# ROYAL SOCIETY OPEN SCIENCE

rsos.royalsocietypublishing.org





Article submitted to journal

#### **Subject Areas:**

Behaviour, evolution

#### Keywords:

visual search, optimal behaviour, eye movements

#### Author for correspondence:

Alasdair Clarke

e-mail: a.clarke@essex.ac.uk

# Insert the article title here

Alasdair D. F. Clarke<sup>1</sup>, Jessica L Irons<sup>2</sup>, Warren James<sup>3</sup>, Andrew B Leber<sup>2</sup> and Amelia R Hunt<sup>3</sup>

<sup>1</sup>Department of Psychology, University of Essex, Colchester, UK

<sup>2</sup>Department of Psychology, The Ohio State Universoty, Columbus, USA

 $^3$ School of Psychology, University of Aberdeen, Aberdeen, UK

Some abstract goes here

#### 1. Introduction

Anybody who has ever run a visual search experiment will be aware of the large differences from one participant to the next, and noting their existence is not new [9]. However, these differences are largely ignored and questions about their importance and stability remain relatively under explored.

This seems very relevant [1,2].

Also [12]

In the related field of memory, individual differences have received more attention, for example [13].

In our own work, we have previously shown that there are large differences between individuals in terms of the search strategies used to find a target among distracters. The Adaptive Choice Visual Search (ACVS) paradigm [6] .... Even larger differences were found with the Split-Half Search Arrays [11] who aimed to discriminate between the optimal [10] and stochastic [4] search strategies. They found that while some participants initially searched the displays near optimally, others carried out strategies counter to this, failing to match the performance of the stochastic searcher. Examples of the stimuli are given in Figure 1.

Another example of differences in search strategy comes from the foraging literature [7,8].

© 2014 The Authors. Published by the Royal Society under the terms of the Creative Commons Attribution License http://creativecommons.org/licenses/by/4.0/, which permits unrestricted use, provided the original author and source are credited.

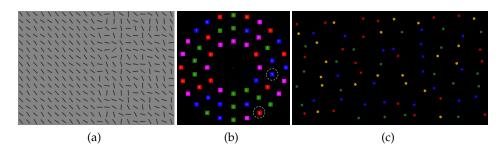


Figure 1. Example stimulus from the (a) split-half, (b) adaptive choice and (c) foraging paradigms

# 2. Methods

# (a) Participants

- We aim to find 64 participants to volunteer to take part in this experiment. Participants will be
- $_{\scriptscriptstyle{5}}$  students from the University of Aberdeen. Some will be compensated with course credit and
- 6 some will be paid £15 for their time. Sample size was determined in part due to constraints with
- counter-balancing; there are 16 different possible orders of tasks/conditions; we will run four
- participants in each order for a total of 64. All participants will sign a form giving informed
- consent. The study has already been approved by the University of Aberdeen Psychology Ethics
- 10 Committee.

27

# (b) Materials and Procedures

The study consists of three different paradigms from the visual search literature in which large individual differences were found [6,8,11]. Example stimuli can be seen in Figure 1.

The display was presented on a 17-inch CRT monitor with a resolution of  $1024 \times 768$ . Stimulus generation, presentation and data collection were controlled by MATLAB and psychophysics toolbox [3] run on a Powermac.

#### (i) Split-half Array Search

Stimuli consisted of arrays of black oriented line segments against a grey background. The target was oriented 45° clockwise, while the distractor items had a random orientation with a mean of 45° anti-clockwise. The variance was low (18°) on one half of the display to create a homogeneous texture, and high (95°) on the other side to create a heterogeneous texture. This means that when the target is present on the homogeneous side of the stimulus, it can be easily be detected with peripheral vision, but when it is in the heterogeneous half, it is much harder to detect. There were a total of 160 trials and homo- and heterogeneous sides of the display were randomly varied from trial to trial.

The position of the dominant eye was recorded using a desktop-mounted EyeLink 1000 eye tracker (SR Research, Canada) sampling eye position at 1000 Hz. This paradigm was carried out twice to give us an estimate of how consistent participants are in their search strategy over time. The two sessions were identical.

#### (ii) Adaptive Choice Visual Search

The ACVS was based on the task described in [6], with a few changes [Or identical to the task described in Experiment 1 of Irons & Leber, in press by then hopefully].

Each search display was composed of 54 small squares (size? What was viewing distance & screen size?) arranged in three concentric rings around fixation, with 12, 18 and 24 items in

the inner, middle and outer rings respectively. The inner ring was  $XX^{\circ}$  and the outer ring was  $XX^{\circ}$  from fixation. Of the 54 squares, 13 were red, 13 were blue, 14 were green and 14 were âĂIJvariableâĂİ. Variable distractors changes colors afrom trial-to-trial according to a cyclical pattern: the distractors would be red for 5 trials (called a âĂIJred plateauâĂİ), then across a period of 7 trials, they would change color from almost red to magenta (at the 4th trial in the transition) to almost blue (see [5], for the specific color values? Or supplemental?). The variable distractor would then be blue for 5 trials (blue plateau), and then transition back from almost blue through magenta to almost red. This 24-trial cycle would repeat throughout the entire experiment.

A white digit appeared inside each square. Two targets âÅŞ a red square and a blue square each with a digit between 2 and 5 âÅŞ were embedded in every search display. The two target digits were always different, to enable us to distinguish the chosen target. The remaining red, blue and variable squares all contained digits between 6âÅŞ9. Green squares could contain any digit between 2-9. The location of the targets and distractor within the search display were randomized on each trial.

Participants were informed that the search displays would contain two targets on every trial, that they need only find one target on each trial and that they were always free to search for either one. A trial began with a 1.5s ITI containing a central fixation cross, followed by the search display until a response was made. Participant responded by pressing a key that corresponded to the digit inside the target (V, B, N and M keys corresponding to 2, 3, 4 and 5 respectively). Participants completed 10 practice trials, followed by 3 blocks of 96 trials. Each block started on a red plateau.

#### (iii) Conjunction Foraging

47

48

51

58 59

71

74

The foraging task was based on [8] and [7]. Participants completed the feature foraging and conjunction foraging tasks on separate days, with the order counterbalanced (was it counterbalanced?).

In the feature foraging task, search displays contained 80 small circles (size), 20 red (RGB: 180, 0, 0), 20 green (RGB: 20, 100, 40), 20 blue (RGB: 0, 0, 220) and 20 yellow (RGB: 200, 150, 0), presented against a black background. Stimuli were arranged in a 10 x 8 grid, but the position of each item within the grid space was jittered to create a more random spatial arrangement (with the restriction that two items could not be within 30 pixels of each other). The location of item colours to grid locations was completely randomized. For half of the participants, targets were red and green circles, and for the other half of participants, targets were blue and yellow circles. Participants were asked to collect all of the targets within a trial by using the mouse to click on each target. Clicking on a target caused it to disappear from the display. If the participant clicked erroneously on a non-target, the trial was immediately ended and a replacement trial was begun. Participants completed 1 practice trial and 20 full-completed experimental trials.

In the conjunction foraging task, search displays were composed of both circles and squares. For half of the participants, the shapes were red and green (equal numbers of red circles, red squares, green circles and green squares), and for the remaining participants the shapes were blue and yellow. Targets were defined by conjunctions of color and shape (e.g., red squares and green circles, with red circles and green squares as distractors). The assignment of targets and distractors was counterbalanced across participants (was it?). The procedure was otherwise identical to the feature foraging task.

### (c) Planned Analysis

# 79 (i) Split-half array search

In order to characterise an individual's behaviour in this task, we will compute the proportion of the first n fixations that were on heterogeneous (difficult) side of the stimuli, over all target absent trials<sup>1</sup>. [11] demonstrated a strong correlation between an this metric (for n = 5) and reaction <sup>1</sup>Only take correct trials?

times (r = .53). However, a re-analysis of their data shows that an even stronger correlation is obtained with n = 3.

#### 85 (ii) Attentional Control

- Participants with accuracy more than 3 SD below the group mean were excluded from analyses. For RT analyses, trials with RTs less than 300ms or more than 3 SD about the participantâĂŹs mean were excluded.
- Two measures of individual strategy use were used: 1) Optimal choices, defined as percent of plateau trials in which the individual chose the optimal target (i.e., the target with the fewest distractors. When the variable distractor was red, the optimal choice was blue, and vice versa), and 2) Switch rate, the percent of trials in which the individual switched target colour (i.e., the colour chosen on trial N was different to the colour chosen on trial N-1).

#### (iii) Conjunction Foraging

Only completed, accurate trials were analysed. RTs were defined across the entire trial (i.e., from the start of the trial until the final target was collected). The main measure of interest was average run length per trial. A run was defined as a succession of one or more of the same target type, which was followed and preceded by the other target or no target. The average run length was the average number of target selections in a run.

# (d) Exploratory Analysis

We will carry out additional analysis, above and beyond what has been documented above, but the exact nature of this will be contingent on the nature of the results. Something like PCA may be interesting.

#### 3. Results

112

113

120

121

122

# (a) Split-half Array Search

Our results are broadly in line with [11]. The correlation between accuracy and reaction times between the two sessions is shown in Figure 2(a, b). We can clearly see that there are large differences from one participant to the next in terms of both the proportion of hard targets found, and reaction times. Furthermore, test-retest reliability appears to be reasonable, with correlations of around r = 0.78 (the value of r = 0.71 or easy targets is slightly lower, likely due to the restricted range).

We can also look at the initial search strategies adopted by our participants 2(c, d). Again, we see large and stable individual differences across the two sessions. More importantly, as with [11], we see that the search strategies give a good correlation with reaction times.

## (b) Adaptive Choice

(i) Conjunction Foraging

# 4. Discussion

### References

1. Walter R Boot, Ensar Becic, and Arthur F Kramer. Stable individual differences in search strategy?: The effect of task demands and motivational factors on scanning strategy in visual search. *Journal of Vision*, 9(3):7–7, 2009.

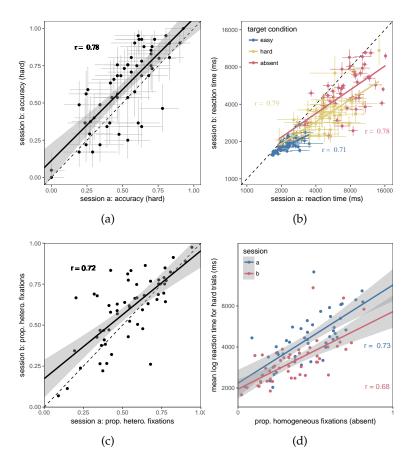


Figure 2. Correlation between the two sessions of the split-half paradigm for (a) accuracy (TP-heterogeneous), (b) reaction times and (c) search strategy. (d) initial search strategy correlates with reaction times in both sessions. Each point represents a participant and the error-bars indicate 95% confidence intervals.

- 2. Walter R Boot, Arthur F Kramer, Ensar Becic, Douglas A Wiegmann, and Tate Kubose. Detecting transient changes in dynamic displays: The more you look, the less you see. Human Factors, 48(4):759-773, 2006.
- 3. David H Brainard. The psychophysics toolbox.

123

124

125

126

127

128

129

130

131

132

133

134

135

136

137

138

139

141

Spatial vision, 10:433-436, 1997.

- 4. Alasdair DF Clarke, Patrick Green, Mike J Chantler, and Amelia R Hunt. Human search for a target on a textured background is consistent with a stochastic model. Journal of vision, 16(7):4-4, 2016.
- 5. Jessica Irons and Andrew Leber.
  - A trade-off between performance and effort in the choice of attentional control settings. *Journal of Vision*, 17(10):1293–1293, 2017.
- 6. Jessica L Irons and Andrew B Leber.
  - Choosing attentional control settings in a dynamically changing environment. Attention, Perception, & Psychophysics, pages 1–18, 2016.
  - 7. Ómar I Jóhannesson, Ian M Thornton, Irene J Smith, Andrey Chetverikov, and Arni Kristjánsson.
    - Visual foraging with fingers and eye gaze. i-Perception, 7(2):2041669516637279, 2016.
  - 8. Árni Kristjánsson, Ómar I Jóhannesson, and Ian M Thornton.
- 142 Common attentional constraints in visual foraging. 143

- PloS one, 9(6):e100752, 2014.
- 9. Norman H Mackworth.
  - The breakdown of vigilance during prolonged visual search.
- Quarterly Journal of Experimental Psychology, 1(1):6–21, 1948.
- 10. Jiri Najemnik and Wilson S Geisler.
- Eye movement statistics in humans are consistent with an optimal search strategy. Journal of Vision, 8(3):4–4, 2008.
- 11. Anna Nowakowska, Alasdair D F Clarke, and Amelia R Hunt.
- Human visual search behaviour is far from ideal.
  - Proceedings of the Royal Society B: Biological Sciences, 2017.
- 154 12. Michael J Proulx.

153

- Individual differences and metacognitive knowledge of visual search strategy.
  PLoS One, 6(10):e27043, 2011.
- 13. Kenith V Sobel, Matthew P Gerrie, Bradley J Poole, and Michael J Kane.
  Individual differences in working memory capacity and visual search: The roles of top-down and bottom-up processing.
- 160 Psychonomic Bulletin & Review, 14(5):840–845, 2007.