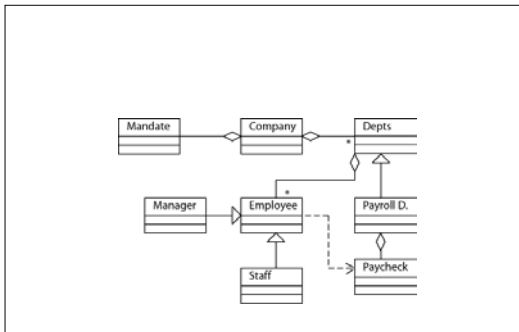
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# UML MODELING



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# Geon Diagrams



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# Geon Diagrams

- Advantages
  - More memorable
  - Easier to interpret
- Disadvantages
  - Do not work well with text
  - Inflexible wrt layout



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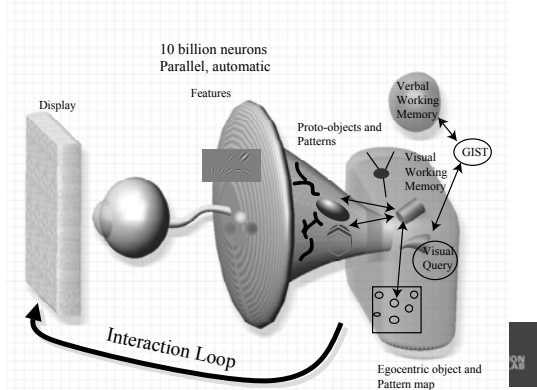
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# Architecture for visual thinking



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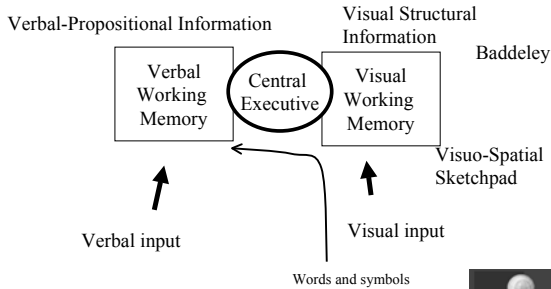
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# Dual Coding Theory




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# Pictures and Words

- When should we use a visual display?
- What is a visual language?
- Dual coding theory?
- How to integrate images and words




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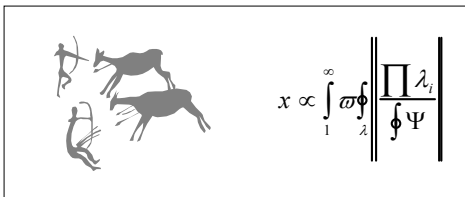
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Consider that hieroglyphs gave way to more abstract symbols

- Why turn back the clock?




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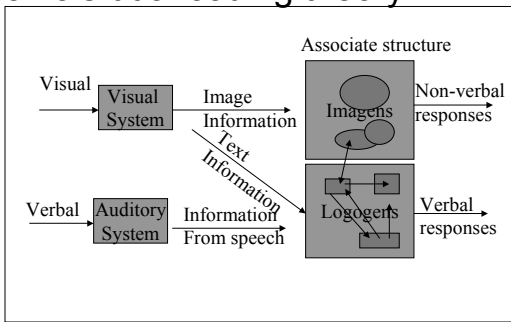
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## Pavio's dual coding theory



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## Theory: Graphics and Words

- Graphics for structural logic
- Words for procedural logic: conditionals, qualifiers, if-then else, while.



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## The nature of language

- Chomsky, innate deep structures.
- Common to computer languages
- Critical period for language development
- But being verbal is not essential to language development
- Sign languages for the deaf are the most perfect examples of visual language



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## What is language

- Description
- Communication of intention
- The ability to communicate procedures and sequences of operations – including logic – if, but, causes, do **a** then **b** then **c**
- ***Thus far we have only dealt with description***



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## Sign languages

- Are true languages
- Developed spontaneously
- Developed independently
- Start as representations
- Become more abstract over time



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## Can there be a true visual language?

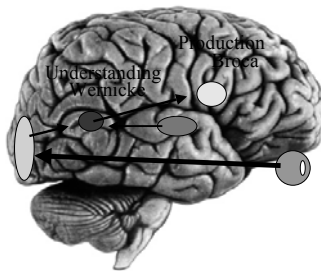
Yes,  
But not for most of us!!

Consider verbal language

A critical period  
Abstraction, logic  
(if, while, perhaps)

Based on speech

Sign languages are true  
Visual languages



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To be fluent in visual language we should be trained from early in life



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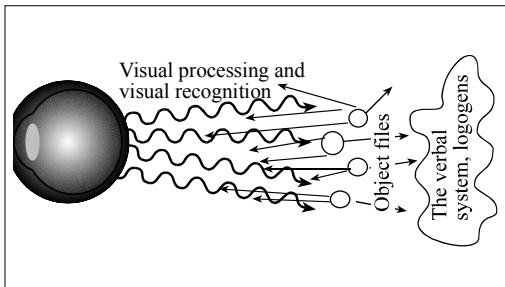
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## The visual system gives us

Rapid recognition and pattern finding



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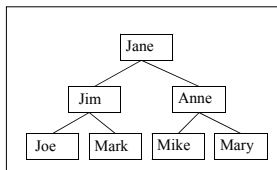
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## Abstraction

## Pattern

- Jane is Jim's boss
- Jim is Joe's boss
- Anne works for Jane
- Mark works for Jim
- Anne is Mary's boss
- Anne is Mike's boss



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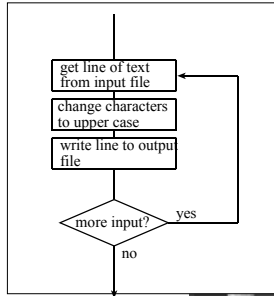
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## Visual and verbal pseudo-code

- While letters in stack
  - Take a letter
  - Put a stamp on it
  - Put it in the 'out tray'



Visual programming languages have a history of failure

Data flow diagrams are




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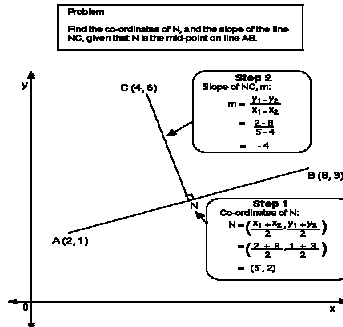
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## Integrated pictures and words more Effective: Chandler and Sweller 1991




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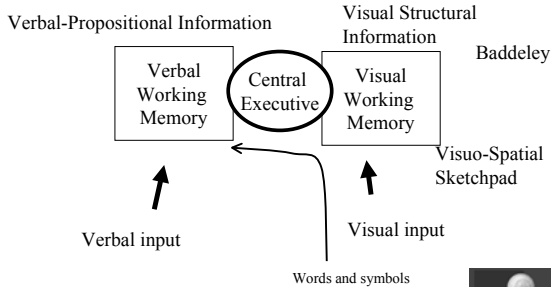
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## Working memory capacities ~ 3




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## Capacity of verbal working memory

- Used to be thought of a  $7 \pm 2$
- It is now thought of as more a duration of proto-verbal codes.



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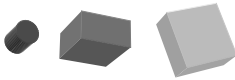
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## Capacity of visual working memory (Vogel, Woodman, Luck, 2001)

- Task – change detection — 1 second
- Can see 3.3 objects
- Each object can be complex



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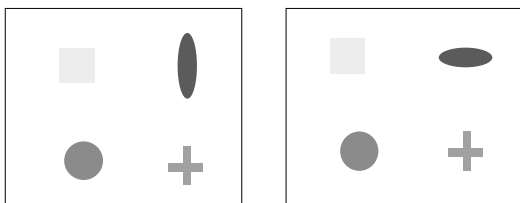
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## Sequential comparison task

1 sec delay



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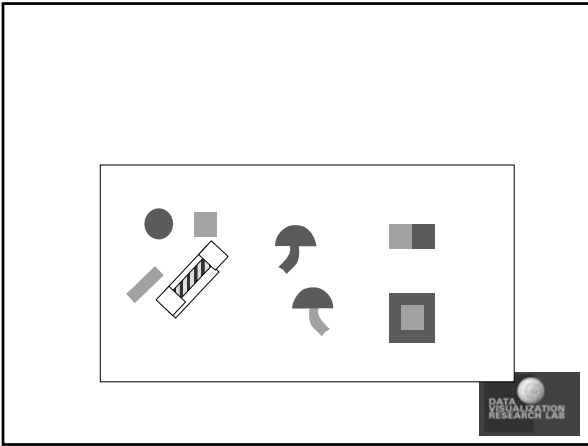
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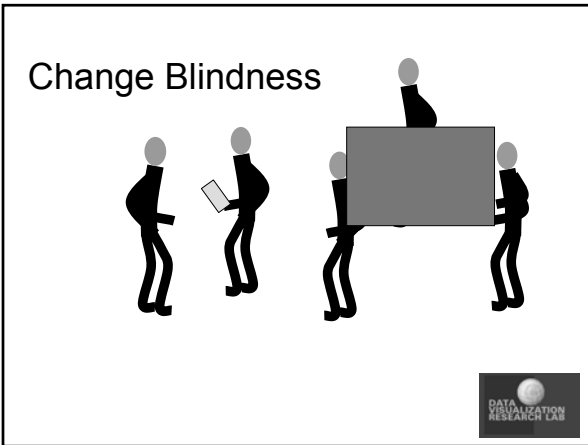
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- Triesman serial processing of non-pre-attentive object (40 msec/item)
  - Kahneman and Triesman "object files"
  - Rensink - Fingers of attention reach into pre-object flux
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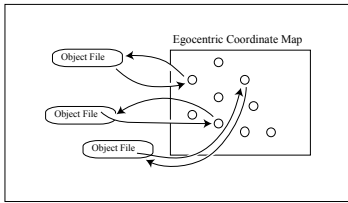
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## Other components of working memory



Gist      Semantic content



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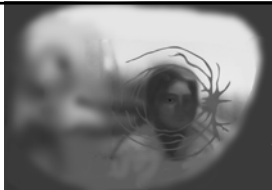
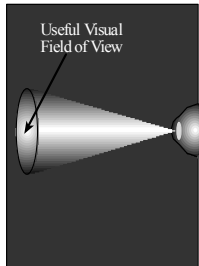
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## Visual search



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## Eye movements



- Two or three a second
- Preserves Context
  
- The screen is a kind of buffer for visual ideas – we cannot see it all at once but we can sample it rapidly



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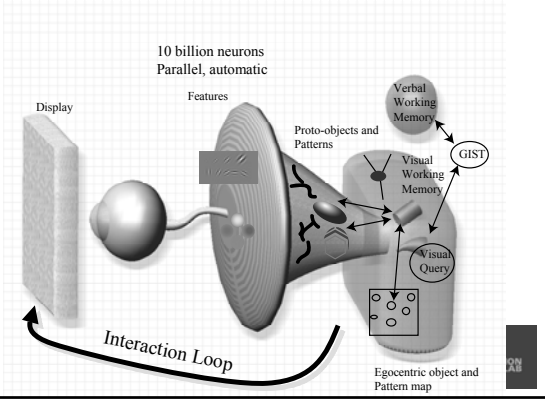
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# Architecture for visual thinking



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# Thinking visually Embedded processes

- Define problem and steps to solution
  - Formulate parts of problem as visual questions/hypotheses
    - Setup search for patterns
      - Eye movement control loop
        - IntraSaccadic Scanning Loop (form objects from proto-object flux)



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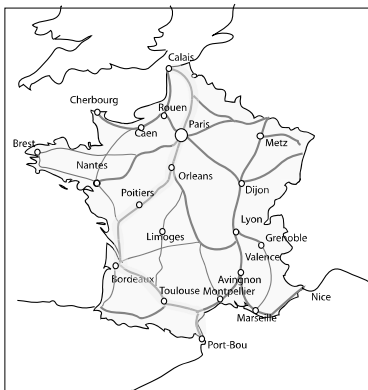
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## Problem

- Trip Port Bou- Calais (5 days 3 citise)
  - Visual Problem Mayor Highways
    - Distance < 1.2 min = red smooth path
  - Eye movements to identify major candidate pathways
    - Pattern Identification: smooth, red, connected segments / reject non-red-wrong direction
- Part solutions into vwm – spatial markers
- Parts may be handed to verbal wm



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## Software Engineering Example - with Graph Representation

- Segment Big Module into parts
  - High Cohesion (semantics)
  - Low Coupling
    - Find highly connected subgraphs with minimal links
      - Scan for candidate patterns
        - Look for Low connectivity
        - Look for Semantic similarity (symbols)
- Important question: what are relevant pattern that can fit in vwm



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## Cost of Knowledge

- How do we navigate.
- Intra-saccade (0.04 sec)
- An eye movement (0.5 sec)
- A hypertext click (1.5 sec but loss of context)
- A pan or scroll (3 sec but we don't get far)
- Walking (30 sec. we don't get far)
- Flying (faster can be tuned)
- Zooming, fisheye, DragMag



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## Walking Flying (30 sec +)

Naive view that does not take perception or the cost of action into account.



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## How to navigate large 21/2D spaces?

### Zooming Vs Multiple Windows

- Key problem: How can we keep focus and maintain context.
- Focus is what we are attending to now.
- Context is what we may wish to attend to.
- 2 solutions: Zooming, multiple windows



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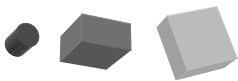
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## When is zooming better than multiple windows (Matt Plumlee)

- Key insight: Visual working memory is a very limited resource. Only 3 objects



GeoZui3D



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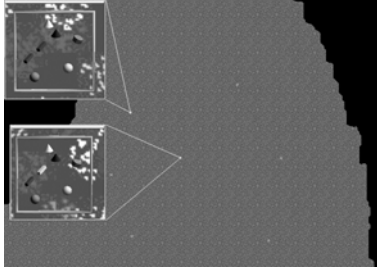
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Task: searching for target patterns that match



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## Cognitive Model (grossly simplified)

- Time = setup cost + number of visits\*time per visit
- Number of visits is a function of number of objects (& visual complexity)
- When there are too many multiple visits are needed



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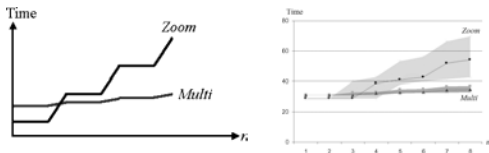
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## Predictions



Time =

As targets (and visual working memory load) increases, multiple Windows become more attractive.



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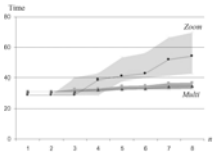
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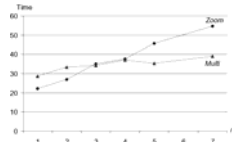
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## Prediction



## Results



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## Critical issues: Cognitive costs

- Clickless queries and cognitive costs
- Medium level – pattern perception
- High level vwm and cognitive costs
  
- Assumption: topologically close nodes are more important



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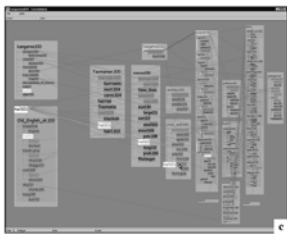
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## Need low cost and low cognitive cost interactions

Constellation: Hover queries (Munzer)



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## Lessons for design

- Low level- what stands out
- Medium level – pattern perception
- High level vwm and cognitive costs

A large high resolution screen may be the best alternative - because of eye movement

Interactive techniques hold promise



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## Implications for design of information spaces

- Design for pattern perception, three chunk patterns
- Consider attention
- Implications for navigation
  - Make all navigation devices visible.
  - Do not ever make people walk
  - Maintain context
  - Minimize cognitive load of navigation
  - Use multiple linked views for more complex pattern integration



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## Research topic

### What are easy visual queries



Easy= single object comparison in vwm



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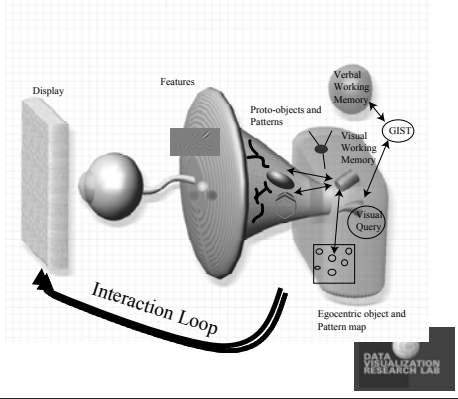
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## Architecture for visual thinking



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## Cognitive Systems

- Humans with cognitive tools functioning groups
- Visualization for pattern finding
- Coding for pre-filtering
- Slogan: "Tighten the loop"
- Large displays – interactive diagrams



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- NSERC (Canada)
- NSF (USA)
- NOAA
- ARDA



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