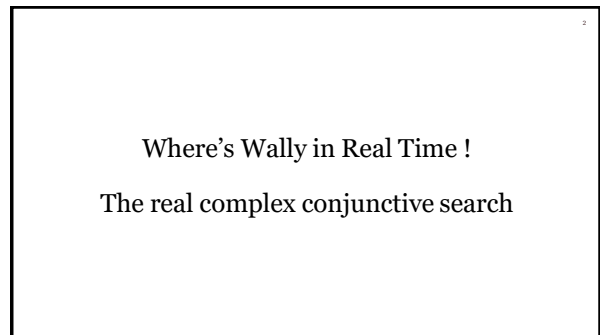
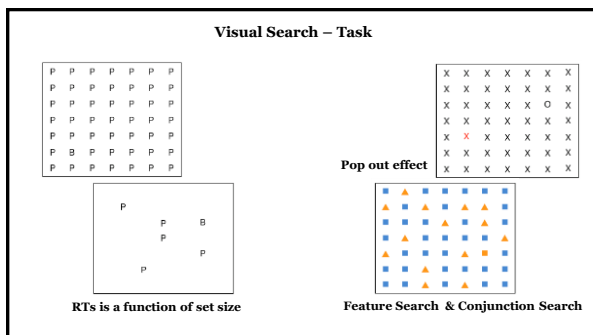


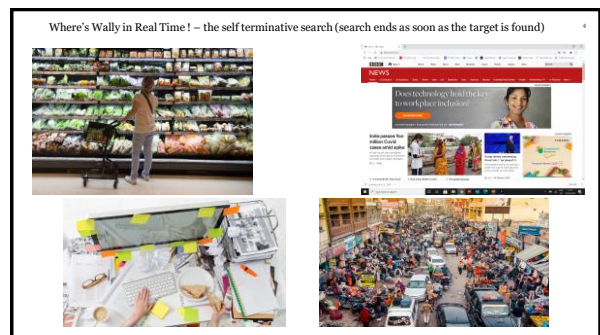
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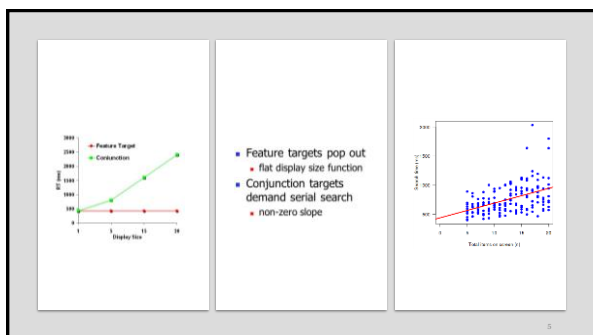
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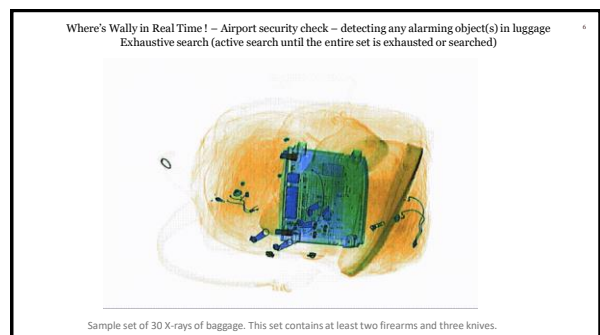
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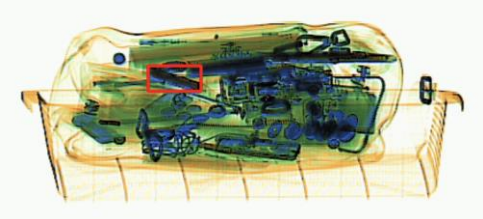


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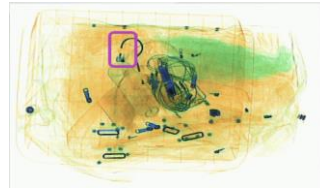
Where's Wally in Real Time! – Airport security check – detecting any alarming object(s) in luggage  
Exhaustive search (active search until the entire set is exhausted or searched)



The "side view" of a very cluttered bag with several dense metallic objects that appear as black or dark blue, including coins, a buckle, a tablet. The tray and bag, low-density and made of organic material, appear as a faint orange. A pocket knife is shown in the red box, which would be very difficult to spot with only a "top" view.

7

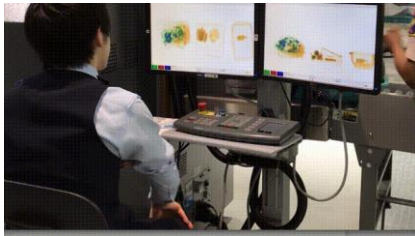
Where's Wally in Real Time! – Airport security check – detecting any alarming object(s) in luggage  
Exhaustive search (active search until the entire set is exhausted or searched)



Some items can blend in much more easily with their surroundings. Pictured is a bag containing a lighter. In Japanese airports, passengers are not allowed to carry more than one lighter onto a plane

8

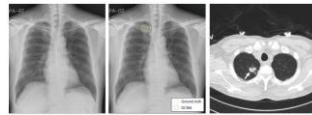
Where's Wally in Real Time! – Airport security check – detecting any alarming object(s) in luggage



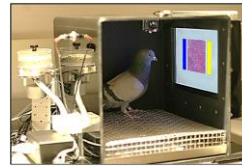
An X-ray security operator screening passengers

9

Where's Wally in Real Time! – Radiologist reading images – detecting and annotating the anomaly



Radiologist screening image for cancer detection in simple versus conjunctive search problem.



Pigeons (*Columba livia*) as Trainable Observers of Pathology and Radiology Breast Cancer Images

Shih-Wei Lo, Elizabeth A. Krupar, Victor W. Swenson, Robert A. McNamee

Department of Pathology and Laboratory Medicine, University of California Davis Medical Center, Sacramento, California; Department of Pathology & Laboratory Medicine, University of California, Davis, California; Department of Pathology, University of California, Davis, California; Department of Pathology, University of California, Davis, California; Department of Pathology, University of California, Davis, California

\* Research in progress, 2014, 2015, 2016, 2017, 2018, 2019, 2020

Abstract

Pigeons and radiologists spend more time looking at and interpreting medical images than any other profession. Pigeons have been shown to be able to detect and classify anomalies in medical images. This paper presents a study of the ability of pigeons to detect and classify anomalies in medical images.

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## Overview

- What is attention? Why it is important?
- What directs our attention? How we decide what to attend?
- Where does attention exist in information processing stream? From perception-to-action loop.
- What happens when we don't attend? Is attention always necessary?
- How it influence perception and other cognitive processing?
- How attention enables multi-tasking?
- How attention disorder impacts everyday behaviour?

11



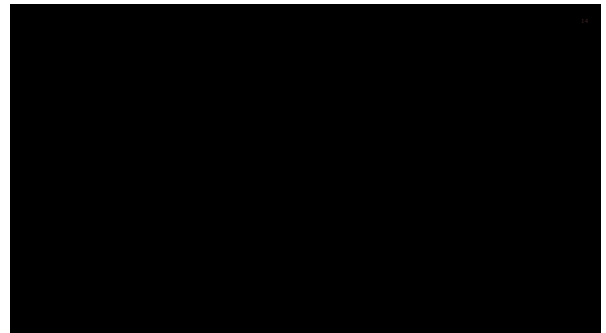
12

13

Let's watch a video

IN FOLLOWING VIDEO – COUNT HOW MANY TIMES  
PLAYERS WEARING WHITE T-SHIRT PASS THE BALL

13



14

15

Wondering how did you FAIL to Notice Gorilla or the other changes?

Task demand, Cognitive Load, but Stress, Fatigue, Motivation, Interest, Knowledge, Belief, Emotion, and Feeling also modulates the filter and central attention

15

16

Millions of items . . . are present to my senses which never properly enter my experience. Why? Because they have no interest for me. My experience is what I agree to attend to. . . . Everyone knows what attention is. It is the taking possession by the mind, in clear and vivid form, of one out of what seem several simultaneously possible objects or trains of thought. . . . It implies withdrawal from some things in order to deal effectively with others.

William James (1842 -1910)  
The first prof. of Psychology at Harvard  
Book, Principles of Psychology, 1890

16

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What is Attention? Selection, Filter, and Focus

Selection and Bottleneck - GATEKEEPER      Selective Focus - SPOTLIGHT

Enable focus on relevant information selectively while ignoring irrelevant information

17

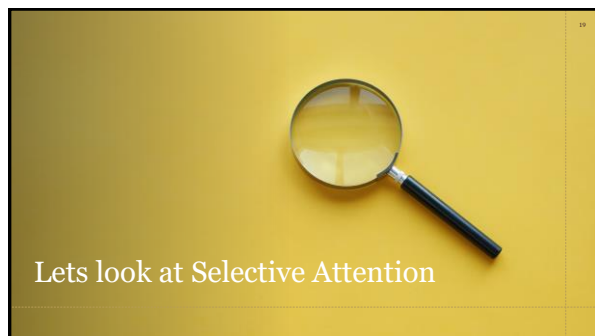
18

What is Attention? Shifting, Alternating, and Dividing – Dual Task

Central Attention / Resource

- Enable dividing your attention to more than one task - multi-tasking / dual task
- We have multiple resources to juggle between tasks
- The efficiency of juggling between task depends on practice, task complexity, stimulus features, task demand, sharing of stimulus features / actions between two tasks

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### Why attention is important ? Influence Perception

- **Inattention Blindness** – Failure to perceive the object that are not the focus of attention
- **Change Blindness** – failure to detect changes to the visual details of a scene

20

Inattention Blindness – Failure to perceive the object that are not the focus of attention

Change Blindness – failure to detect changes to the visual details of a scene

The perceptual process. The steps in this process are arranged in a circle to emphasize that the process is dynamic and continually changing.

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### Why attention is important ? Influence Perception

Feature Integration Theory (Treisman)

Object Perception ↔ Object Recognition

Attentional Spotlight

Master Map of Locations

Color, Orientation, Motion, Curvature, Depth

Feature Maps

Stimulus Pattern (Visual Scene)

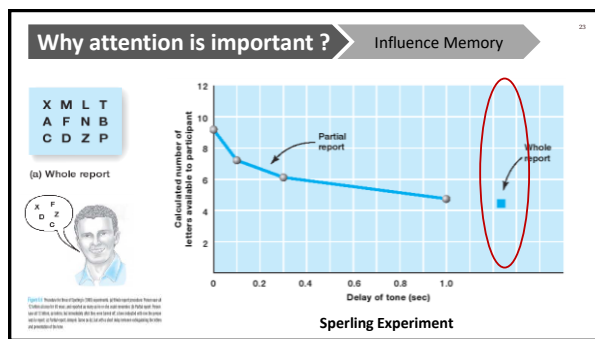
Attention work as a GLUE

When attention fails

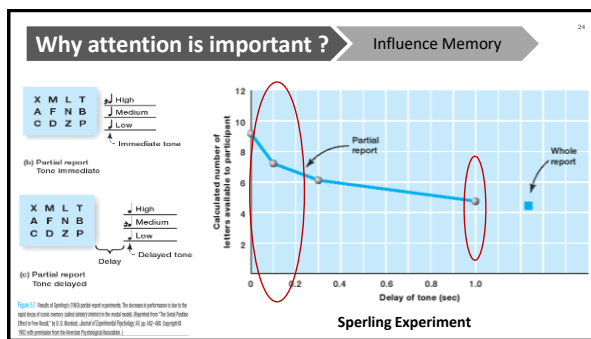
The BINDING PROBLEM

Illusory Conjunction

22

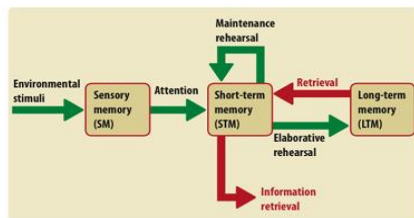


23



24

## Why attention is important ? Influence Memory

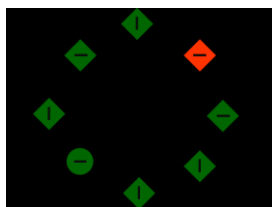


Atkinson and Shiffrin, 1968

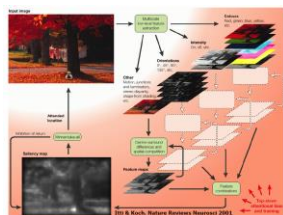
## What directs our attention?



## What directs our attention ? Saliency, Saliency map



An example of attention capture: When participants were instructed to search for green circle they often looked at the orange/red diamond first.



See B. Koch, Nature Reviews Neuroscience 2005.

## What directs our attention ? Knowledge / Schema



There was a main effect of semantic consistency,  $F(1,23) = 6.36, p < .05$ , in that semantically inconsistent objects were fixated for a longer amount of time than objects that were consistent with the semantics of the scene. In addition, we observed a strong effect of the syntactic manipulation,  $F(1,23) = 42.43, p < .01$ , with floating objects looked at longer than objects resting on surfaces. The interaction failed to reach significance,  $F(1,23) = 1.94, p > .05$ .

Similar to the total fixation duration, we observed main effects for both the semantic,  $F(1,23) = 7.07, p = .01$ , and the syntactic manipulation,  $F(1,23) = 29.91, p < .01$ , while the interaction was not significant,  $F < 1$ . Semantically inconsistent as well as floating objects led to a greater number of fixations than semantically consistent objects or objects resting on a surface.

Vo and Henderson, 2009

## What directs our attention ? Goal / Task demand



Ilya Repin, *An Unexpected Visitor*, (1884)

- Participants were asked to look at the painting with different questions in mind.
- The same painting was viewed differently, when asked to attend to different components of the painting.

Yarbus, 1967

## What directs our attention ? Goal / Task demand



Free Examination



Ages of the People

# What directs our attention ?

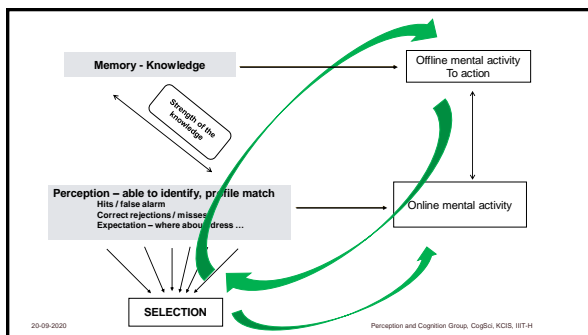
Goal / Task demand

31

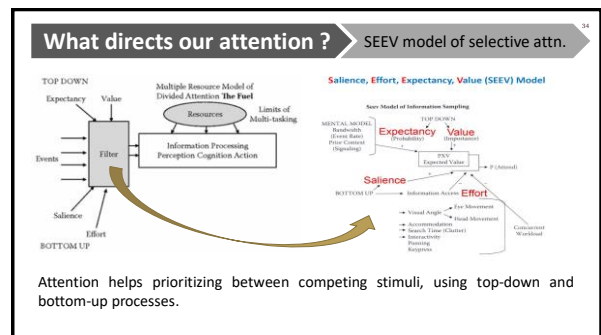
## What directs our attention ?

### ACTIVITY 1 – Visual Search in real time

32




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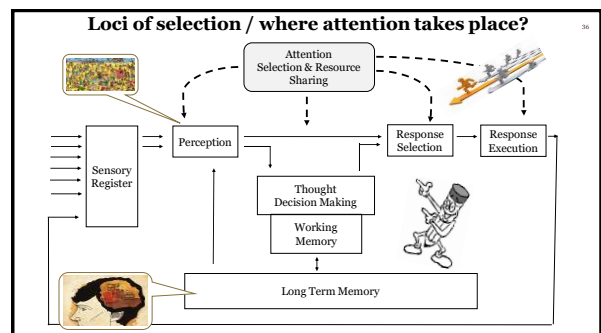


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Where Attention is Located in Information Processing Stream?

A photograph of a map with several pushpins of different colors (green, yellow, blue, red) placed on it, symbolizing attention. The pushpins are scattered across the map, with a red pushpin prominently placed in the lower right foreground. The map shows various geographical features and roads.

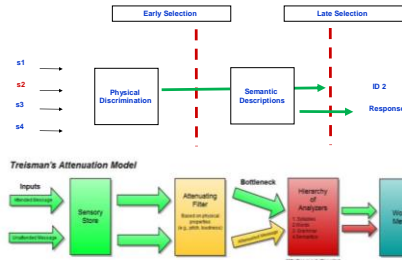
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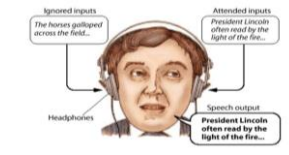


### Loci of selection / where attention takes place?



37

### Loci of selection / where attention takes place?

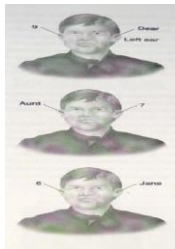


Dichotic listening task (Cherry, 1953)

- Unattended stream – male/female voice, Loudness, strongly emotional words, taboo words
- No meaningful recall of the unattended channel
- Showed Early Selection

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### Loci of selection / where attention takes place?



Dichotic listening (McKay, 1973)

- **Attended stream:** Ambiguous sentence "They were throwing stones at the bank."
- **Unattended stream:** Biasing word "River" or "Money"
- **The biasing word had an effect!** If "money", the ambiguous sentence was more likely interpreted as financial institution

Sentences to recognize :

- They threw stones toward the side of the river yesterday
- They threw stones at the savings and loan association yesterday
- Supporting late selection view

Gray and Wedderburn, 1960

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### Loci of selection / where attention takes place?

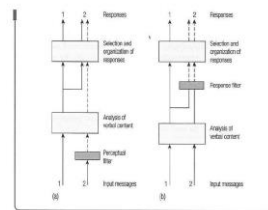
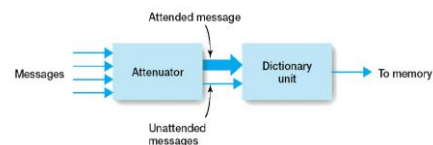


Figure 8.5 Treisman and Gelman's illustration of attentional limitations produced by (a) Treisman's (1958) attenuation theory and (b) Deutsch and Deutsch's (1962) late selection theory. From Treisman & Gelman, 1980. Reprinted by permission of the publisher. © 1987 by the Quarterly Journal of Experimental Psychology.

- How much unattended information is processed?
- How much information is processed before attention?
- Early refers to physical filtering whereas late selection model refers to semantic filtering
- Both are "all or none" processing
- Treisman suggests about attenuation and function as per the task/ stimuli demands – flexible system

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### Triesman's Attenuation model of selection

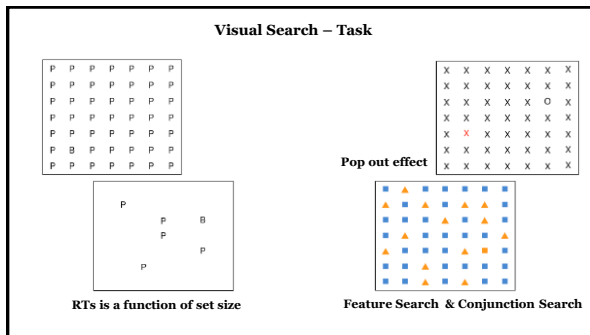


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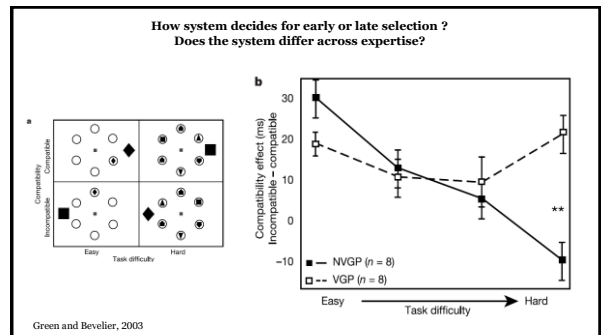
### Where attention takes place?

- How the system decides "where and when" to filter? Or How the system decides for early or late selection?
- Does the system differ across expertise?

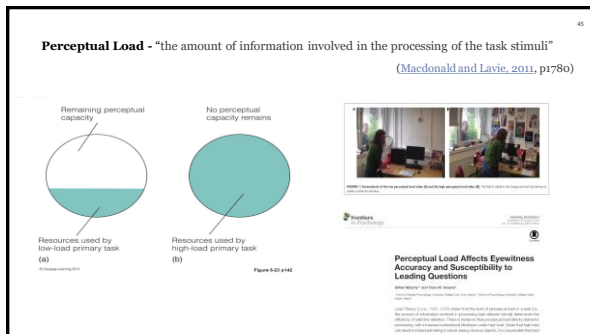
42



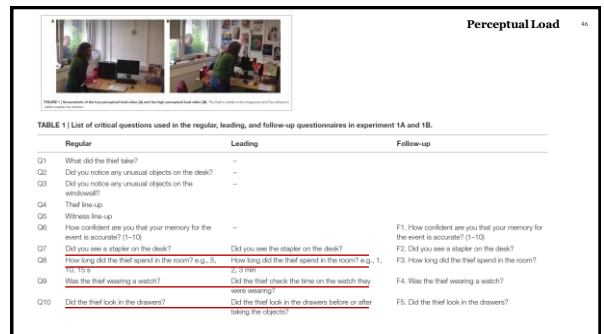
43



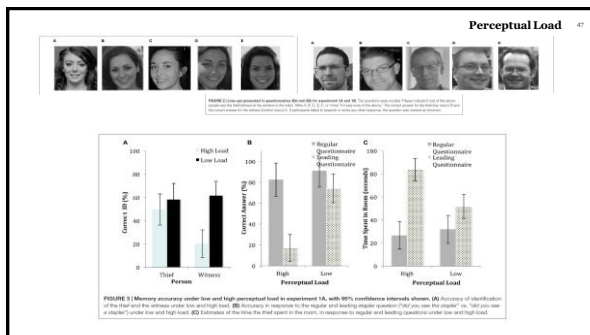
44



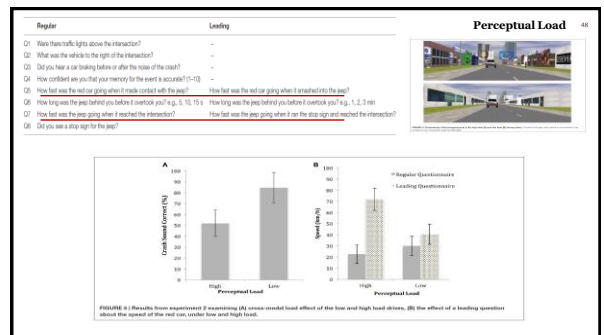
45



46

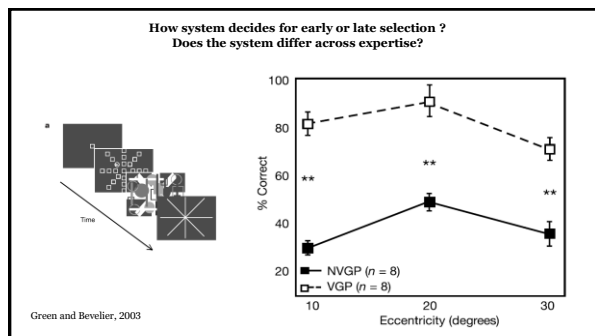


47

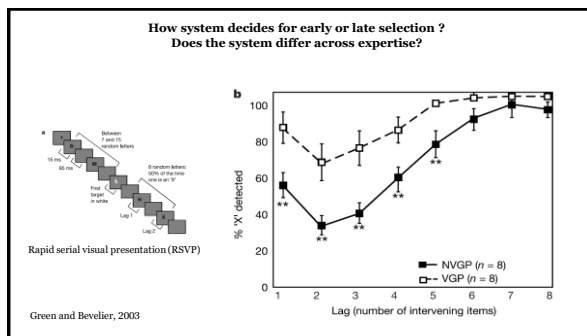


48

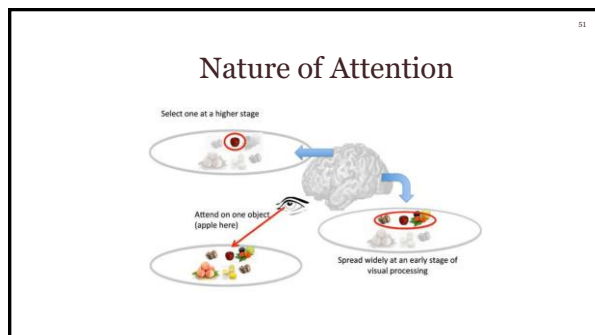




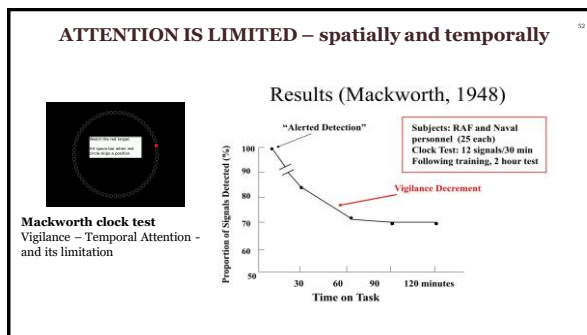
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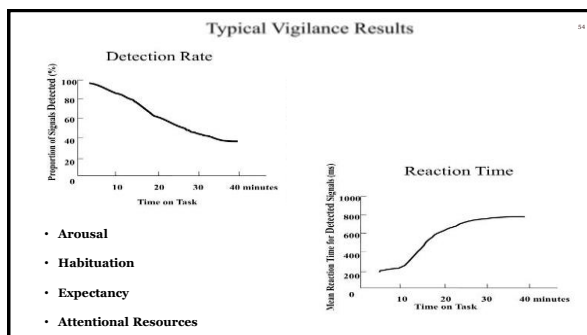
51



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### ATTENTION IS LIMITED – spatially and temporally

55

#### DRIVING – spatially and temporally



A Link Between Attentional Function, Effective Eye Movements, and Driving Ability

Andrew S. Mackenzie  
Temple University and University of St. Andrews

Wen-Hsiung Chang  
University of St. Andrews

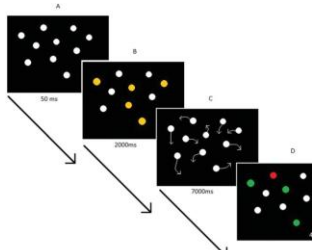
The relationship between attentional function and driving performance is a complex one. This paper reviews the literature on the topic, focusing on the role of attentional function in driving performance. The paper discusses the relationship between attentional function and driving performance, and the role of attentional function in driving performance. The paper also discusses the relationship between attentional function and driving performance, and the role of attentional function in driving performance.

Screenshot images of the typical settings encountered in the (a) country highway, (b) urban area, and (c) motorway. Note the speedometer is located in the top left of the scene, with center rear-view mirror below it and passenger side mirror to the lower left. See the online article for the color version of this figure.

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### ATTENTION IS LIMITED – spatially and temporally

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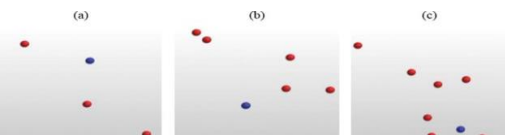


Multiple object tracking task. Participants are presented with the stimuli (A) briefly before five dots begin to flash orange (B). All dots turn back to white and then move randomly around the scene for seven seconds (C). Motion stops and the participant must select the five dots which had flashed orange (D). In this example, the participant has correctly identified four out of a possible five targets. (The final positions of the dots would not be the same as the starting positions as pictured here—this is for illustrative purposes). See the online article for the color version of this figure.

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### ATTENTION IS LIMITED – spatially and temporally

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A static representation of the multiple-object avoidance task. The task starts with three red moving circles (a), then gets increasingly more difficult such as in (b) with five circles and in (c) with seven circles. See the online article for the color version of this figure.

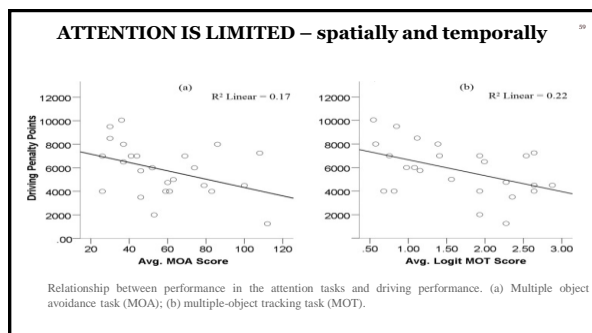
57

### ATTENTION IS LIMITED – spatially and temporally

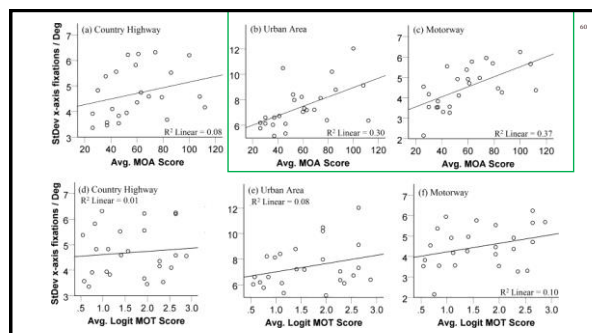
58



58

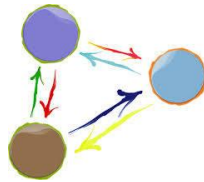


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How it interacts with other  
Cognitive processing?



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What is the scope of attention?  
Scope of Attn. & Emotional Stimuli

Flanker paradigm

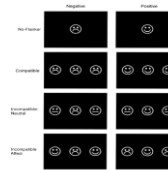


Figure 1. Examples of the stimulus displays used in Experiment 1A.



Responses

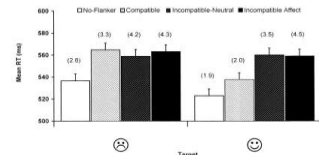
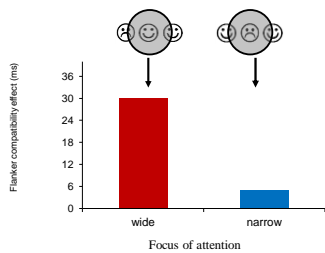


Figure 2. Mean reaction times (RT) for correctly identifying target faces in each flanker condition in Experiment 1A. Error rates for each condition are shown in parentheses. Error bars represent standard errors based on the procedure suggested by G. B. Lofth and Masson (1994) for within-subject designs.

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What is the scope of attention?  
Scope of Attn. & Emotional Stimuli



Fenske & Eastwood (2003)

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What is the scope of attention?  
Scope of Attn. & Perceptual Level



- Global cues produced benefits for both global and local targets over SOA on cued trials.
- Local cues produced benefits only for local targets.
- Scope of Attention can be contracted or expanded using hierarchical/compound stimuli

(Robertson, Egly, Lamb & Kerth 1993)

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Perceptual Level and Emotion & Scope of Attention

Reciprocal interaction between perceptual level and emotion



(Frederickson & Branigan, 2005)



(Srinivasan & Hanif, 2010)

65

What gets Selected?



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### What do we attend?

Cueing Task: Covert and Overt Attention

Fixation (1000ms)

Cue (50ms)

ISI (50 – 150 ms)

1000 -2000 ms

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### Location-based attention

Invalid      +      Valid

Task: Make a response as soon as you detect the target , i.e. a star

Posner, 1980

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### Object-based attention

Invalid – C Different Object      +      A Valid

B Invalid – within object

Task: Make a response as soon as you detect the target , i.e. a star

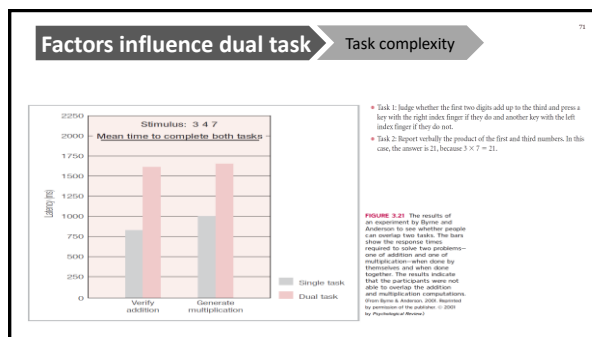
Egley, Rafal and Driver, 1994

69

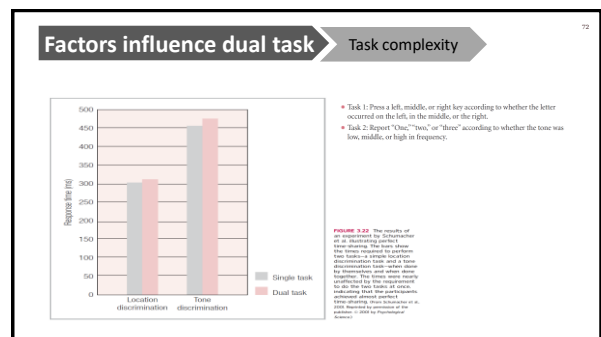
### Let's pay attention to dual or multi-task

#### How do we perform multi-task ?

70



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## How resource sharing occurs?

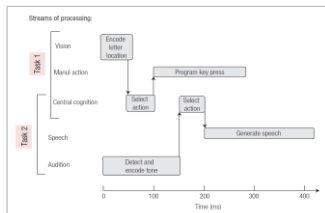


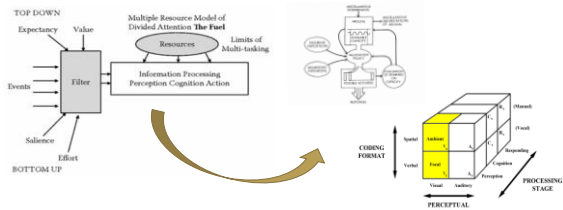
FIGURE 3.22 An analysis of the timing of events in the streams of processing during execution of the dual task in the Schyns et al. (2000) experiment: (1) vision, (2) manual action, (3) central cognition, (4) speech, and (5) audition.

- The figure shows the time and task sharing while performing dual tasks.
- Studies have shown impairment in performance when the two tasks share their encoding, action, or central processing.

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## Model of Attentional Resource

### Single versus Multiple Resource Theory



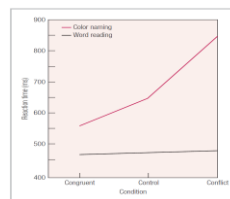
Different attention resources help shifting attention/ switching attention from one task/ concept to another.

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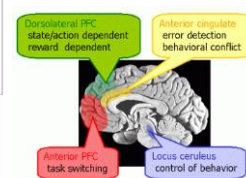
## Automaticity & Control

1 control	2 compatible	3 incompatible
dog	red	red
chair	yellow	yellow
boat	green	green
window	blue	blue
block	red	red
fan	blue	blue
wheel	yellow	yellow
tray	green	green
bottle	blue	blue
fence	red	red

75

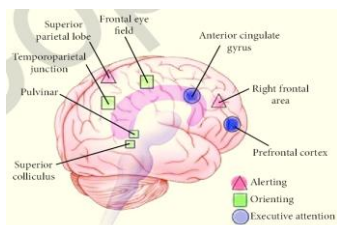


NOTE 3.24 Performance data for the Stroop task. The graph shows that reaction time is lowest for the congruent condition (red word, red ink) and highest for the conflict condition (blue word, red ink). The control condition (blue word, blue ink) shows a moderate reaction time.



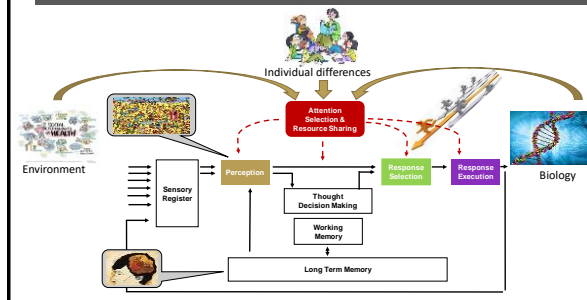
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## ATTENTION as a system – Attention Networks – Posner and Peterson (1992)



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## Locus of Attention and factors that influence attention



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### ATTENTION Is Part of Everyone's Cognitive Architecture

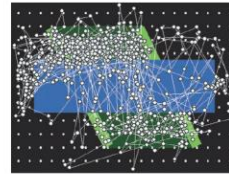


- **Orienting Reflexes:** paying attention to important stimuli and changes in the environment.
- **Novel object** – increases the where and/or what pathway in brain as per the task demands

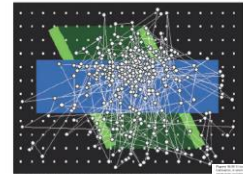
However, the same objects shows decrement in brain activities when they become familiar, because it no-longer capture our attention. This is called as habituation.

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### ATTENTION Is Part of Everyone's Cognitive Architecture



(a) Infants who perceived red as continuing behind the occluder



(b) Infants who did not perceive red as continuing

Figure 10.10: Brain activity maps showing neural connections in infants. (a) Infants who perceived red as continuing behind the occluder. (b) Infants who did not perceive red as continuing.

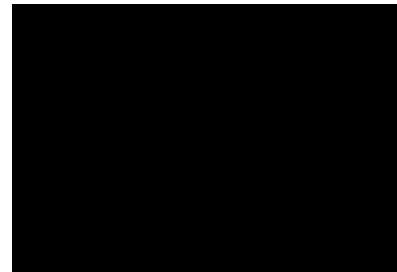
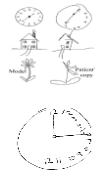
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### Attention Disorder – ADHD and Hemineglect



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### Visual Neglect



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