

# CSE 591: Visual Analytics

## Lecture 1: Introduction

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With some material from Robert Kosara, UNCC, and Daniel Keim, U Konstanz

### The Goal of Visualization

Ease understanding of the data by providing an effective visual representation

*Amplify Perception*

*Detect the Expected, Discover the Unexpected™*

## What is Visual Analytics

Visualization plus...

- interaction
- data processing
- story telling
- scientific approach

*Visual Analytics is the science of analytical reasoning supported by a highly interactive visual interface*

## Intelligence Analysis

Intelligence analysis is challenging

Huge amounts of data

Low signal vs. noise

Many data types

- text, images, video, sensor data, etc.

Uncertainty

Contradictions

Omissions

## Use of Visualization

### Visual perception

- high bandwidth
- fast screening of a lot of data
- pattern recognition
- higher-level cognition

### Interaction

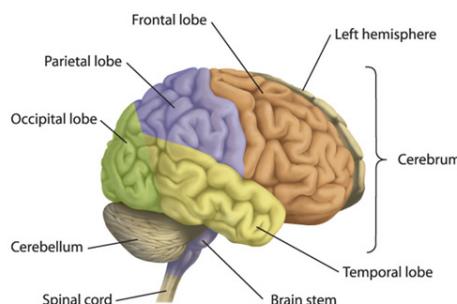
- direct manipulation
- two-way communication

*Let us have a closer look at the human visual system...*

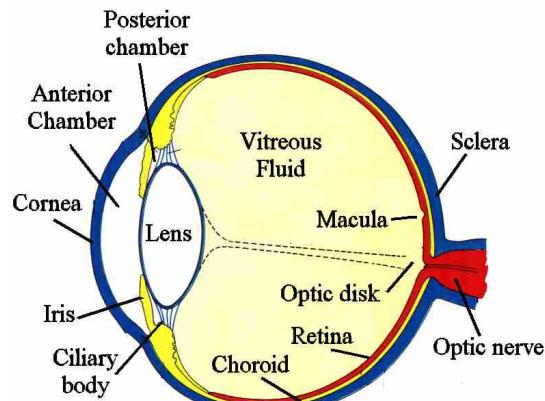
## The Visual Brain

Over 50% of the human brain is dedicated to vision and visual representations,

- decoding visual information
- high-level processing of visual information
- thinking with visual metaphors



## Input Device: The Eye



## Sensor: The Cones and Rods

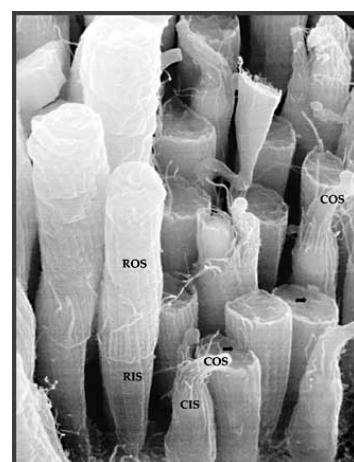
Two types of receptors on retina:  
rods and cones

Rods:

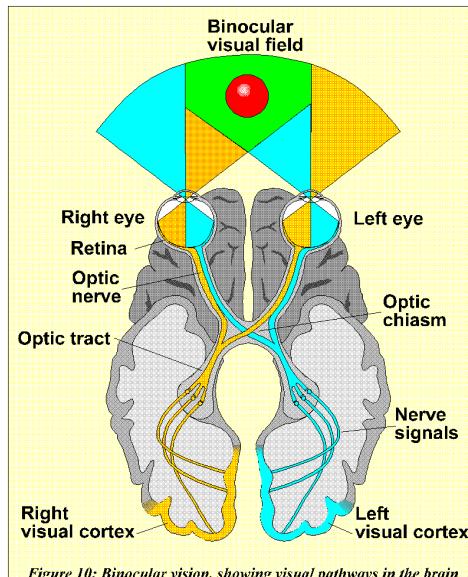
- spread all over the retinal surface (75 - 150 million)
- low resolution, no color vision, but very sensitive to low light (*scotopic* or dim-light vision)

Cones:

- a dense array around the central portion of the retina, the fovea centralis (6 - 7 million)
- high-resolution, color vision, but require brighter light (*photopic* or bright-light vision)



## Wiring: The Visual Pathways

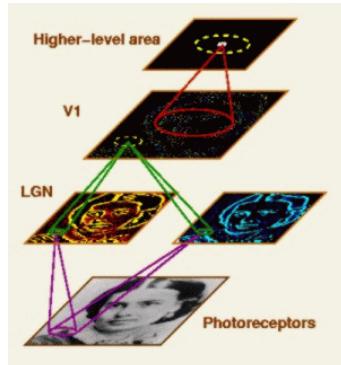


**Figure 10: Binocular vision, showing visual pathways in the brain**

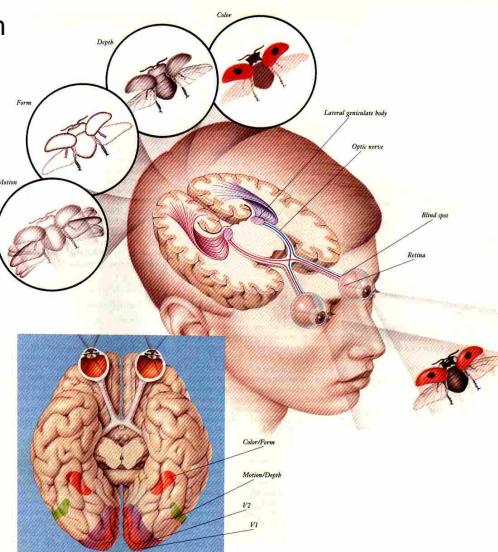
## Processing Unit: The Visual Cortex (V1, V2)

Visual cortex breaks input up into different aspects:

- color, shape, motion, depth

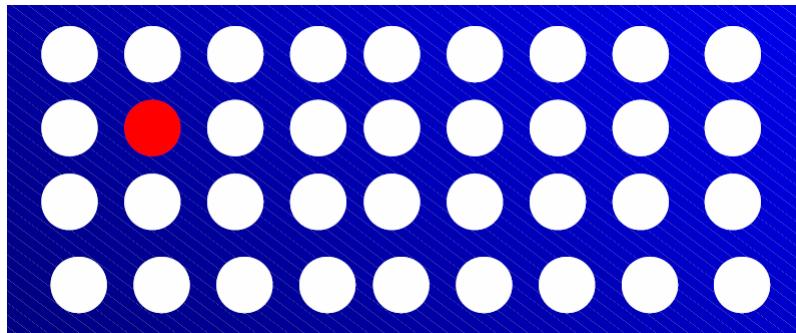


LGN= Lateral Geniculate Nucleus



## Pre-Attentive Processing

If you want it or not: some features are always detected  
And fast – within 200 ms or less



## Pre-Attentive Processing

Why is it so fast?

Well, because 50% of the brain is dedicated to vision

Vision is a MASSIVELY parallel processor dedicated to

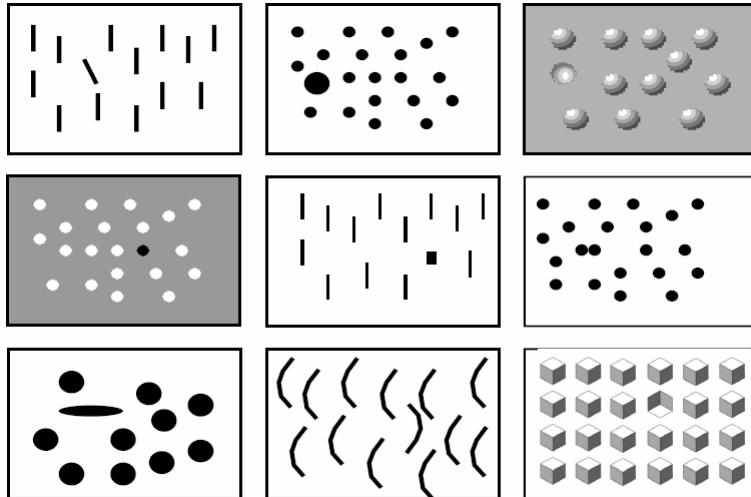
- detect
- analyze
- recognize
- reason with

visual input

## Pre-Attentive Processing

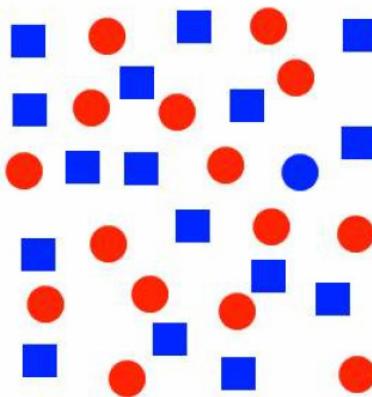
Sensitivity to differences in:

- color, orientation, size, shape, motion, shading, 3D depth, ...



## Pre-Attentive Processing

But there are limits: conjunctions don't work well



quick: find the blue circle

## Pre-Attentive Processing

Some features/cues are stronger than others:

Look at the chart and say the COLOUR not the word

YELLOW    BLUE    ORANGE  
BLACK    RED    GREEN  
PURPLE    YELLOW    RED  
ORANGE    GREEN    BLACK  
BLUE    RED    PURPLE  
GREEN    BLUE    ORANGE

### Left – Right Conflict

Your right brain tries to say the colour but  
your left brain insists on reading the word.

## Pre-Attentive Processing

Words are patterns, which form strong pre-attentive feature

- this would have been different if this had been done in Arabic

There are limits, however

- let's see the next experiment

## Pre-Attentive Processing

### Reading 1

Aoccdrnig to a rscheearch at an Elingsh  
uinervtisy, it deosn't mttaer in waht oredr the  
ltteers in a wrod are, the olny iprmoetnt tihng  
is taht frist and lsat ltteer is at the rghit pclae.

The rset can be a toatl mses and you can  
stll raed it wouthit porbelm. Tihs is bcuseae  
we do not raed ervey lteter by it slef but the  
wrod as a wlohe

## Pre-Attentive Processing

Now, is tihs ture? Raed on....

## **Pre-Attentive Processing**

Reading 2

Anidroccg to crad cniyrrag lcitsiugnis  
planoissefors at an uemannd, utisreviny  
in Bsitirh Cibmuloa, and crartnoy to the  
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a slpmie, macinahcel ioisrevnn of  
ianretnl cretcarahs araepps sneiciffut to  
csufnoe the eadyrevy oekoolnr

## **Pre-Attentive Processing**

Reading 2

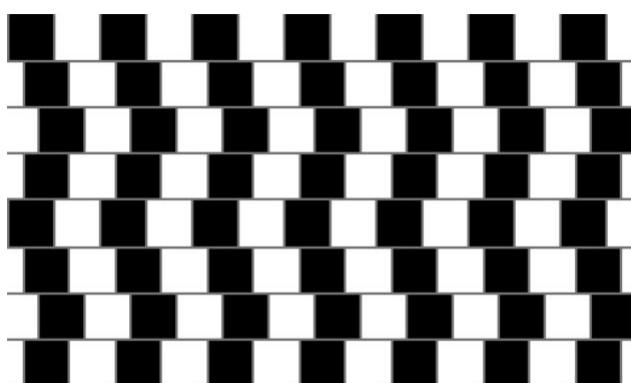
According to card carrying linguistics  
professionals at an unnamed, university  
in British Columbia, and contrary to the  
dubious claims of the uncited research,  
a slpmie, macinahcel ioisrevnn of  
ianretnl cretcarahs araepps sneiciffut to  
csufnoe the eadyrevy oekoolnr

## Pre-Attentive Processing

### Reading 2

According to card carrying linguistics professionals at an unnamed, university in British Columbia, and contrary to the dubious claims of the uncited research, a simple, mechanical inversion of internal characters appears sufficient to confuse the everyday onlooker

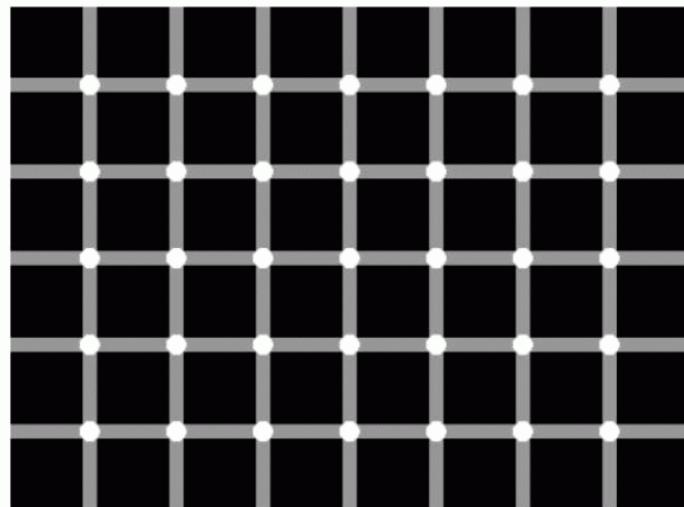
## Fooling the Visual System: Optical Illusions



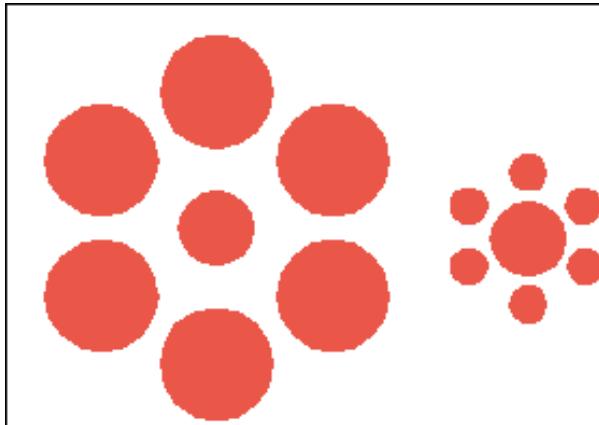
Are the horizontal lines parallel or do they slope?

## Fooling the Visual System: Optical Illusions

Count the black dots!

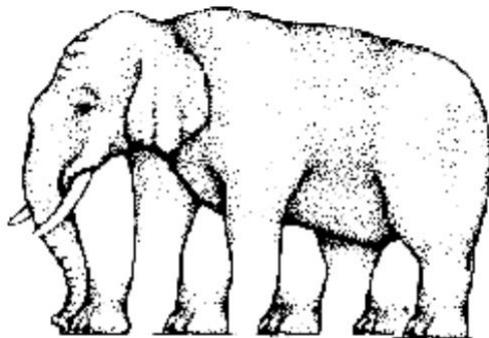


## Fooling the Visual System: Optical Illusions



Which circle in the middle is bigger?

## Consistency: Local vs. Global

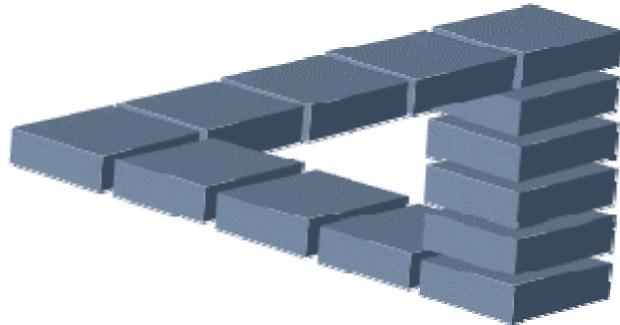


How many legs does this elephant have?

## Consistency: Local vs. Global



## Consistency: Local vs. Global



## View Point



Julian Beever

## **View Point**



Julian Beever



## **View Point**



Julian Beever

## Focus vs. Periphery

Humans tend to overlook/ignore non-focus (and unexpected) objects even when very close and obvious

- see various experiments by Daniel Simons, UIUC
- Visual Analytics slogan: *Detect the Unexpected*

Humans also have limited working memory

- fine details are quickly forgotten when focus changes
- big effect in animated or interactive visualizations
- need to preserve temporal context

## Explosion of Data

82,000 fingerprints are matched **every day** against INS database with 40 million records

100 million VISA credit card transactions **per day**

300 million phone long distance calls on ATT's network **per day**

7 million IP packets **per second** on DE-CIX backbone

→ there is *NO* chance to visualize all these data

## The Sense-Making Loop

Support visualization with computations for data processing

Form a loop: visualize - refine

Gather (forage) information

Re-Represent

- choose form that aids analysis

Develop insight

- through manipulation of representations

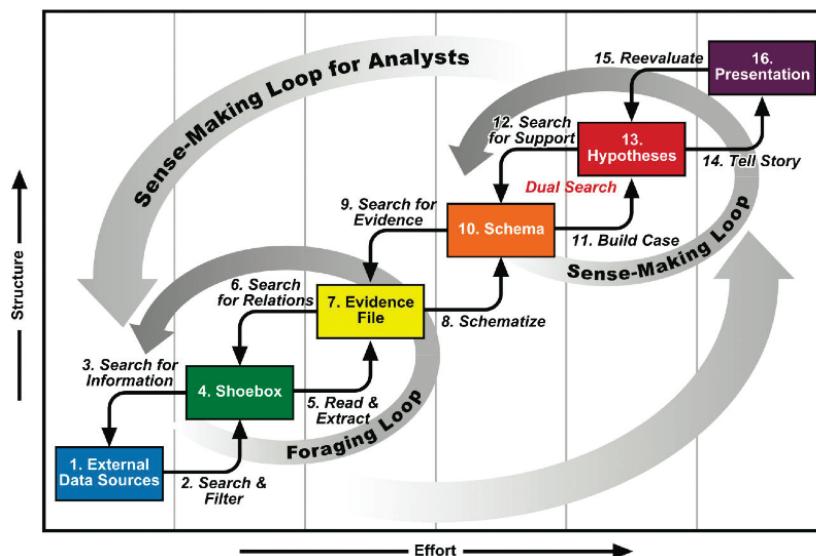
Produce results

- "product"



<http://www.viscenter.uncc.edu/courses/vsanalytics.html>

## Nominal Sense-Making Process



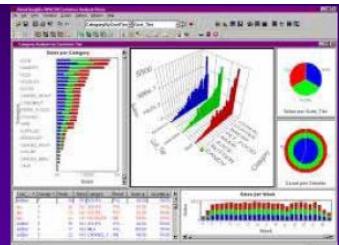
## Reasoning Artifacts

### Elemental artifacts

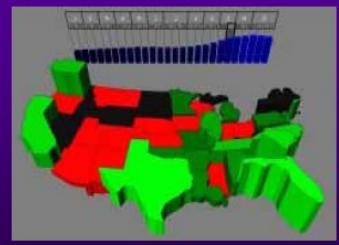
- source intelligence, evidence, assumptions
- Pattern artifacts
  - relationships, temporal and spatial structure
- Higher-order knowledge constructs
  - arguments, causality, models
- Complex reasoning constructs
  - hypotheses, scenarios

*All these become part of the Visual Analytics sense-making (reasoning) process*

## Standard Information Displays



Showing about 50 - 300 data values; 10-20 dimensions



Examples from the VisualInsights WebPage

## Problems With Scalability

Must be scalable to

- number of data points
- number of dimensions
- data sources
- diversity of data sources
- number of users
- diversity of users and tasks
- quality of the data

*Let's have a look at more advanced information displays...*