Color and Spatial Cueing in Low Prevalence Visual Search

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Running Title: Color and Spatial Cueing in LP Search

Abstract

In visual search, 30-40% of targets with a prevalence rate of 2% are missed, compared to 7% of targets with a prevalence rate of 50% (Wolfe, Horowitz & Kenner, 2005). This 'Low Prevalence' (LP) effect is thought to occur as participants are making motor errors, changing their response criteria and/or quitting their search too soon. We investigate whether color and spatial cues, known to improve visual search when the target has a high prevalence (HP), benefit search when the target is rare. Experiment 1 and 2 showed that although knowledge of the target's color reduces miss errors overall, it does not eliminate the LP effect as more targets were missed at LP than at HP. Furthermore, detection of a rare target is significantly impaired if it appears in an unexpected color – more so than if the prevalence of the target is high (Experiment 2). Experiment 3 showed that, if a rare target is exogenously cued, target detection is improved but still impaired relative to high prevalence conditions. Furthermore, if the cue is absent or invalid, the percentage of missed targets increase. Participants were given the option to correct motor errors in all three experiments, which reduced but did not eliminate the LP effect. The results suggest that although valid color and spatial cues improve target detection, participants still miss more targets at LP than at HP. Furthermore, invalid cues at LP are very costly in terms of miss errors. We discuss our findings in relation to current theories and applications of LP search.

Introduction

In everyday life, people frequently perform visual search tasks, such as searching for a car in a car park or keys on a cluttered coffee table. Scientists study how well people perform these search tasks, in the laboratory, by asking participants to search for a pre-specified target among distractor items and recording their reaction times (RTs) and error rates. Although RTs can vary depending on the difficulty of the search display (e.g. Treisman & Gelade, 1980), for the most part, error rates are low (typically less than 10%, Wolfe, 1998). Recent research has shown that the frequency, or prevalence, of the target has an interesting effect on the number of errors made. Wolfe, Horowitz and Kenner (2005) found that miss errors (stating that a target is absent when it is physically present) rose from 7% to 30% when the prevalence rate of the target dropped from 50% ('high prevalence') to 2% ('low prevalence'). This increase in miss errors with a decrease in target prevalence is known as the Low Prevalence (LP) effect. The LP effect has been replicated on several occasions with both complex and simple stimuli (e.g. Fleck & Mitroff, 2007; Rich, Kunar, Van Wert, Hidalgo-Sotelo, Horowitz, & Wolfe, 2008; Kunar, Rich & Wolfe, 2010; Wolfe et al., 2007 and Van Wert et al, 2009) and is also found to be robust across a large number of experimental designs (e.g. Wolfe et al., 2007, Rich et al., 2008, Kunar et al., 2010, although see Navalpakkam, Koch & Perona, 2009, who found increasing a participant's expected reward outcome reduced the LP effect).

Several theories have been put forward for why the LP effect occurs. Wolfe et al. (2007) found that RTs were reduced at low prevalence. On face-value, this could appear to indicate a speed-accuracy trade-off, where participants were merely responding too quickly without appropriately searching for the target. Some support to this account is shown by Fleck and Mitroff (2007) who introduced a correction facility to their experiments, in which participants were able to correct any mistakes during a previous trial. The aim of this manipulation was to help correct the errors of participants who may have either accidentally entered the wrong response or identified the target too late to suppress their 'absent' reaction (indicating a motor error). Indeed, Fleck and Mitroff (2007) obtained a low prevalence effect before the correction was included but this effect was removed when participants were given the option to correct their mistakes (although, see Kunar, Rich & Wolfe, 2010, and Van Wert et al., 2009, who found that the LP effect was reduced but not removed after self-correction). These results were attributed to the elimination of "errors in action" – finding the target but responding hastily (p. 943) – and not "errors of perception" – simply failing to find a target at low prevalence (p. 943).

Although part of the LP effect may occur due to these motor errors, further research suggests that the LP effect cannot be entirely explained by a simple speed-accuracy trade-off. Wolfe et al. (2007) slowed participants' responses by alerting them if they were responding too quickly. If the increase in miss errors was due to participants responding prematurely, then asking participants to slow down should eliminate the LP effect. However, asking participants to respond more slowly did not improve target detection. Neither did forcing participants to wait a minimum period before responding (Rich et al., 2008). In complex search tasks, a simple speed-accuracy trade-off account cannot explain the full range of data.

Another way to examine the LP effect is with signal detection theory (SDT). SDT uses hit rates and false alarms to calculate participants' sensitivity (d') and decision criterion (c) to better understand why the LP effect occurs. At low prevalence, people could either be less sensitive to target detection or, with a vast increase in target-absent trials, less willing to decide that a display contains a target. Using this measure, Wolfe et al. (2007) and Van Wert et al. (2009) showed little effect of prevalence on sensitivity but instead found that, with low prevalence targets, participants adopted a more conservative criterion. That is, when the target is rare, observers are more likely to adopt a criterion that is biased to respond to a display as 'target-absent'. Wolfe and Van Wert (2010) have since proposed a two-stage model of LP search. In this account, they suggest that under low prevalence conditions both the decision criteria and the quitting threshold change so that participants are less willing to respond that an item is a target and also terminate their search sooner than when the target has a high prevalence.

Investigating low prevalence search is important as it occurs in a number of applied settings, for example, detecting tumors in mammograms (Leung et al., 2007; Fenton et al., 2007) and detecting prohibited items at airport security checkpoints (e.g. Rubenstein, 2001). Taking this latter search task, in order to try and minimize miss errors, computer algorithms are applied to screened images to help officers identify targets ('screener assistant technology', Parks, 2007). One technique assigns particular colors to items made of different materials, with the premise that screeners will be able to identify certain items more easily. For example, metallic objects, appear in blue (Evans, Wang, Chan, Downes & Liu, 2006). Thus, when searching for a knife, screeners restrict their search to the blue items. Another technology cues specific areas which are likely to contain a threat and which the screener should pay attention to (Bretz, 2002; Guardian Technologies International, 2008). This cue takes the form of an exogenous red box which outlines potentially suspicious items.

Intuition would suggest that these cues have a beneficial effect on LP search. For example, color is known to be a useful tool in visual search. Egeth et al. (1984) and Wolfe et al. (1989) found that people use color to guide their search to a subset of items and away from distracting stimuli. Color cues can also help guide saccades (e.g. Hannus et al., 2006, Luria & Strauss, 1975, Motter & Belky, 1998, Williams & Reingold, 2001) and the use of color has been implemented in a number of search models (e.g. Itti & Koch, 2000, Wolfe, 2007, Zelinsky, 2003, 2008). Michel, Koller, Ruh and Schwaninger (2007) also found that color is an effective tool for baggage screening tasks at high prevalence. Given this evidence, one would think that adding color to the display may help participants find LP targets. However, other evidence suggests that this may not necessarily be the case. One of the reasons why color improves target detection is that it, in part, increases sensitivity (or d') to that target (see Eckstein et al., 2000 and Verghese, 2001, for evidence of signal detection in visual search). However, if the low prevalence effect is a result of a criterion shift rather than a change in d' (as suggested by Wolfe et al., 2007), then adding color to the display may not help in LP conditions. We investigate this in Experiment 1.

Experiments 2 and 3 investigate how LP search is affected by both valid and invalid cues. The algorithms used in screener assistant technologies are designed to highlight potential target colors or locations; however, they are fallible in that the target may appear in an unexpected color (for example, a non-metal knife would not appear in the color blue) or outside the cued area. Furthermore, the algorithm may not detect the presence of a target at all. From previous visual search tasks, we know that validly cueing the target location improves target detection (e.g. Corbetta et al., 2000, Posner, 1980, Posner & Cohen, 1984). This is particularly true of exogenous cues, which are thought to automatically cue a target's location regardless of the goal state of the participant (e.g., Jonides, 1981, Remington, Johnston & Yantis, 1992, Theeuwes, 1992). Invalid cues, however, may introduce a cost to search behavior (Corbetta et al., 2000, Posner, 1980, Posner & Cohen, 1984). The effect of invalid cues becomes even more important at low prevalence as the potential cost of missing a rare target in an applied setting has serious implications (e.g. missing a weapon in screened baggage at an airport security checkpoint). Experiments 2 and 3 investigate the benefits of having the target appear in an expected color or being cued by a valid exogenous cue (a red box), while also recording the costs when these cues are invalid. To preview the results, both color and exogenous cues aid target detection if they are valid, however miss errors are dramatically increased at LP on invalidly cued trials.

Of final note, the experiments here investigate how effective valid cues are under LP conditions. Previous work has suggested that search behavior under low prevalence conditions differs to that under high prevalence conditions. For example, visual cues separating a search display across space and time, often helpful in search at high prevalence, fail to benefit search at low prevalence (Kunar et al., 2010). Furthermore, features that are trivially easy to find at high prevalence are missed more often at low prevalence (Rich et al., 2008). This then leads to the interesting question: are cues that are useful at HP also useful at LP? There are three possible outcomes. First, color and spatial cues that help HP search do not provide any benefit under LP conditions. There is some precedent in this as other experiments have shown that both temporal and spatial cues do little to reduce the LP effect (Kunar et al., 2010). Please note, however, that the temporal/spatial cues used by Kunar et al. (2010) only served to reduce the area to be searched at any given time and so were not used to highlight the target's location/features. Second, having the target appear either in a known color or in a cued area will eliminate the LP effect, so that miss errors at LP are the same as that at HP. For example, as the red box cue in Experiment 3 is highly salient and captures attention, then any target falling inside the cue will be found with equal ease, regardless of its prevalence. Third, having the target appear in a cued area or color will reduce the LP effect, but not eliminate it. In this case, search performance would be improved with the addition of the cue but miss errors would still be higher at LP than at HP. Here, the benefit of cueing the target would be constrained by target prevalence. To preview the results further, the data suggest that this latter option is correct. These results have implications for the use of cues in low prevalence search.

Experiment 1

Experiment 1 investigated whether searching for a target of a known color improved target detection within LP search. That is, do color cues, which aid search at high prevalence, also benefit search when the target has a low prevalence?

Method

Participants.

Ten participants (M = 21.9 years, SD = .86 years, 4 female) were recruited from the University of Warwick. Each received £6/hour remuneration. Informed consent was obtained and all had normal or corrected-to-normal vision.

Stimuli and Procedure.

The experiment was programmed using Blitz3D and presented on a PC. The stimuli were rotated Ts and Ls. Each stimulus had a visual angle of 1.7 degs x 1.7 degs at a viewing distance of 57 cm and the vertical lines of the Ls were slightly offset from its horizontal line (see Figure 1). All stimuli were presented on a grey background. On each trial, there were always 12 stimuli presented (on ‘target present’ trials – 11 distractors and 1 target; on ‘target absent’ trials – 12 distractors).

Figure 1 about here

There were four blocks of trials: two high prevalence conditions – one with white stimuli and one with color stimuli – and two low prevalence conditions – one for white stimuli and another for color stimuli. Participants completed all four conditions in one session. In the color blocks, four of the stimuli were red, four were green and four were blue. For each participant, in the color blocks, the color of the target was always the same and told to the participant before the experiment. The order of the blocks was randomized as was the assigned target color each participant was given in the color blocks.

To begin each trial, a blank screen appeared for 500 ms and was followed by a central fixation point for 500 ms. Stimuli were then presented randomly within an invisible 6 x 6 matrix. The target was a ‘T’ and was presented on either 2% (low prevalence) or 50% (high prevalence) of trials. The distractor items were offset L shapes. All stimuli were presented randomly in one of four orientations (0 degs, 90 degs, 180 degs or 270 degs) with equal probability. Participants were asked to indicate whether the target was ‘present’ or ‘absent’ by pressing either the ‘m’ or the ‘z’ key respectively. Participants were instructed to respond as quickly but as accurately as possible. If no response was made within 10 seconds, the trial ‘timed-out’ and the next trial automatically started. Following a response or ‘time-out’, the blank screen was again displayed before the next fixation point and trial.

In line with Fleck and Mitroff (2007), and to correct for motor errors, participants had the option of correcting their response to a trial during the succeeding trial. If a participant recognized that they had made an error, they were able to correct it on the following trial, by pressing the ‘Escape’ key. They would then proceed with the current trial as normal. No feedback was given after any response or correction was made.

For each of the high prevalence conditions, where the target was present 50% of the time, there were 80 trials (40 present and 40 absent). For each of the low prevalence conditions, where the target was present 2% of the time, there were 1000 trials (20 present and 980 absent). Participants were given a block of 20 practice trials before each experimental block. RTs and error rates (both the initial error made and the corrected errors, if participants pressed the 'Escape' key) were recorded. Breaks were given every 200 trials

Results and Discussion

RTs less than 200 ms and greater than 5000 ms were removed as outliers. This led to the removal of 1% of the data at high prevalence and 1.63% of the data at low prevalence. The remaining error rates were arcsine transformed (both here and in all subsequent experiments) prior to analysis to compensate for unequal variances present in binomial data (Hogg & Craig, 1995). Values reported and plotted in the figures are the back-transformed means. Following the trend in the literature, false alarm rates (where participants responded 'target present' when the target was absent) were low (less than 1.6% in all experiments) and are not reported further. There are a number of possible statistics that we could report but to save journal space we will only report the findings related to the question at hand. Our primary interest was what happens to miss errors at low prevalence. Miss errors, for Experiment 1, are shown in Figure 2. Independent *t*-tests showed that there was no difference depending on which color target participants searched for (all *t*s < 2.4, *p*s > .07). As such, all data were pooled for analysis.

Errors

Initial Errors. A repeated-measures ANOVA on the initial miss errors, with factors of Prevalence (High or Low) and Color (White or Colored), showed that there was a main effect of prevalence, where there were more miss errors at low prevalence (LP) than at high prevalence (HP), $F(1, 9) = 49.67$, $p < 0.01$. There was no main effect of color, neither was there a significant Prevalence x Color interaction.

Figure 2 about here

Corrected Errors. Looking at the miss errors after participants were given the option to self-correct, there was again a main effect of prevalence. $F(1, 9) = 22.75$, $p < 0.01$, and a main effect of color, $F(1, 9) = 9.41$, $p < 0.05$. There were more miss errors at LP than at HP, and there were fewer miss errors in the color condition than in the white condition. The Prevalence x Color interaction was not significant.

The option to self-correct reduced the number of observed miss errors. Error rates were lower after correction in all conditions (*t*s > 2.7, *p*s < .03). For example, looking at the difference in LP trials, miss errors were reduced by 8% in the White condition and 19% in the Color condition after self-correction. This reduction suggests that some of the LP miss errors were likely to be due to errors in motor responses (Fleck & Mitroff, 2007). However, although the LP effect was reduced after self-correction, it was not eliminated, as miss rates were still higher in the LP conditions than in the HP conditions (26% vs 6%, respectively). This supports previous findings that, with non-trivial searches, miss errors arise from more than just motor errors (Kunar, Rich & Wolfe, 2010; Rich et al., 2008; Van Wert et al., 2009).

<u>Sensitivity (d’) and Response Criterion (c)</u>

'False Alarm' and 'Hit' data were used to calculate whether the LP effect occurred due to a change in d' (reflecting a change in sensitivity) or c (reflecting a criterion shift). Table 1 shows the d' and c values for each condition.

Initial d'. A repeated-measures ANOVA on the initial d', with factors of Prevalence (High or Low) and Color (White or Colored), showed that there was no main effect of prevalence nor a main effect of color. The Prevalence x Color interaction was not significant.

Corrected d'. Analysis of the corrected d' data showed that there was no main effect of prevalence ($F < 2.44$, $p = 0.15$). However, there was a main effect of color, $F(1, 9) = 7.27$, $p = .025$. D' was greater in the Color condition compared to the White condition. There was no Prevalence x Color interaction. Sensitivity in search was greater overall when participants could use color to help find the target.

Initial criterion. A repeated-measures ANOVA on the initial criterion, with factors of Prevalence (High or Low) and Color (White or Colored) showed there to be a main effect of prevalence, $F(1, 9) = 260.70$, $p < .001$. Similar to previous work, criterion was more conservative at LP than at HP (see also Van Wert et al., 2009; Wolfe et al., 2007). There was no main effect of stimuli color and no significant Prevalence x Color interaction.

Corrected criterion. Analysis of the corrected criterion data showed that there was a main effect of prevalence, $F(1, 9) = 50.27$, $p < .001$, where participants were more conservative at LP than at HP (see also Van Wert et al., 2009; Wolfe et al., 2007). There was also a main effect of stimuli color, $F(1,9) = 9.21$, $p = .014$, where criterion was more liberal for the Color condition than the White condition. The Prevalence x Color interaction was not significant.

The results of Experiment 1 concur with previous findings in the literature. Overall, there was little effect of prevalence on d'. However, criterion became more conservative at LP (see also Wolfe et al., 2007 and Van Wert et al., 2009). In addition, there was a beneficial effect of color on d' and c. Participants were more sensitive to detection of a colored target than a non-colored target and more willing to respond target present in the color condition. This benefit in d' and criterion for color stimuli supports the general understanding that color aids response to a target in visual search (Egeth, Virzi & Garbart, 1984; Treisman & Gelade, 1980; Wolfe, Cave & Franzel, 1989).

Table 1 about here

RTs

Reaction times for correct trials were analysed (based on a participant's initial response) and are shown in Table 2. As previously reported by Wolfe et al. (2007), RTs for correct target-absent trials (correct rejections) were considerably quicker at low prevalence. A repeated-measures ANOVA on RTs for correct rejections, with factors of Prevalence (High or Low) and Color (White or Colored), showed a main effect of prevalence, $F(1, 9) = 16.30$, $p < 0.01$, where RTs were significantly quicker at LP than at HP, and a main effect of color, $F(1, 9) = 65.41$, $p < 0.01$, where RTs for the Color condition were faster than those for the White condition. The Prevalence x Color interaction was also significant, $F(1, 9) = 11.11$, $p < 0.01$. There was a greater difference in RTs between the HP and LP conditions for the White condition compared to the Color condition.

Table 2 about here

In contrast, RTs for 'hits' (correct target-present trials) were slower at LP than at HP, as indicated by a main effect of prevalence, $F(1, 9) = 8.64$, $p < 0.05$. This is similar to the data reported by Wolfe et al. (2007). Furthermore, there was a main effect of color, $F(1, 9) = 28.88$, $p < 0.01$. RTs for the color stimuli were quicker than those for the white stimuli. There was no Prevalence x Color interaction. The Reaction Time data for Experiment 1 followed the general pattern found in the LP literature, where there is a speeding of target-absent trials at LP. The same general pattern was also found in Experiments 2 and 3. As such, although we report these data in the following experiments, we do not discuss them further.

To investigate whether the elevated miss errors at LP were due to a speed-accuracy trade-off, we calculated the difference between HP and LP RTs for correct target absent trials. This RT difference provided a measure of speed by showing how much faster participants were at LP compared to HP (the larger the difference in RT, the more speeded the responses at LP, see also Kunar et al., 2010). This difference was then correlated with the miss errors at LP, to examine whether miss errors increased with speed. Two separate correlations for the White condition and the Color condition, however, showed there to be little evidence of this (r-square = 0.03, $t(8) = 0.5$, p = ns and r-square = 0.11, $t(8) = 1.0$, p = ns, for the White and Color conditions, respectively). The results concur with previous work in the literature, which have suggested that a speed-accuracy trade-off was not responsible for the LP effect (e.g. Wolfe et al., 2007, Kunar et al., 2010, Rich et al., 2008).

The results of Experiment 1 demonstrate a number of factors. First, in line with previous studies, participants missed more targets in the LP condition compared to the HP condition. Second, giving participants a chance to self-correct reduced the LP effect. For example, in the LP color condition the self-correct option approximately halved the number of miss errors observed. Nevertheless, even after self-correction there was still an LP effect as miss errors at LP were higher than at HP (see also Kunar et al., 2010 and Van Wert et al., 2009). Third, knowledge of a target's color helped target detection, overall. Examining the effect of color on both d' and c, we see that, when participants were given the option to self-correct, color helped target detection as it increased both sensitivity (d') and criterion. People were more sensitive to targets in the color condition and more willing to respond to a target's presence if they knew its color in advance. However, looking at the interaction between prevelance and color type on miss errors, having a target appear in a known color did not eliminate, nor statistically reduce, the LP effect. For example, examining the data, participants missed 29% more targets at LP compared to HP in the White condition and in the Color condition before correction. After the opportunity to self-correct participants still missed 26% more White targets and 16% more Color targets at low prevalence. When the target was rare, participants missed a large number of targets, regardless of whether they knew the color or not, in comparison to when the target appeared more frequently.

Although our results showed that color may not eliminate the LP effect (as miss errors at LP are higher than at HP) they do show that there are fewer miss errors when the target is color-defined. Feeding these results back into the applied setting, where it is crucial to miss as few of the rare targets as possible, adding color to the display, although not eliminating the LP effect, appears to be worthwhile. Within these applied settings, however, a target may not necessarily appear in the predicted color. What happens to the LP effect when the target appears in an unexpected color? This was investigated in Experiment 2.

Experiment 2

Method

Participants.

Eight participants (M = 21.8, SD = 1.1, 5 female) were recruited from the University of Warwick. Each received £6/hour remuneration. Informed consent was obtained and all had normal or corrected-to-normal vision.

Stimuli and Procedure.

The stimuli and procedure were similar to that of the color stimuli in Experiment 1. There were no white trials in Experiment 2. However, here, the target (when present) appeared in one color for 75% of the trials (the Majority color) and in a single different color for the other 25% of trials (the Minority color). Participants were told that the target was likely to appear in the Majority color set but that it could also appear in the Minority color and were informed in advance what those color sets would be. The assigned target colors each participant was given were randomized and remained constant through each of the participant's experimental blocks.

There were five experimental blocks containing two conditions: high prevalence and low prevalence. The five blocks were presented over four sessions, with at least 30 minutes between sessions. The high prevalence (50% target present) condition consisted of 160 trials (80 target-present, 80 target-absent). The low prevalence (2% target present) condition consisted of 4000 trials (80 target-present, 3920 target-absent) split into 4 sessions of 1000 trials each. The order of the four low prevalence sessions and the position of the high prevalence condition, within one of those sessions, was randomized. Participants were given 20 practice trials before each experimental block.

Results and Discussion

RTs less than 200 ms and greater than 5000 ms were removed as outliers. This led to the removal of less than 1% of the data at high prevalence and 1% of the data at low prevalence. Independent t-tests showed that there was no difference depending on which color target participants searched for (all ts < 1.3, ps > 0.3). As such, all data were pooled for analysis. Figure 3 shows the miss errors.

Errors

Initial Errors. A repeated-measures ANOVA on the initial miss errors, with factors of Prevalence (High or Low) and color Proportion (Majority or Minority) showed that there was a main effect of prevalence, $F(1, 7) = 75.01$, $p < 0.01$, where more targets were missed at LP than at HP. There was also a main effect of proportion, $F(1, 7) = 37.21$, $p < 0.01$, where there were more miss errors when the target appeared in the Minority color than in the Majority. The Prevalence x Proportion interaction also approached significance, $F(1, 7) = 5.56$, $p = 0.051$. The LP effect was more pronounced when the target was in the Minority color than in the Majority color.

Figure 3 about here

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*Corrected Errors***.** There was a main effect of prevalence, $F(1, 7) = 57.52$, $p < 0.01$, where more targets were missed at LP than at HP, and a main effect of proportion, $F(1, 7) = 15.32$, $p < 0.01$, where more targets were missed in the Minority color than in the Majority color. The Prevalence x Proportion interaction was also significant, $F(1, 7) = 12.29$, $p < 0.05$. The LP effect was more pronounced when the target was in the Minority color than in the Majority color.

The self-correction option improved participant's performance (Fleck and Mitroff, 2007). In all conditions, the overall miss errors were significantly reduced after correction (all *t*s > 5.1, *p*s < 0.01). For example, at LP, miss errors were reduced by 11% in the Majority color targers and 16% for the Minority color targets. However, even after self-correction there was still an LP effect, as miss errors were higher at LP than at HP (37% vs 15%, respectively).

<u>Sensitivity (d') and Response Criterion (c)</u>

Table 3 shows the d' and c values for each condition.

Initial d'. A repeated-measures ANOVA on the initial d', with factors of Prevalence (High or Low) and Color Proportion (Majority or Minority), showed that there was no main effect of prevalence. However there was a main effect of proportion, $F(1, 7) = 34.01$, $p = .001$. There was a lower sensitivity for targets appearing in the Minority color than those in the Majority color. There was no Prevalence x Proportion interaction.

Corrected d'. Analysis of the corrected d' data showed that there was a main effect of prevalence $F(1, 7) = 5.91$, $p = .045$, where sensitivity decreased at LP, and a main effect of proportion, $F(1, 7) = 16.92$, $p = .004$, where sensitivity was lower for the targets in the Minority color. The Prevalence x Proportion interaction was also significant, $F(1, 7) = 6.93$, $p = .034$. Sensitivity decreased more for the minority color targets at LP than for the Majority color targets.

Initial criterion. A repeated-measures ANOVA on the initial criterion, with factors of Prevalence (High or Low) and color Proportion (Majority or Minority), showed there to be a main effect of prevalence, $F(1, 7) = 42.73$, $p < .001$, where criterion was more conservative at LP. There was also a main effect of proportion, $F(1, 7) = 34.01$, $p < .001$, where criterion was more conservative for the Minority targets than the Majority targets. The Prevalence x Proportion interaction was not significant.

Corrected criterion. Analysis of the corrected criterion showed there to be a main effect of prevalence $F(1, 7) = 39.91$, $p <.001$, where criterion was more conservative at LP, and a main effect of proportion, $F(1,7) = 16.92$, $p = .004$, where criterion was more conservative for the minority targets than the majority targets. There was also a significant Prevalence x Proportion interaction, $F(1, 7) = 6.93$, $p = .034$, where the increase in criterion from HP to LP was greater for the Minority targets than for the Majority targets.

Table 3 about here

<u>RTs</u>

The RT results followed the same pattern as that observed in the literature (see Table 2). Correct target-absent trials (correct rejections) were significantly faster at LP than HP, $t(7) = 3.48$, $p < 0.05$, (see Figure 5). As there could be no Minority or Majority color distinction on target-absent trials, there was no comparison to make between proportions. There was a main effect of prevalence for correct target-present responses (hits), $F(1, 7) = 29.33$, $p < 0.01$, where RTs were slower at LP. However, there was no main effect of proportion or a Prevalence x Proportion interaction.

To investigate whether the elevated miss errors at LP were due to a speed-accuracy trade-off, we correlated the LP miss errors for each condition with the difference between HP and LP RTs for correct target-absent trials, as in Experiment 1. Two separate correlations for Majority color targets and Minority color targets suggested that there was little evidence for a speed-accuracy trade-off (r-square = 0.08, t(8) = 0.8, p = ns and r-square = 0.09, t(8) = 0.9, p = ns, for the Majority and Minority conditions, respectively). This concurs with the results of previous work (e.g. Wolfe et al., 2007, Kunar et al., 2010).

An LP effect occurred in all conditions. Having a self-correct response reduced miss errors significantly for both the Majority and Minority color targets. However, an LP effect was still observed, even after self-correction. Participants missed 21% more Majority color targets and 37% more Minority color targets at LP compared to HP before correction. After the opportunity to self-correct, participants missed 14% more Majority color targets and 29% more Minority color targets at low prevalence. More crucially, having the target appear in a minority (or, unexpected) color affected the magnitude of miss errors across conditions: the LP deficit was markedly worse for the Minority color targets than the Majority color targets. Before correction, participants missed almost 70% of targets that appeared in the unexpected color, numerically a much higher percentage than usually observed in this task (e.g. 30-40%, Wolfe et al., 2005, see also Fleck & Mitroff, 2007, Kunar et al., 2010, Rich et al., 2008, Van Wert et al., 2009). After correction, participants missed approximately 50% of the targets – again a greater percentage than observed elsewhere (e.g. Fleck & Mitroff, 2007, Kunar et al., 2010; Van Wert et al., 2009). Participants also showed a lower sensitivity (d') to Minority color targets and were less willing to respond to them (showing a criterion shift) compared to Majority color targets. These effects were magnified even further at LP (especially after self-correction) and can explain why participants made more miss errors under LP Minority target-color conditions. From Experiment 1, we know that the use of color in LP search can improve target detection, overall, if the target appears in a known color set, but Experiment 2 shows that it can also dramatically impair performance if the target is an unexpected color.

Godwin et al. (2010) recently showed that when searching for two separate targets (e.g. a gun and an I.E.D.) with different prevalence rates, participants showed a deficit in performance of finding the less prevalent target. Our results are similar. However, in Godwin et al.'s study, participants were searching for two entirely separate complex items – with different shapes, sizes and components. If observers had the goal-state of searching for a gun, for example, then items falling outside of that target template's shape (e.g. an I.E.D.) may be easily missed. In our experiment, however, people could search for the target using two templates: shape (which was always valid) and color (which was mostly valid). Even with an *always* valid shape, the imbalance in miss errors suggest that participants put more emphasis on the use of color when looking for the target. This leads to a greater number of missed targets appearing in the minority color, which may have otherwise been detected without the use of color cues.

Experiment 2 investigated the use of valid and invalid color cues in LP search. Experiment 3, investigates cueing further by using an exogenous red-box cue that could either be valid or invalid at predicting the target's location.

Experiment 3

Method

Participants.

Nine participants (M = 26.22 years, S.D. = 3.31, 4 female) were recruited from the University of Warwick. Each received £6/hour remuneration. Informed consent was obtained and all had normal or corrected-to-normal vision.

Stimuli and Procedure.

The stimuli were the same as in the white stimuli trials from Experiment 1. On some critical trials, the outline of a red box with a visual angle of 9 degs x 8.5 degs (at a viewing distance of 57 cm) would be presented (see Figure 4). There were three conditions where the red box would appear: (i) TBox trials – with the target located within the bounds of the box; (ii) DBox trials – with the target present but outside the box; or (iii) Box-no target trials – where the target was absent and the box appeared in a random position on the screen (but always containing at least one distractor item - these trials were used to mimic false alarm trials in the applied setting). In the case of the target appearing outside the red box (DBox trials), the box would, instead, be focused around a distractor. It was possible for the box to contain, or overlap, more than the target or a single distractor as the remaining distractors also appeared randomly but it was ensured that the target could not be presented inside, or be obscured by, the box on DBox trials.

Figure 4 about here

There were two experimental conditions: high prevalence and low prevalence. The HP condition was used as a baseline to analyze the specific effects of using a red box to cue the possible target locations. In this condition, there were 240 trials with 120 (50%) being target-present trials. Of these target-present trials, 40 would include the red box containing the target (TBox), 40 would have the red box with the target somewhere outside the box (DBox) and a further 40 would have no box at all (NB). The remaining 120 trials (target-absent) would include 40 with the red box randomly positioned in the display (Box-no target). The HP condition demonstrated how effective the red box cue was at capturing attention when the target was frequent (see also Jonides, 1981 and Remington et al., 1992).

The LP condition had a total of 5000 trials with 100 (2%) target-present trials – 60 with the target inside the box (TBox), 20 with the target outside the box (DBox) and 20 with no box at all (NB). Also, 1170 of the target-absent trials had a red box (Box-no target) to bring the total trials with a box present to 1250 (25% of total trials). Thus, for LP trials with these proportions, the target, if present, is likely to appear within the cued area (with the idea that screener assistant technologies are likely to catch prohibited items on the majority of bags they appear in). We also included 'false-alarm' trials where the red box, but no target, would be present. These mimic baggage screening displays where the red box highlights a non-threatening item (e.g. confusing a walkman for an I.E.D.). As the prevalence of the target appearing in the LP and HP trials needed to be kept at 2% and 50% respectively, the absolute numbers of the different trial types could not be equated. There are a number of issues with this methodology. First, we see that the overall percentage of trials that contains a red box also differs between conditions. If people are simply using the presence of a red box to signify that a target may appear somewhere in the display then this signal varies between HP and LP. Second, given the nature of this design the probability of the target appearing within the cued region also differs between conditions. To address these concerns we ran two baseline conditions which equated the proportion of HP trial types (e.g. TBox, DBox, NB trials) to that of the HP and LP conditions presented in Experiment 3, respectively. The results from both of these HP conditions showed a similar pattern of results to that presented here[1]. The data suggest that, despite the proportional differences in trial types, the HP condition is useful in giving a measure of how effective these cues are when the target appears frequently. We discuss these differences further in the General Discussion.

The total number of LP trials, and each trial type variation, was split equally into 5 sessions of 1000 trials[2]. Participants completed the HP condition during one of these sessions, the order of which – including the position of the HP condition within one of these sessions – was randomized. There was at least 30 minutes between each session and they could be spread over a number of days. Participants were given a 20-trial practice session before each experimental block. They were asked to respond as quickly but as accurately as possible and also told that the red box was there to assist them and may highlight the most likely position of the target, if it was present.

Results and Discussion

[1] Two baseline HP conditions were run: one which replicated the proportions of each trial in the HP condition in Experiment 3 (‘HP-replication’) and one which equated the proportions of each trial to that of the LP condition in Experiment 3 (‘HP-equated’). The results showed that there was no difference in initial errors between each trial type across HP conditions (all ps > 0.2). Although RTs were faster and sensitivity was lower for TBox trials in the HP-equated condition compared to the HP-replication condition, there were no other differences between the conditions in terms of RTs or d’. More importantly, between participant comparisons of the LP condition of Experiment 3 and the HP-equated condition showed that the same pattern of miss errors were observed as those reported in Experiment 3. Using different proportions of each trial type did little to change the pattern of results.

[2] One of the five sessions contained 1001 trials (an extra target-absent trial), bringing the total to 5001 trials. This extra trial, however, did not affect the overall pattern of results. The prevalence rate of the target was still 2.0%.

RTs less than 200 ms and greater than 5000 ms were removed as outliers. This led to the removal of less than 1% of the data at both high and low prevalence. Figure 5 shows the miss errors.

Errors

Initial Errors. A repeated-measures ANOVA on miss errors with factors of Prevalence (High & Low) and Target Location (NB, TBox or DBox) showed that there was a main effect of prevalence, $F(1, 8) = 159.66$, $p < 0.01$, with more miss errors for LP than HP, and a main effect of Target Location, $F(2, 16) = 79.01$, $p < 0.01$, where there were fewer errors in the TBox trials than the DBox or NB trials. There was also a Prevalence x Target Location interaction, $F(2, 16) = 3.79$, $p < 0.05$, where the LP effect was bigger for the DBox and NB trials than for the TBox trials.

Corrected Errors. There was a main effect of Prevalence, $F(1, 8) = 74.39$, $p < 0.01$, where there were more errors in the LP conditions than in the HP conditions. There was also a main effect of Target Location, $F(2, 16) = 37.09$, $p < 0.01$, where there were fewer errors in TBox trials than the DBox or NB trials. The Prevalence x Target Location interaction was significant, $F(2, 16) = 4.63$, $p < 0.05$, where the LP effect was bigger for the DBox and NB trials than for the TBox trials.

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Figure 5 about here

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As in Experiments 1 and 2, giving participants the option to correct their responses tended to reduce miss errors. Miss errors were reduced for the NB, $t(8) = 3.11$, $p < 0.05$ and DBox conditions, $t(8) = 3.92$, $p < 0.01$, at HP. There was no difference in miss errors in the TBox conditions at HP, presumably as performance was already at ceiling in this condition initially. Miss errors were significantly reduced by 4%, 14% and 12% in the TBox, DBox and NB trials, respectively at LP (all *t*s, > 2.91, *p*s < 0.03). However, even after self-correction an LP effect was observed, as miss errors were higher at LP compared to HP (22% vs 7%, respectively).

Sensitivity (d') and Response Criterion (c)

Table 4 shows the d' and c values for each condition.

Initial d'. A repeated-measures ANOVA on the initial d', with factors of Prevalence (High or Low) and Target Location (NB, TBox or DBox), showed that there was a main effect of prevalence, $F(1, 8) = 11.93$, $p = .009$, where overall d' increased at LP, and a main effect of target location, $F(2, 16) = 63.38$, $p < .001$, where d' was greater for TBox trials than DBox and NB trials. There was no Prevalence x Target Location interaction.

Corrected d'. Analysis of the corrected d' data showed that there was no main effect of prevalence but there was a main effect of target location, $F(2, 16) = 30.79$, $p < .001$. D' was greater for TBox trials than DBox and NB trials. The Prevalence x Target Location interaction was significant, $F(2, 16) = 6.07$, $p = .011$, where d' was greater at LP than at HP for the TBox trials but not for the DBox or NB trials. Replicating Wolfe et al. (2007), d' did not change across prevalence but did vary between target location. Participants are more able to distinguish the target from distractors on the TBox trials than in the other target-present trials.

Initial criterion. A repeated-measures ANOVA on the initial criterion, with factors of Prevalence (High or Low) and Target Location (NB, TBox or DBox), showed that there was a main effect of prevalence $F(1, 8) = 11.20$, $p < .001$, where people were more conservative in their response at LP and that there was a main effect of target location, $F(2, 16) = 67.25$, $p < .001$, where responses to TBox trials were more liberal than responses to DBox and NB trials. The Prevalence x Target Location interaction was significant, $F(2, 16) = 5.28$, $p = .017$. People were less willing to respond target-present at LP than at HP, although this difference was greater in the DBox trials and NB trials than the TBox trials.

Corrected criterion. Analysis of the corrected criterion data showed there to be main effect of prevalence, $F(1, 8) = 47.96$, $p < .001$, where people were more conservative at LP, and a main effect of target location, $F(2, 16) = 32.55$, $p < .001$, where responses to TBox trials were more liberal than responses to DBox and NB trials. The Prevalence x Target Location interaction was significant, $F(2, 16) = 6.49$, $p = .009$. All target location conditions showed that people were less willing to respond target-present at LP than at HP, although this difference was greater in the DBox trials and NB trials than the TBox trials.

Table 4 about here

<u>RTs</u>

Correct target-absent (correct rejection) responses were faster at LP than HP, $F(1, 8) = 11.29$, $p < 0.05$, (see Table 2). This result is again consistent with the miss RT findings reported by Wolfe et al. (2007). Also, there was a main effect of Target Location, $F(1, 8) = 26.20$, $p < 0.05$, where NB responses were faster than the Box-no target trials. This could be due to participants expecting a target to appear, or, at least believing that it may be more likely, and allocating more search time to these trials. The 'hit' RT data provided a marginal main effect of prevalence, $F(1, 8) = 4.74$, $p = 0.061$, where there was a trend for correct target-present responses to be slower at LP as reported by Wolfe et al. (2007). Also, there was a main effect of target location, $F(2, 16) = 39.55$, $p < 0.01$, showing that RTs were fastest for TBox targets and slowest for DBox targets. There was no significant Prevalence x Target Location interaction.

To investigate whether the elevated miss errors at LP were due to speed-accuracy trade-offs, as in Experiments 1 and 2, we correlated the LP miss errors for each condition with the difference between HP and LP RTs for correct target-absent trials. Three separate correlations for TBox trials, DBox trials and NB trials suggested that there was little evidence for a speed-accuracy trade-off in any of these conditions, (r-square = 0.00, t(7) = 0.1, p = ns, r-square = 0.01, t(7) = 0.3, p = ns, and r-square = 0.01, t(7) = 0.2, p = ns, for the TBox, DBox and NB trials, respectively). These results concur with previous studies (e.g. Wolfe et al., 2007, Kunar et al., 2010, Rich et al., 2008).

Overall the data showed that there was an LP effect in every condition. Self-correction reduced the percentage of targets missed in each condition. Participants missed 6% more TBox targets at LP compared to HP, while they missed 30% and 27% more DBox and NB targets, respectively before correction. After the opportunity to self-correct, participants missed 3% more TBox targets at LP compared to HP, while they missed 21% and 20% more DBox and NB targets, respectively. However, similar to Experiments 1 and 2, the option to self-correct did not eliminate the LP effect in any of the conditions, as there were still more miss errors at LP than at HP. The exogenous cue, on the other hand, did have an effect on miss errors across conditions.

The LP effect was quantitatively reduced when the target appeared in the cued area (TBox trials) than when it appeared outside the cued area or when there was no box.

Similar to Experiment 2, miss errors for targets in the invalid conditions (where the target appeared outside the highlighted area, or if no red box was presented at all) were higher than in the valid conditions. The data also showed that people were more sensitive to targets that were highlighted by the box (as d' was higher) and that people were less willing to respond to a target's presence if it fell outside the box or when no box was presented. This shift in criterion was greater for LP trials than for HP trials. Participants were even less willing to respond to a target's presence when it was rare *and* when the highlighting box was either absent or did not predict the target's location. We discuss this further in the General Discussion.

Of final note, having the target appear in the cued area greatly minimized miss errors in HP conditions. Miss errors were close to 0%, even before correction, presumably as the red box acted as a very strong exogenous cue, pointing to the target position. Despite, acting as such a salient cue at HP, these cues did not lead to the same observable behaviour at LP. Although the presence of the cue reduced the number of miss errors, participants still missed more highlighted and saliently cued targets when they had a LP. As the cue was physically identical in both conditions, the results suggest that the effectiveness of the exogenous cue varied depending on the target's prevalence rate. An alternative suggestion may be that in both HP and LP conditions the presence of a red-box indicated the likelihood of a target being present. However, given the necessary difference in the number of trials across conditions, the predictive nature of the red box was greater at HP than at LP[3]. If so, this may explain why participants still missed some targets at LP but virtually no targets at HP. However even with a red cue appearing somewhere

[3] We thank a reviewer for this suggestion.

in the display (indicating the likelihood of a target) miss errors in DBox trials were similar to that when no predicting red box appeared (i.e., in NB trials, both at HP and at LP). Thus, in both conditions the predictive aspect of the red box did not help search, unless it directly cued the target location.

General Discussion

Previous work has shown that, under low prevalence conditions, participants miss a target more often than if it appears frequently (Wolfe et al., 2005, Wolfe et al., 2007; Van Wert et al., 2009). The experiments presented here examined how visual cues, such as color (Experiment 1 and 2) and exogenous cues, highlighting the likely area of the target (Experiment 3), affected search under LP conditions.

Experiment 1 investigated whether knowing the color of the target in advance improved detection of rare targets. Color has been shown to improve target detection under high prevalence conditions (e.g. Egeth et al., 1984; Michel et al., 2007, Treisman & Gelade, 1980) and has been used as a strong guidance signal in search (e.g., Hannus et al., 2006, Luria & Strauss, 1975, Motter & Belky, 1998, Williams & Reingold, 2001, Wolfe et al., 1989, Wolfe, 2007). In a similar manner, we found that adding color to the display improved detection of the target, overall, and resulted in fewer miss errors (especially after participants were given the opportunity to self-correct). However, the overall LP effect when participants were given advanced knowledge of the target's color was no different than when no color information was given.

Experiments 2 and 3 assessed the use of valid and invalid cues in LP search. Experiment 2 investigated miss errors of targets that appeared in an expected or unexpected color, while Experiment 3 investigated miss errors of targets that were validly or invalidly cued by an exogenous red box. The results showed that both valid color cues and exogenous red box cues, reduced the number of miss errors observed at both high prevalence and low prevalence. Furthermore, having a valid cue reduced the LP effect compared to an invalid cue (Experiments 2 and 3) and when there was no cue at all (Experiment 3). Within both these experiments, miss errors increased when the cue was invalid. Having the target appear in an unlikely color or misdiagnosed location posed a severe cost to LP search. This is important if we extrapolate our results back to the applied setting, where baggage screeners make use of color cues and red box cues when searching for prohibited items in x-rayed images. Although these cues are useful when the target appears in the expected feature/location, having them appear in an unexpected color or location seems to be more costly then not having the cue at all.

Giving participants the option to correct their responses reduced the LP effect. In all of our experiments fewer miss error rates were observed after correction than before. This agrees with the findings of Fleck and Mitroff (2007) who suggest that some of the miss errors in LP search are due to motor errors. However, it should be noted that, although the option to correct reduced the LP effect, it did not eliminate it, as miss errors were higher at LP than at HP even after self-correction (see also Kunar et al., 2010; Van Wert et al., 2009). It seems that along with pre-potent motor biases, other accounts are needed to explain the high miss errors observed in LP search, such as a shift in criterion and/or a reduced quitting threshold in search (Wolfe et al., 2007, Rich et al., 2008, Wolfe & Van Wert, 2010).

Let us now examine our results in terms of signal detection. Previous work suggests that the LP effect is due to a shift in criterion. Wolfe et al. (2007) identified this criterion shift as a conservative shift (a higher value of c, above zero), or, an unwillingness to respond target-present at LP. The same criterion shift was observed in all our experiments here. Furthermore, in Experiment 1, color stimuli were found to be accompanied by a more liberal criterion than white stimuli at low prevalence. Participants would more readily accept an LP trial as target-present, when the stimuli were colored than when they were white. Similar results were found for expected (majority color) over unexpected (minority color) target color, where participants were more willing to respond target-present when the target appeared in the expected color (Experiment 2) and when the target appeared in a red box over when it appeared outside the red box or when no red box was present (Experiment 3). This change in response criterion may explain why these visual cues (if valid) were effective in reducing the number of miss errors observed.

While criterion shifted, Wolfe et al. (2007) reported that d' did not change across prevalence. For the most part, our data is consistent with this (although we did observe a decrease in sensitivity at LP for Experiment 2). However, the different manipulations had differential effects on sensitivity at LP and at HP. Unsurprisingly, knowing the target color (or expected target color) improved sensitivity. Likewise, having the target appear in a cued area also improved sensitivity. However, for predictive majority color cues, the observed sensitivity was greater at HP than at LP (Experiment 2). Conversely, sensitivity was greater when the target appeared in a highlighted cued area at LP than at HP (Experiment 3). At first glance it may appear strange that sensitivity increased with a reduction in target frequency in this latter condition. However, this may be explained if we examine the percentage of trials across conditions that contained a red box cue. In the LP condition, 25% of trials contained a cue, while in the HP condition, 50% of trials contained a cue. Presenting the cue less frequently in the LP condition may have resulted in it having a greater attentional weight when it actually appeared, leading to an increase in d'. Please note, however, that even with this increased sensitivity at LP, the red box cue did not entirely eliminate the LP effect. Further research is needed to investigate this. However, more importantly, for present purposes, the data here show that, under LP conditions, screener assistant technologies that correctly highlight a potentially dangerous area improve the ability to distinguish target-present from target-absent trials.

In line with previous research, the results of these experiments point to the robustness of the LP effect and that finding ways to eliminate LP search is not trivial (e.g. Wolfe et al., 2007). Although manipulating a person's reward scheme has been shown to reduce the LP effect (Navalpakkam et al., 2009), other more physical manipulations have not been so successful. The results reported here show that adding color cues and even highly salient exogenous cues, which effectively eliminate miss errors at HP (Experiment 3), fail to eliminate miss errors entirely at LP. Other work has also shown that search manipulations that are known to benefit search performance at high prevalence may not be as effective at low prevalence. Rich et al., (2008) showed that participants missed more LP targets than HP targets even in a single feature search, where the target was shown to 'pop out' of the display. Furthermore, Kunar et al. (2010) found that separating the presentation of the display into two discrete spatial and/or temporal sections did not remove the LP effect. Given that LP search occurs in many important applied settings, further work is needed to understand and find ways to eradicate the search cost of having the target appear rarely.

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Table 1

Means and Standard Deviations for Initial and Corrected Sensitivity (d') and Criterion (c), for High Prevalence and Low Prevalence Trials in Experiment 1.

	Initial				*Corrected*			
Experimental Condition	*d'*	*SD*	*c*	*S D*	*d'*	*SD*	*c*	*SD*
High Prevalence/ White Stimuli	3.32	0.71	0.39	0.27	3.56	0.79	0.27	0.23
Low Prevalence/ White Stimuli	3.42	0.50	1.51	0.25	3.33	0.65	1.17	0.47
High Prevalence/ Color Stimuli	3.59	0.55	0.28	0.26	4.20	0.43	0.11	0.14
Low Prevalence/ Color Stimuli	3.47	0.72	1.34	0.32	3.71	0.76	0.84	0.30

Table 2

Mean Reaction Times (RT) for High Prevalence (HP) and Low Prevalence (LP) trials in Experiments 1, 2 and 3 in milliseconds. For Experiment 2, as there could be no Minority or Majority color distinction on target absent trials, the correct rejection RT reflects the overall RT for all target absent HP and LP trials.

Experimental Condition	*Hits*	*Correct Rejections*
Expt 1: HP/ White Stimuli	1530	2641
Expt 1: LP/ White Stimuli	1761	1897
Expt 1: HP/ Color Stimuli	1021	1351
Expt 1: LP/ Color Stimuli	1381	1181
Expt 2: HP/ Majority Color	1135	1715
Expt 2: LP/ Majority Color	1477	1280
Expt 2: HP/ Minority Color	1260	*n/a*
Expt 2: LP/ Minority Color	1376	*n/a*
Expt 3: HP/ TBox	903	*n/a*
Expt 3: LP/ TBox	1232	*n/a*
Expt 3: HP/ DBox	1733	*n/a*
Expt 3: LP/ DBox	1940	*n/a*
Expt 3: HP/ NB	1409	2131
Expt 3: LP/ NB	1680	1658
Expt 3: HP/ Box No Target	*n/a*	2459

Table 3

Means and Standard Deviations for Initial and Corrected Sensitivity (d') and Criterion (c), for High Prevalence and Low Prevalence Trials in Experiment 2.

	Initial				*Corrected*			
Experimental Condition	*d'*	*SD*	*c*	*S D*	*d'*	*SD*	*c*	*SD*
High Prevalence/ Majority Color	3.63	0.80	0.53	0.29	3.85	0.75	0.43	0.31
Low Prevalence/ Majority Color	3.56	0.97	1.35	0.32	3.47	0.83	0.93	0.40
High Prevalence/ Minority Color	2.95	0.81	0.86	0.24	3.32	0.82	0.70	0.30
Low Prevalence/ Minority Color	2.59	0.95	1.83	0.45	2.61	1.08	1.37	0.44

Table 4

Means and Standard Deviations for Initial and Corrected Sensitivity (d') and Criterion (c), for High Prevalence and Low Prevalence Trials in Experiment 3.

	Initial				*Corrected*			
Experimental Condition	*d'*	*SD*	*c*	*S D*	*d'*	*SD*	*c*	*SD*
High Prevalence/ TBox	4.26	0.31	0.01	0.09	4.29	0.29	-.004	0.11
Low Prevalence/ TBox	4.59	0.49	0.77	0.21	4.48	0.49	0.40	0.26
High Prevalence/ DBox	3.32	0.51	0.49	0.22	3.53	0.43	0.38	0.20
Low Prevalence/ DBox	3.23	0.60	1.45	0.21	3.23	0.53	1.02	0.36
High Prevalence/ NB	3.27	0.50	0.64	0.18	3.75	0.50	0.54	0.29
Low Prevalence/ NB	3.60	0.31	1.64	0.25	3.46	0.36	1.24	0.33

Figure Legends

Figure 1. Example of a target-present display in Experiment 1. Participants searched for the 'T' (here, rotated 90 degs anti-clockwise).

Figure 2. Proportion of initial and corrected miss errors for high prevalence (HP - 50%) and low prevalence (LP - 2%) for both the white and color stimuli of Experiment 1. Error bars represent the standard error.

Figure 3. Proportion of initial and corrected miss errors for the majority and minority color conditions at high prevalence (HP) and low prevalence (LP) in Experiment 2. Error bars represent the standard error.

Figure 4. Example of a target-present trial (DBox trial) where the target is located outside the red box (shown in dark grey) in Experiment 3.

Figure 5. Proportion of initial and corrected miss errors as a function of target location (TBox, DBox and NB) at high prevalence (HP) and low prevalence (LP) in Experiment 3. Error bars represent the standard error.

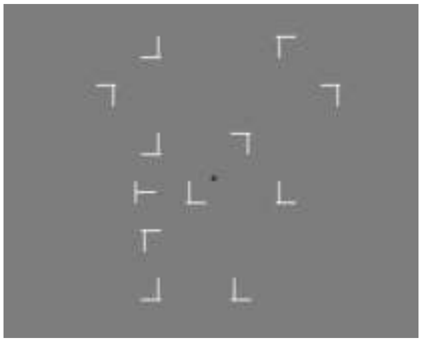


Figure 1

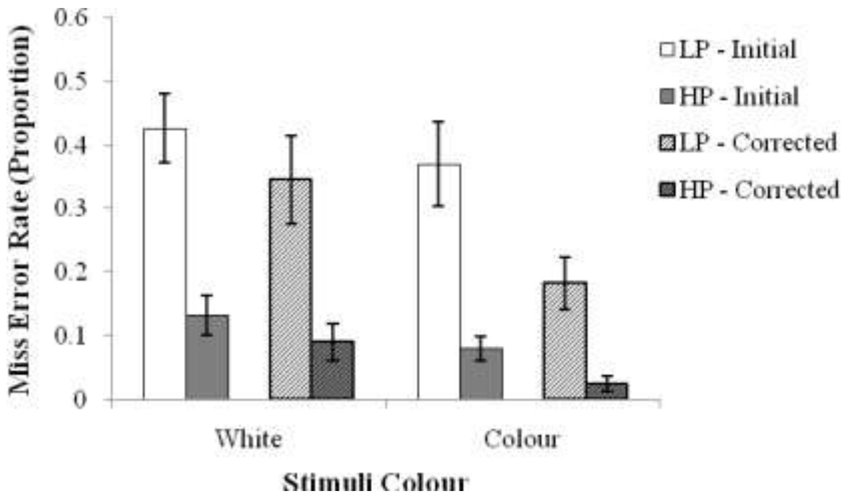
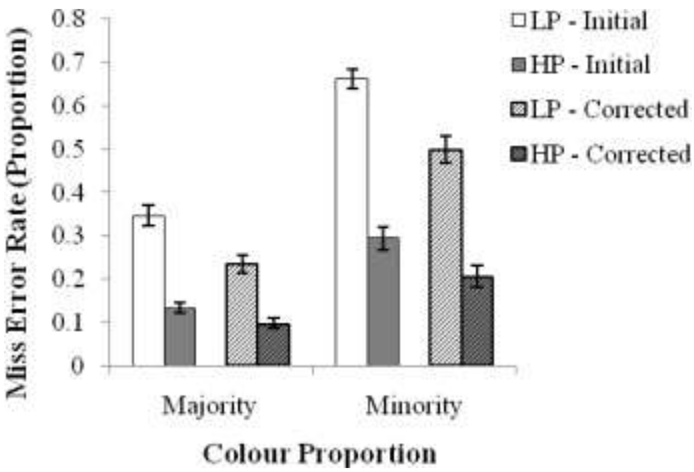

0.6
0.5
0.4
0.3
0.2
0.1
0
Miss Error Rate (Proportion)
LP - Initial
HP - Initial
LP - Corrected
HP - Corrected
White
Colour
Stimuli Colour

Figure 2



Miss Error Rate (Proportion)
0.8
0.7
0.6
0.5
0.4
0.3
0.2
0.1
0
Majority
Minority
Colour Proportion
LP - Initial
HP - Initial
LP - Corrected
HP - Corrected

Figure 3

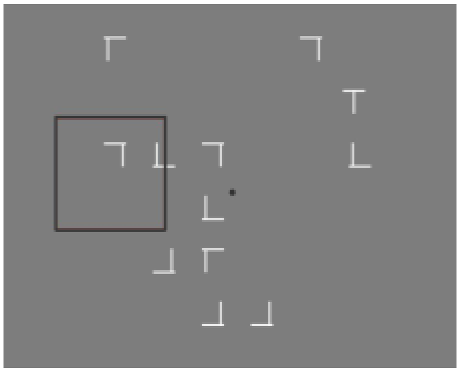


Figure 4

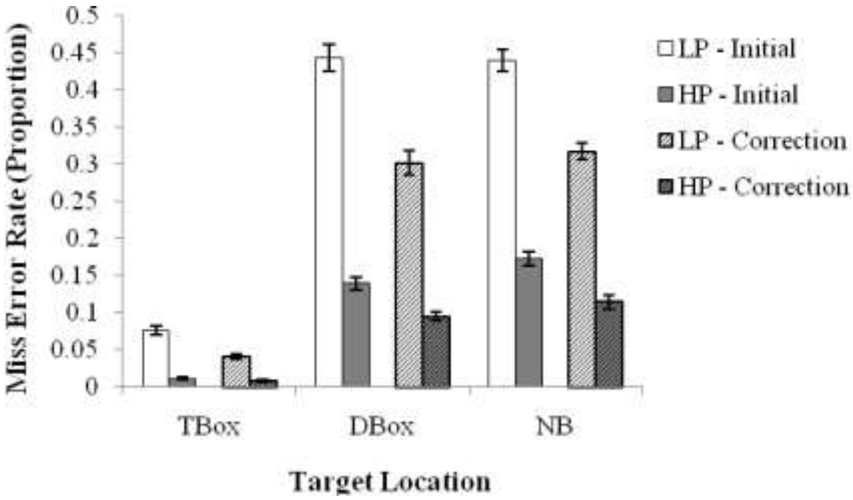

0.5
0.45
0.4
0.35
0.3
0.25
0.2
0.15
0.1
0.05
0
Miss Error Rate (Proportion)
TBox
DBox
NB
Target Location
LP - Initial
HP - Initial
LP - Correction
HP - Correction

Figure 5