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Extending Levelt's Propositions to perceptual multistability involving interocular grouping:Experiment

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15 Abstract

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Levelt's Propositions have been a touchstone for experimental and modeling studies of 16 perceptual multistability. We asked whether Levelt's Propositions extend to perceptual 17 multistability involving interocular grouping. To address this question we used split-grating 18 stimuli with complementary halves of the same color (either red or green). As in previous 19 studies, subjects reported four percepts in alternation: the two stimuli presented to each eye 20 (single-eye percepts), as well as two interocularly grouped, single color percepts (grouped 21 percepts). Most subjects responded to increased color saturation by more frequently re-22 porting a single color image, thus increasing the predominance of grouped percepts (Levelt's 23 Proposition I). In these subjects increased predominance was due to a decrease in the average 24 dominance duration of single-eye percepts, while that of grouped percepts remained largely 25 unaffected. This is in accordance with generalized Levelt's Proposition II which posits that 26 the average dominance duration of the stronger (in this case single-eye) percept is primarily 27 affected by changes in stimulus strength. In accordance with Proposition III, the alternation 28 rate increased as the difference in the strength of the percepts decreased. 29

³⁰ Keywords: Multistable perceptual rivalry, Levelt's propositions, interocular grouping

31 1. Introduction

We are remarkably adept at interpreting noisy and ambiguous visual inputs (Kersten et al., 2004; Fiser et al., 2010). However, sometimes competing interpretations of a stimulus are not disambiguated, and different interpretations are perceived in alternation. For example, binocular rivalry occurs when the two eyes are presented with disparate images. Instead of perceiving a fusion of the two images, one experiences intermittent switching between two distinct percepts (Wheatstone, 1838; Blake and Logothetis, 2002). Multistable perceptual phenomena have been used extensively to study visual awareness and its underlying cortical

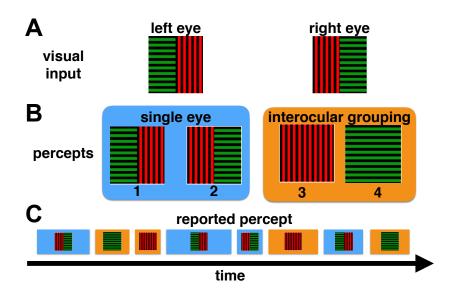


Figure 1: (A) An example of the stimuli presented to the left and right eyes. Gratings were always split so that halves with the same color and orientation could be matched via interocular grouping, but were otherwise randomized across trials and blocks (see Methods). (B) Subjects typically reported seeing one of four percepts – two single-eye and two grouped – at any given time during a trial. (C) A typical perceptual time series reported by a subject, showing the stochasticity in both the dominance times and the order of transitions between percepts.

mechanisms (Leopold and Logothetis, 1996; Polonsky et al., 2000; Tong et al., 2006; Sterzer
et al., 2009).

Levelt's observations (Levelt, 1965) have become a touchstone for experimental and mod-41 eling studies of perceptual rivalry (Blake, 1989; Moreno-Bote et al., 2007; Shpiro et al., 2007; 42 Wilson, 2003; Said and Heeger, 2013; Seely and Chow, 2011). Levelt's original Propositions 43 relate stimulus strength, predominance (the fraction of time a percept is dominant), and dom-44 *inance durations* (the duration of the dominant percept) in bistable binocular rivalry (Bras-45 camp et al., 2015): (I) Increasing the stimulus strength of the stimulus presented to one 46 eve increases the perceptual predominance of that stimulus; (II) Increasing the difference 47 in stimulus strengths between the two eyes increases the perceptual dominance duration 48 of the stronger stimulus; (III) Increasing the difference in stimulus strength between the 49 two eyes reduces the perceptual alternation rate; (IV) Increasing stimulus strength in both 50 eves while keeping it equal between eves increases the perceptual alternation rate. Levelt's 51 propositions also hold in other cases of bistable perceptual rivalry such as bistable rotating 52 structure-from-motion (Klink et al., 2008), bistable ambiguous plaids (Moreno-Bote et al., 53 2010), and motion-induced blindness (Carter and Pettigrew, 2003; Bonneh et al., 2014). 54

However, whether Levelt's propositions hold in the case of rivalry between more than two percepts is not clear. Such multistable rivalry can occur when multiple patches of two visual scenes are intermingled and the results presented to different eyes simultaneously. In this case, observers intermittently perceive the original, coherent scenes as well as the images presented to each single eye (Kovacs et al., 1996).

60 We hypothesized that Levelt's propositions extend to perceptual multistability involv-

ing interocular grouping (Kovacs et al., 1996; Diaz-Caneja, 1928; Suzuki and Grabowecky, 61 2002). We divide percepts into two groups, the stimuli presented to each eye, and interocu-62 larly grouped percepts. Following Brascamp et al. (2015) we say that a stimulus parameter 63 that affects a percept's predominance affects its strength. Levelt's Propositions generalize 64 to: (I) Increasing grouped percept strength increases the perceptual predominance of those 65 percepts; (II) Increasing the difference between the percept strength of grouped and single-eye 66 percepts increases the perceptual dominance duration of the stronger percepts; (III) Increasing 67 the difference in percept strengths between grouped percepts and single-eye percepts reduces 68 the perceptual alternation rate; (IV) Increasing percept strength in both grouped percepts and 69 single-eye percepts while keeping it equal among percepts increases the perceptual alterna-70 tion rate (Brascamp et al., 2015). We use "percept strength" rather than Levelt's original 71 "stimulus strength," as our manipulations affected the strength of percepts, rather than the 72 separate stimuli presented to each eye. 73 To test this generalization of Levelt's Propositions we used split-grating stimuli (See 74

Fig. 1A) for which subjects reliably reported four percepts in alternation: single-eye percepts 75 - the two stimuli presented to each eye (percepts 1 and 2 in Fig. 1B), as well as two 76 interocularly grouped, single color percepts (3 and 4 in Fig. 1B). We hypothesized that 77 an increase in color saturation increases the strength of the coherent, grouped percepts. 78 Indeed, we found that for most subjects an increase in color saturation lead to increased 79 predominance of grouped percepts (Proposition I). At the same time the dominance duration 80 of single-eye (stronger) percepts decreased, while that of grouped (weaker) percepts remained 81 largely unaffected (Proposition II). As a consequence, the alternation rate increased with a 82 reduction in the difference of percept strengths (Proposition III). A more detailed analysis 83 showed that these effects are primarily due to the increased strength of all red percepts (4) 84 in Fig. 1B). In addition, we found that an increase in the predominance of grouped percepts 85 was partly due to an increase in the fraction of visits to grouped percepts. 86

Color has been previously reported to affect interocular grouping (Kovacs et al., 1996). However, to our knowledge the changes in the predominance of grouped images due to changes in color saturation, and the corresponding extensions of Levelt's propositions to multistable rivalry have not been studied previously.

91 2. Methods

92 2.1. Experiment

Observers. Nine observers with normal or corrected-to-normal vision, including three of the 93 authors (AJ, ZK, YW), participated in this experiment. Six were naive to the experimental 94 hypotheses and three were not. The experiments were conducted according to a protocol 95 approved by the University of Houston Committee for the Protection of Human Subjects and 96 in accordance with the federal regulations 45 CFR 46, the ethical principles established by the 97 Belmont Report, and the principles expressed in the Declaration of Helsinki. All participants 98 provided their written informed voluntary consent following the consent procedure approved 99 by the University of Houston Committee for the Protection of Human Subjects. Data are 100 presented for all nine subjects. 101

Apparatus. The visual stimuli used in the experiment were generated using a VSG visual stimulus generator card (VSG 2/5, Cambridge Research Systems). The stimuli were displayed on a calibrated 19" high resolution color monitor with a 100 Hz frame rate. Monitor calibration was carried out using CRS colorCAL colorimeter. A head/chin rest was used to
stabilize observers' head position. The distance between the monitor and the observer was
set to 108 cm. We used a stereoscopic mirror arrangement (haploscope) in order to present
the left and right stimuli separately to the left and right eyes. It consisted of four mirrors,
whose horizontal/vertical positions and inclinations could be adjusted using screws.

Stimuli. Subjects were presented with variations of the stimulus depicted in Fig. 1A. A 110 square composed of two orthogonal gratings was presented to each eye using the haploscope. 111 The orthogonal gratings were arranged so that interocular grouping resulted in a percept 112 with single, i.e., uniform orientation (horizontal or vertical). In order to have a stimulus 113 parameter to control the percept strength for this interocular grouping, we have added color 114 to our stimuli, such that interocular grouping would lead not only to a uniform orientation 115 but also to a uniform color (Fig. 1A). Stalmeier and de Weert (1998) studied the contribution 116 of color and luminance contrast to binocular rivalry. In their experiments, the stimulus to 117 one eye was achromatic concentric rings whereas the stimulus to the other eye was a radial 118 pattern made of isoluminant color pairs. They showed that the dominance duration of the 119 colored radial pattern, hence the strength of the chromatic input, increased as the chromatic 120 distance, d(u, v), between the colors in the CIE 1960 space increased up to $d(u, v) \approx 0.1$, 121 and saturated thereafter. There were also significant differences in dominance durations 122 depending on the criterion for isoluminance (flicker photometry vs minimal distinct border 123 (MDB) criterion), and the direction of change in the color space. Finally, their results showed 124 inter-subject variability both in the effectiveness of pure chromatic contrast and achromatic 125 contrast. 126

In preliminary observations, we found color saturation effectively controlled percept 127 strength for interocular grouping. Hence, grating halves were assigned a color – either 128 red or green – at two different saturation levels, 0.4 or 0.9. The HSV color space coordinates 129 for red and green were (0.497, 0.4/0.9, 0.7) and (120.23, 0.4/0.9, 0.7), respectively, with the 130 pair of values 0.4/0.9 referring to two different levels of color saturation. At low satura-131 tion (S = 0.4), the corresponding CIE 1960 (u, v) coordinates for red were (0.214, 0.3) and 132 $L = 57.7 cd/m^2$; whereas for green they were (0.169, 0.315) and $L = 72 cd/m^2$. At high sat-133 uration (S = 0.9), the corresponding CIE 1960 (u, v) coordinates for red were (0.333, 0.329)134 and $L = 25.4 cd/m^2$ whereas for green they were (0.127, 0.360) and $L = 57.6 cd/m^2$. At low 135 saturation, the chromatic distance d(u, v) between the two colors was d(u, v) = 0.05 and 136 the achromatic distance in terms of Michelson Contrast (MC) was MC = 0.11. At high 137 saturation, these values were d(u, v) = 0.21 and MC = 0.388. Hence, by changing color 138 saturation from 0.4 to 0.9, stimulus strength was increased significantly both in chromatic 139 and achromatic dimensions. It is also noteworthy that the chromatic distance values of 0.05140 and 0.21 fall to the left and right of the critical distance $d(u, v) \approx 0.1$ at which the strength 141 of the chromatic stimulus for binocular rivalry starts to saturate as observed by Stalmeier 142 and de Weert (1998). 143

To allow for interocular grouping of complementary patches, the two halves with the same orientation always shared the same color at the same saturation level, and were shown to opposite hemifields of either eye. For example, the combination horizontal green/vertical red presented to the left eye determined the combination vertical red/horizontal green presented to the right eye, as well as the two grouped percepts – vertical red and horizontal green (See Fig. 1B). In total, there were four possible stimulus arrangements, all completely determined by any half of a stimulus presented to one eye. The two squares were displayed on a grey background (0.0, 0.0, 0.2): (u, v) = (0.188, 0.442) and $L = 23.88cd/m^2$ and were contained within a square frame with a protruding horizontal and vertical line to help image alignment.

Experimental procedure. Each session was divided into six 3-minute trials separated by a 90-153 second resting period. To account for the time it took subjects to adjust to the stimuli and 154 form stable percepts, the first 30 seconds of each trial were not analyzed. The association 155 between color and orientation was maintained within a single session, but was randomized 156 across sessions. For example, we used a vertical red/horizontal green left eve stimulus across 157 some sessions (Fig. 1A). In contrast, saturation and the position of the horizontal grating 158 was randomized across the six trials. Within one session, each saturation level appeared in 159 three trials and each grating positioning occurred in three trials. 160

Four subjects finished 6 total sessions (AJ, MA, ZK, ND), three subjects finished 5 sessions (FG, YW, ML), one subject finished 4 sessions (AB) and the remaining one finished 7 sessions (ZM). Therefore, after discarding the initial 30 seconds of each trial, a total of about 90 minutes of data over about 36 trials was collected per subject: about 18 trials for each saturation conditions, with 3 trials per level and color/orientation pairing. See the Supplementary Material which has been deposited to Github (https://github.com/YunjiaoWang /multistableRivalry.git) for more details.

Subjects were asked to indicate the dominant percept by holding down one of four dif-168 ferent buttons (1, 2, 3, 4) on a gamepad. They were instructed to press button 1 when 169 perceiving a split grating with left part red; button 2 when perceiving split grating with left 170 part green; button 3 when perceiving an all red grating; and button 4 when perceiving an all 171 green grating. When the perceived image did not correspond to one of these four options, 172 subjects were instructed to release all buttons. We also recorded the times during which 173 no stable percept was reported, and labeled them as "percept 0". Such a report typically 174 marked a transition between percepts, but could also be followed by a transition to the 175 same percept. Before the beginning of the experiment, subjects were familiarized with the 176 controller. The distribution of the times of different percepts, including no stable percepts, 177 and further details are presented in the Supplementary Material. 178

179 2.2. Data analysis

We performed the statistical analysis in R and provide a description of the analysis below. 180 Commented code, as well as all collected data are available in the Supplementary Material. 181 We conducted all data analyses under a Bayesian framework. Standard significance tests 182 would allow us to reject the null hypothesis that a color saturation change has no effect on 183 dominance time, but would not allow us to accept the alternative hypothesis. In contrast, a 184 Bayesian approach allows us to conclude that for some subjects a change in color saturation 185 did affect percept dominance. We believe that showing the probabilities that this effect 186 was present is more informative than concluding that a null hypothesis is rejected at some 187 (arbitrary) significance level. Our use of Bayesian statistics means that confidence intervals 188 are replaced by credible intervals, and traditional notions of "significance" do not apply. 189 Instead of using a fixed threshold for significance, we provide the probabilities that a change 190 in color saturation affects the perception of the stimuli, given the data (Wasserstein and 191 Lazar, 2016). 192

Importantly, in our analysis we use a hierarchical model to analyze concurrently the data from all subjects in the experiment (Gelman and Hill, 2006). Such models address the issue of multiple comparisons and provide efficient estimates (Gelman et al., 2012).

Predominance of grouped percepts. Using the time series recorded from each trial, we computed the predominance of grouped percepts. Predominance is the fraction of time that subjects reported a grouped percept, T_{grouped} , by pressing the corresponding gamepad button, out of the total time they reported any percept (percepts 1, 2, 3 or 4), i.e.

$$r(i) = \frac{T_{\text{grouped}}(i)}{T_{\text{grouped}}(i) + T_{\text{single}}(i)}.$$

Here *i* is the number of the trial, with 18 trials at each color saturation level (0.4 and 0.9). This is equivalent to the fraction of time that buttons 3 or 4 were pressed out of the total time any button was pressed during trial *i*. In our analysis, we partitioned trials based on the color saturation level used for each trial, grouping across all other conditions. We analyzed changes in predominance using a linear Student-*t* regression model to account for skewness in the data. We included the condition (low/high color saturation) as a covariate and set the degrees of freedom of the *t* distribution to 4 to provide robust inference while avoiding computational difficulties often encountered when using a prior for the degrees of freedom (Fonseca et al., 2008). Letting r_{ij} be the predominance for subject *j* in trial *i*, the model is specified as:

$$r_{ij} \sim t_4(\mu_{ij}, \sigma^2)$$

$$\mu_{ij} = \beta_{0j} + \beta_{1j} x_{ij}$$

$$\beta_{0j} \sim \text{Normal}(\beta_0, \tau_0^2), \ \beta_{1j} \sim \text{Normal}(\beta_1, \tau_1^2)$$
(1)

where x_{ij} is the color saturation indicator (1 for 0.9, 0 for 0.4). The random regression 200 coefficients β_{0j} and β_{1j} allow the effects of color saturation to vary across subjects. This hi-201 erarchical model assumes that the effects from different subjects are similar but not identical 202 and come from the same population with overall means of β_0 and β_1 . Prior distributions 203 for the overall saturation effects β_0 and β_1 were independent and normal with mean 0, and 204 variance 10^4 . We used Uniform(0, 100) priors for the standard deviation of the random 205 effects, τ_0 and τ_1 and Uniform (0, 1000) for σ . We estimated the mean difference in the 206 fraction of time between the two saturation levels and its 95% credible interval (CI) and the 207 probability that the difference is greater than 0. We performed an equivalent analysis to 208 examine whether the mean dominance time of the single eye or grouped percepts changed 209 across conditions. 210

From the i^{th} trial in each condition, we also computed ratios of the number of visits to grouped percepts, N_{grouped} , over the number of all visits to either single-eye or grouped percepts,

$$n(i) = \frac{N_{\text{grouped}}(i)}{N_{\text{grouped}}(i) + N_{\text{single}}(i)}$$

We used the model specified in Eq. (1) to analyze n(i) and determine the change in the fraction of visits to the grouped or single-eye percepts across conditions.

213 Single-color images. To examine the effect of saturation of the colors green and red individ-

ually we divided the grouped percepts into two sets – a set of all green (percept 4) and a
set of all red (percept 3). We then analyzed the effect of color saturation on predominance,
and dominance duration for each color indvidually using the same statistical approach and
models as in the case of grouped percepts.

Transition probabilities. To estimate the transition probabilities between percept types, we classified percepts into two states: single-eye, S, corresponding to percepts 1 and 2, and grouped, G, corresponding to percepts 3 and 4. For each trial, we converted the data into two binary sequences: One sequence contained all transitions from state S with transitions from S to S denoted by 1, and from S to G by 0. The second sequence contained transitions from G, those from G to G denoted by 1, and from G to S by 0. We used all data obtained by each subject in a given condition (low/high color saturation) to estimate the transition probability from S to S, and from G to G. The model is specified as

$$y_{ij} \sim \text{Bernoulli}(p_{ij})$$

$$p_{ij} = \theta_{0j} + \theta_{1j} x_{ij}$$

$$\theta_{0j} \sim \text{Beta}(\omega * (\kappa - 2) + 1, (1 - \omega) * (\kappa - 2) + 1)), \ \theta_{1j} \sim \text{Normal}(\theta_1, \tau_1^2)$$
(2)

where x_{ij} is the color saturation indicator (1 for 0.9, 0 for 0.4). We used vague priors: a uniform prior on the interval [0, 1] for the mode, ω , and a Gamma prior with rate and shape both equal to 0.01 for the concentration parameter, κ . Prior distributions for the overall saturation effects θ_1 was independent of these, and normal with mean 0, and variance 10^4 . We used Uniform(0, 100) prior for the standard deviation of the random effect τ_1 .

²²³ Model implementation. All Bayesian models were implemented via Markov Chain Monte ²²⁴ Carlo methods in JAGS. We used 3 MCMC chains with at least 20,000 iterations after an ²²⁵ initial burn-in of 4000 iterations. We assessed convergence by calculating the Gelman-Rubin ²²⁶ diagnostic, \hat{R} for all parameters.

227 3. Results

Nine observers were presented with two split-grating images simultaneously to each eye using a haploscope (See Methods). Subjects reported one of four possible percepts by pressing buttons on a game pad. We examined how the fraction of time subjects perceived grouped images (the *predominance* of grouped images) depended on color saturation.

Dominance durations follow a gamma distribution. The dominance duration, the total time
that a subject reported seeing a percept for single-eye and grouped percepts had the shape
of a gamma distribution (See Fig. 2 and Supplementary Material.) This is consistent with
previous studies of perceptual multistability (Blake and Logothetis, 2002; Brascamp et al.,
2005; van Ee, 2009).

For some, but not all subjects, the mean of single-eye percept times decreased with an increase in color saturation (Fig. 2). A more thorough analysis was therefore needed to determine the effect of color saturation on percept predominance.

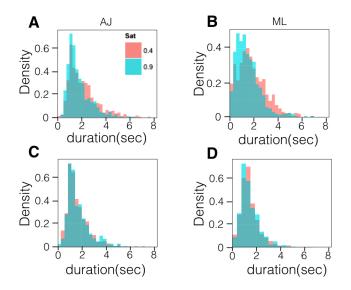
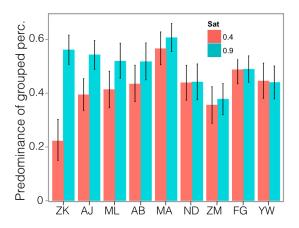


Figure 2: Dominance times for two subjects, ML and AJ, approximately follow a gamma distribution. (A,B) Histograms of single-eye percept durations are unimodal, but somewhat different between the two saturation conditions. (C,D) Histograms of the grouped percept durations are closer to each other. Each histogram contains data collected from 18 trials of 2.5 minutes each, amounting to approximately 1200 dominance duration reports (See Methods and Supplementary Material for more details).

Predominance of grouped percepts. We first examined whether an increase in color satura-240 tion affected the fraction of time grouped percepts were reported. We hypothesized that 241 predominance of grouped percepts increases with color saturation, as a result of a stronger 242 visual cue to bind the two complementary halves of the stimuli presented to each eye into a 243 coherent percept (Wagemans et al., 2012). The data supports this in five out of nine subjects 244 (Fig. 3): For five out of the nine subjects there was a 0.92 or higher probability that the 245 difference in mean predominance times increased with color saturation given the reported 246 observations (See Table in Fig. 3). This is an accord with Levelt's Proposition I, as color 247 saturation, increases predominance. There was no evidence that changes in color saturation 248 impacted predominance in the remaining subjects. 249

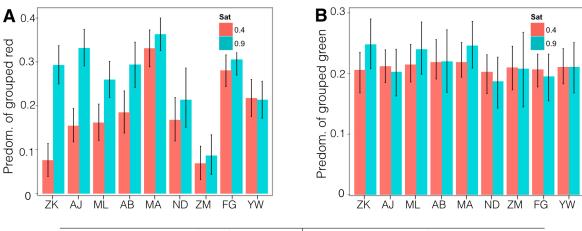
We also examined predominance of grouped red and grouped green percepts separately, 250 and found much larger changes for the grouped red percepts (Fig. 4). This cannot be ex-251 plained by a strengthening of luminance or image contrast, since at high saturation the green 252 color has higher luminance. A similar trend holds for achromatic contrast (See Methods). 253 However, in several contexts the color red tends to be a more salient than green (Emmanouil 254 et al., 2013; Stromeyer and Eskew., 1992; Lindsey et al., 2010). Red images may promote 255 a strong top-down attention signal from higher order areas processing object color (Had-256 jikhani et al., 1998). Furthermore, unlike single-eye percepts, the predominance of grouped 257 green percept does not decrease. This suggests the strength of the grouped green percepts 258 increases with color saturation, but to a smaller degree than for the red percepts. If the 259 strength of the grouped green percept did not increase, we would expect its predominance 260 to decrease, as for single-eye percepts (Fig. 3). 261

We next examined how this change in predominance was related to both changes in average dominance time and the frequency of visits to single-eye versus grouped percepts.



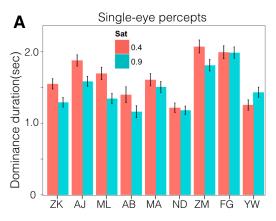
| ID | diff. | 95% CI | prob. |
|---------------|-------|---------------|-------|
| ZK | 0.31 | (0.20, 0.41) | 0.999 |
| AJ | 0.14 | (0.06, 0.22) | 0.999 |
| ML | 0.11 | (0.02, 0.20) | 0.989 |
| AB | 0.09 | (-0.01, 0.18) | 0.966 |
| MA | 0.06 | (-0.02, 0.13) | 0.928 |
| ND | 0.01 | (-0.09, 0.10) | 0.550 |
| ZM | 0.01 | (-0.07, 0.10) | 0.629 |
| \mathbf{FG} | 0.01 | (-0.06, 0.08) | 0.597 |
| YW | -0.00 | (-0.09, 0.08) | 0.489 |

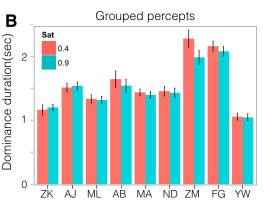
Figure 3: (Plot) Grouped percept predominance: each colored bar indicates the mean predominance at a given color saturation level in a given subject and black error bars denote the 95% credible intervals. (Table) Differences between ratios at the two color saturation levels: diff. = difference of predominance means at saturation 0.9 and 0.4; 95% CI stands for 95% credible interval; 'prob.' is the probability that the predominance of grouped percepts is higher at saturation level 0.9 (See Methods). We use the same ordering of subjects in all subsequent tables and figures, so that the five subjects sensitive to changes in color saturation are listed first.



| | grouped red | | | grouped green | | | | |
|---------------|-------------|---------------|-------|---------------|-------|---------------|-------|--|
| ID | diff. | 95% CI | prob. | ID | diff. | 95% CI | prob. | |
| ZK | 0.22 | (0.16, 0.28) | 0.999 | ZK | 0.04 | (-0.01, 0.10) | 0.955 | |
| AJ | 0.18 | (0.12, 0.23) | 0.999 | AJ | -0.01 | (-0.06, 0.03) | 0.353 | |
| ML | 0.10 | (0.04, 0.15) | 0.999 | ML | 0.03 | (-0.02, 0.08) | 0.848 | |
| AB | 0.11 | (0.04, 0.18) | 0.999 | AB | 0.00 | (-0.06, 0.05) | 0.530 | |
| MA | 0.03 | (-0.02, 0.09) | 0.876 | MA | 0.03 | (-0.01, 0.07) | 0.885 | |
| ND | 0.05 | (-0.03, 0.13) | 0.878 | ND | -0.02 | (-0.07, 0.03) | 0.262 | |
| ZM | 0.02 | (-0.04, 0.08) | 0.738 | ZM | -0.00 | (-0.07, 0.06) | 0.499 | |
| \mathbf{FG} | 0.03 | (-0.03, 0.08) | 0.836 | FG | -0.01 | (-0.06, 0.03) | 0.301 | |
| YW | -0.01 | (-0.06, 0.05) | 0.439 | YW | -0.00 | (-0.05, 0.04) | 0.498 | |

Figure 4: Predominance of grouped green and grouped red percepts: (A) grouped red percept: there is a pronounced increases in predominance with the color saturation in the first six subjects with probability around 0.9. (B) grouped green percept: predominance is largely unchanged, with two subjects (ZK, MA) showing a slight increase.





| | single-eye perc. | | | grouped perc. | | | | |
|---------------|------------------|----------------|---------|---------------|-------|----------------|-------|--|
| ID | diff. | 95% CI | D-prob. | ID | diff. | 95% CI | prob. | |
| ZK | -0.23 | (-0.32, -0.14) | 0.999 | ZK | 0.04 | (-0.05, 0.13) | 0.777 | |
| AJ | -0.26 | (-0.36, -0.15) | 0.999 | AJ | 0.03 | (-0.06, 0.11) | 0.714 | |
| ML | -0.32 | (-0.43, -0.21) | 0.999 | ML | -0.02 | (-0.10, 0.07) | 0.333 | |
| AB | -0.21 | (-0.34, 0.08) | 0.999 | AB | -0.10 | (-0.26, 0.04) | 0.075 | |
| MA | -0.09 | (-0.20, 0.02) | 0.950 | MA | -0.04 | (-0.11, 0.03) | 0.142 | |
| ND | -0.03 | (-0.12, 0.06) | 0.743 | ND | -0.02 | (-0.12, 0.08) | 0.303 | |
| ZM | -0.21 | (-0.32, -0.09) | 0.999 | ZM | -0.29 | (-0.47, -0.08) | 0.000 | |
| \mathbf{FG} | -0.01 | (-0.12, 0.11) | 0.552 | FG | -0.08 | (-0.19, 0.02) | 0.052 | |
| YW | 0.16 | (0.06, 0.27) | 0.001 | YW | -0.01 | (-0.09, 0.07) | 0.396 | |

Figure 5: Average dominance durations: (A) single-eye percepts and (B) grouped percepts. Single-eye percept dominance durations decrease as color saturation is increased for the subjects who also experience increased grouped percept predominance. Here 'D-prob.' (on left) is the probability that the dominance duration of single-eye percepts decreases and 'prob.' (on right) is the probability that the dominance duration of grouped percepts increases.

264 3.1. Causes of predominance changes

In the case of only two percepts, the number of visits to each percept will differ by at most one per trial (van Ee, 2009), and dominance duration is closely related to predominance. When there are more than two percepts, they do not simply alternate, and the order in which multiple percepts appear can affect predominance (Naber et al., 2010; Huguet et al., 2014). Thus, to understand changes in predominance we must examine how color saturation influences dominance duration, as well as the number of visits to each percept.

Single-eye percept durations decrease with color saturation. We compared the average dom-271 inance durations of single-eye and grouped percepts for the two different color saturation 272 conditions in Fig. 5. In six out of nine subjects, there was a higher than 0.95 probability that 273 dominance duration of single-eve percepts decreased as color saturation increased (subjects 274 ZK, AJ, ML, AB, MA, ZM, See Fig. 5A). These included the five subjects for which the 275 predominance of grouped percepts increased. There was no strong evidence that increased 276 color saturation increased the dominance duration of all grouped percepts in any subjects. 277 The generalization of Levelt's Proposition II states that increasing the difference between 278 the percept strength of grouped and single-eye percepts increases the average perceptual 279

dominance duration of the stronger percepts Brascamp et al. (2015). By increasing color 280 saturation, we decreased the difference in stimulus strength between single-eye and grouped 281 percepts: In the low color saturation case, the single-eye percepts were stronger, as their 282 predominance was higher than that of grouped percepts (Fig. 3, for seven of the nine subjects 283 the predominance of grouped percepts was below 0.5 with a probability of 0.94 or higher. 284 See Supplementary Material). At higher color saturation the grouped percepts had a mean 285 predominance of near 0.5 or below for eight subjects. We therefore concluded that the 286 single-eye percepts are stronger. Thus, for most subjects who were sensitive to a change 287 in percept strength the stronger percepts' (single-eye) mean dominance duration decreased, 288 while the weaker percepts' (grouped) durations remained roughly the same. We explore 289 further comparisons with Propositions II-IV in the Discussion. 290

A separate analysis of dominance duration changes of the grouped green and red percepts 291 shows that changes are less pronounced than those of single-eye percepts (Fig. 6): There is a 292 slight increase in the dominance duration of the grouped red percept, but this is in line with 293 Proposition II, which allows for slight increases in the dominance duration of percepts whose 294 stimulus strength increases (Brascamp et al., 2015). Furthermore, the slight decrease in the 295 dominance duration of grouped green percepts is smaller than the decrease for single-eye 296 percepts. We can see this by looking at the probabilities: the average dominance duration 297 of the single-eve percepts in the first fives subjects showed decreases with > 0.95 probability 298 while that of either all green or all red demonstrated changes with such high probability only 299 in two subjects out of these five subjects. Thus, in line with Proposition II, the substantial 300 increase in the predominance of the grouped red percept is accompanied by a slight to no 301 increase in the dominance duration. 302

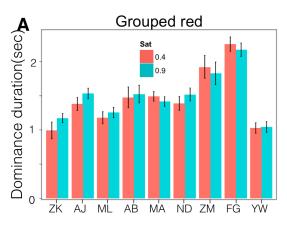
Grouped percept visit frequency increases with color saturation. With multiple percepts, each 303 can occur with a frequency between 0% to 50%, excluding self-transitions. This frequency 304 impacts predominance (Naber et al., 2010; Huguet et al., 2014). We therefore examined 305 how the frequency of visits to single-eye and grouped percepts depended on color saturation. 306 Consistent with our results for grouped percept predominance (Fig. 3), the frequency of visits 307 to grouped percepts increased with color saturation in most subjects (Fig. 7, see Methods 308 for details about the analysis): Subjects ZK, AJ, ML and AB (probability > 0.94), and to 309 a lesser degree MA (prob. > 0.82), show a consistent increases in the number of visits to 310 grouped percepts. 311

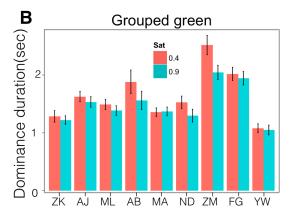
We conclude that two main factors contributed to increased predominance of grouped percepts: the average dominance duration of single-eye percepts decreased, while the dominance durations of grouped percepts remained approximately unchanged, and the grouped percepts were visited more frequently when color saturation was high.

316 3.2. Transitions to grouped percepts increase with color saturation

We also analyzed the transition probability between percepts. We focused on the frequency of transitions between each percept type: single-eye or grouped percepts (See Fig. 8A). In doing so, we reduced the number of possible transitions to four: single-eye to grouped, grouped to single-eye, grouped to grouped, and single-eye to single-eye (See Methods).

Our analysis of the frequency of visits to grouped percepts (Fig. 7) suggests an increase in transitions to grouped percepts in the high color saturation condition. Consistent with this trend, we found that the ratio of transitions from single-eye to single-eye percepts decreased





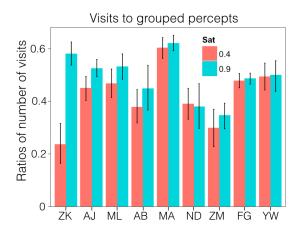
| grouped red | | | | grouped green. | | | | |
|---------------|-------|---------------|-------|----------------|-------|----------------|---------|--|
| ID | diff. | 95% CI | prob. | ID | diff. | 95% CI | D-prob. | |
| ZK | 0.18 | (0.04, 0.32) | 0.997 | ZK | -0.06 | (-0.18, 0.06) | 0.843 | |
| AJ | 0.15 | (0.04, 0.27) | 0.995 | AJ | -0.09 | (-0.22, 0.03) | 0.929 | |
| ML | 0.08 | (-0.03, 0.19) | 0.915 | ML | -0.10 | (-0.22, 0.02) | 0.956 | |
| AB | 0.05 | (-0.13, 0.22) | 0.713 | AB | -0.32 | (-0.57, -0.09) | 0.998 | |
| MA | -0.07 | (-0.17, 0.02) | 0.062 | MA | 0.01 | (-0.09, 0.12) | 0.394 | |
| ND | 0.13 | (0.00, 0.27) | 0.976 | ND | -0.23 | (-0.38, -0.08) | 0.999 | |
| ZM | -0.09 | (-0.32, 0.10) | 0.204 | ZM | -0.47 | (-0.68, -0.26) | 0.999 | |
| \mathbf{FG} | -0.08 | (-0.22, 0.05) | 0.126 | FG | -0.07 | (-0.23, 0.08) | 0.819 | |
| YW | 0.01 | (-0.09, 0.12) | 0.605 | YW | -0.03 | (-0.14, 0.08) | 0.716 | |

Figure 6: The average dominance duration of grouped red shows increases in some subjects and grouped green on the other hand demonstrates decreases in several subjects. However, the magnitude of the changes overall are less pronounced as that in single-eye percepts.

in the first five subjects (ZK, AJ, ML, MA, and ZM in Fig. 8B). This implies that the ratio of the transitions from single-eye to grouped percepts increased as color saturation increased. In addition, the ratio of grouped percepts to grouped percepts transitions increased as the color saturation for four out of those five subjects (prob> 0.94, see Fig. 8C). Thus, there was an increase in the frequency of transitions between grouped percepts. This phenomenon has previously been referred to as "trapping", as it suggests a subject's perception is trapped in a subset of all possible percepts (Suzuki and Grabowecky, 2002).

331 4. Discussion

Multistable perceptual phenomena have long been used to probe the mechanisms under-332 lying visual processing (Leopold and Logothetis, 1999). While binocular rivalry is used most 333 frequently (Blake and Logothetis, 2002), different insights can be obtained by employing 334 visual inputs that are integrated to produce interocularly grouped percepts (Kovacs et al., 335 1996; Suzuki and Grabowecky, 2002). These experiments are particularly informative when 336 guided by Levelt's Propositions, originally developed in the case of binocular rivalry (Levelt, 337 1965; Brascamp et al., 2015). Here we used this approach to identify how color saturation 338 influences the dynamics of perceptual multistability involving interocular grouping. 339



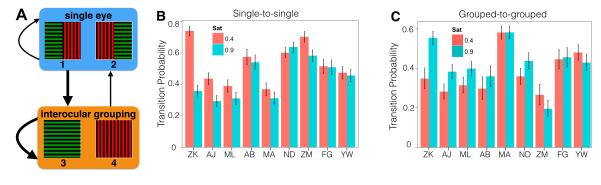
| ID | diff. | 95%CI | prob. |
|---------------|-------|---------------|-------|
| ZK | 0.32 | (0.25, 0.39) | 0.999 |
| AJ | 0.08 | (0.02, 0.14) | 0.996 |
| ML | 0.07 | (0.00, 0.13) | 0.975 |
| AB | 0.06 | (-0.01, 0.14) | 0.948 |
| MA | 0.03 | (-0.03, 0.08) | 0.829 |
| ND | -0.01 | (-0.09, 0.06) | 0.351 |
| ZM | 0.04 | (-0.03, 0.10) | 0.873 |
| \mathbf{FG} | 0.01 | (-0.05, 0.07) | 0.630 |
| YW | 0.02 | (-0.05, 0.08) | 0.700 |

Figure 7: Frequency of visits to grouped percepts out of all visits. The mean increases for eight out of nine subjects when color saturation is increased from 0.4 to 0.9. The five subjects who experienced an increase in grouped percept predominance, also showed an increase in the frequency grouped percept visits. Values in the table are computed in the same way as in Fig. 3.

Related work. We showed that multiple cues (color and collinearity) affect interocular group-340 ing. Varying color saturation, we were able to show that color impacts the dominance of 341 integrated images in accordance with a generalization of Levelt's propositions. Alais and 342 Blake (1999) studied the impact of orientation on the predominance of grouped stimuli 343 when percept halves originated from the same eye. Stuit et al. (2011, 2014) explored a 344 paradigm related to our own with the orientation of complementary image halves impacting 345 interocular grouping. While they identified orientation as a cue for interocular grouping, the 346 increase in predominance was not analyzed in detail. Zhaoping and Meng (2011) considered 347 the role of color in Dichoptic completion, rather than binocular rivalry. Nothdurft (1993) 348 investigated the role of different visual object features (orientation, motion, and color) in the 349 detection of objects, finding that color did facilitate object detection. Our results are more 350 closely related to the work by Kim and Blake (2004) and Kovacs et al. (1996). Kovacs et al. 351 (1996) showed that color promotes interocular grouping: they obtained evidence for stable 352 and relatively long percepts in which all the elements appeared to be of one color (all-red or 353 all-green). However, neither study examined the underlying causes of these effects or how 354 they extend to Levelt's propositions to multistable perceptual rivalry involving interocular 355 grouping. 356

Color saturation facilitates grouping of complementary image halves. We demonstrated that 357 increasing the color saturation of ambiguous visual inputs can increase the predominance of 358 grouped percepts. This is consistent with the Gestalt law of similarity (Wagemans et al., 359 2012). While this effect tended to be strongest for the grouped red percept, we did find 360 evidence that the grouped green percept became more salient than in the low color satura-361 tion condition. The neural mechanisms underlying collinear facilitation for chromatic and 362 achromatic contours appear to be different (Beaudot and Mullen, 2003; Huang et al., 2007), 363 suggesting that multiple channels in the visual system affect the grouping of image halves. 364 We propose that color provides one cue that promotes the grouping of objects between eyes. 365

Inter-subject Variability. It is important to note that we only observed an appreciable increase in grouped percept predominance in five out of nine subjects (Fig. 3). In the remaining



| | single-to-single | | | | grouped-to-grouped | | | | |
|---------------|------------------|----------------|---------|----|--------------------|---------------|-------|--|--|
| ID | diff. | 95% CI | D-prob. | ID | diff. | 95% CI | prob. | | |
| ZK | -0.37 | (-0.42, -0.32) | 0.999 | ZK | 0.19 | (0.12, 0.25) | 0.999 | | |
| AJ | -0.14 | (-0.19, -0.09) | 0.999 | AJ | 0.09 | (0.04, 0.15) | 0.999 | | |
| ML | -0.08 | (-0.13, -0.03) | 0.998 | ML | 0.08 | (0.03, 0.13) | 0.999 | | |
| AB | -0.04 | (-0.10, 0.03) | 0.868 | AB | 0.06 | (-0.01, 0.13) | 0.941 | | |
| MA | -0.06 | (-0.12, -0.01) | 0.985 | MA | 0.01 | (-0.04, 0.05) | 0.640 | | |
| ND | 0.03 | (-0.01, 0.08) | 0.087 | ND | 0.08 | (0.02, 0.13) | 0.996 | | |
| ZM | -0.12 | (-0.17, -0.07) | 0.999 | ZM | -0.06 | (-0.12, 0.00) | 0.032 | | |
| \mathbf{FG} | -0.01 | (-0.08, 0.05) | 0.645 | FG | 0.02 | (-0.05, 0.08) | 0.712 | | |
| YW | -0.02 | (-0.08, 0.04) | 0.774 | YW | -0.04 | (-0.10, 0.02) | 0.089 | | |

Figure 8: (A) Diagram showing the case where single-to-single percept transitions are less likely than grouped-to-grouped transitions, represented by the thickness of transition arrows. (B,C) The probability of transitions from (B) single-to-single percepts, and (C) grouped-to-grouped percepts. The probability of a single-to-single transition tends to decrease with color saturation whereas the grouped-to-grouped transition probability tends to increase in the cohort of subjects whose grouped predominance increased. The table gives the posterior probability of a decreases in single-to-single transition, and an increase in grouped-to-grouped transitions given the data.

four subjects we did not observe an effect of color saturation on percept predominance. One 368 possible reason for this result is that subjects differed in their sensitivity to color satura-369 tion (Kaiser and Boynton, 1996). Although no subjects reported problems with distinguish-370 ing colors, they may have responded differently if the change in color saturation was larger, 371 or if we used different colors. For example, the wide array of sensitivities to contrast across 372 human subjects are reflected in the range of mean dominance time durations in binocular 373 rivalry (Bossink et al., 1993; Brascamp et al., 2006; van Ee, 2009). Also, the relationship be-374 tween color saturation and percept predominance is likely nonlinear Stalmeier and de Weert 375 (1998). The color saturation values we used may have fallen in the flat portion of the 376 function that describes the relation between color saturation and predominance for the four 377 unaffected subjects. 378

As mentioned previously, Stalmeier and de Weert found significant inter-subject variability even when isoluminance points were calibrated individually for each subject (Stalmeier and de Weert, 1998). The effect of chromatic signal strength on binocular rivalry depended both on the calibration criterion (flicker photometry versus MDB) and the direction along which colors are sampled in the color space. (Stalmeier and de Weert, 1998) also showed significant inter-subject variability both in the absolute effectiveness of achromatic contrast and

its relative effectiveness with respect to chromatic contrast (Stalmeier and de Weert, 1998). 385 Inter-subject variability has been reported in relatively low-level tasks (e.g. Halpern et al. 386 (1999)), as well as in multistable perception (Kleinschmidt et al., 2012), which is interpreted 387 to include both low-level and high-level factors. Hence, for future studies, we suggest the use 388 of multiple levels of the percept-strength variable in order to characterize more completely 389 the performance of each subject individually. In addition, it would help us identify the rela-390 tive contributions of color saturation and luminance to percept strength, since red and green 391 have different luminance at a fixed saturation (See Methods). This would provide a test for 392 the generality of our conclusions, and this would also help us to identify stronger instances 393 of grouping for the grouped green percept. Increasing the number of subjects would allow 394 us to better characterize inter-subject variability, but would likely not make it disappear. 395

Extending Levelt's propositions to interocular grouping. Interocular grouping has been re-396 ported with different sets of patchwork images (Kovacs et al., 1996; Suzuki and Grabowecky, 397 2002). However, earlier studies did not quantify specific ways in which a stimulus parameter 398 could affect the predominance of grouped images. We have shown that color saturation used 399 as a grouping cue differentially controls the strength of single-eye and grouped percepts, and 400 increasing color saturation can increase grouped percept predominance. As this effect was 401 strongest for all red percept, it suggests that color saturation, and particularly that of the 402 color red, may act as a stimulus strength parameter for grouped percepts. 403

In agreement with Proposition II, the predominance of single-eye percepts was higher 404 at low color saturations, and their dominance durations decreased in the higher color satu-405 ration condition, while the overall dominance duration of grouped percepts did not change 406 much. Proposition III then follows from Proposition II. Finally, since we could not deter-407 mine whether we equally increased the strength of both single-eye and grouped percepts, it 408 is unclear whether our results are consistent with Levelt Proposition IV. Color saturation 409 may affect monocular and binocular integration in different ways (Sincich and Horton, 2005). 410 Stimulus parameter changes obeying Proposition IV would have to keep predominance fixed, 411 while decreasing mean dominance durations. 412

Studies of interocular grouping in perceptual multistability have a long history (Diaz-413 Caneja, 1928). We focused on split single-eye images for simplicity, but we anticipate that 414 our findings extend to the patchwork images of Kovacs et al. (1996). The simple grating-415 based inputs we used were more similar to the geometric images of Suzuki and Grabowecky 416 (2002). We expect that our findings extend to achromatic images as long as a parameter 417 can be identified that affects grouped percept predominance. For example, we could use 418 achromatic textures as a cue to group complementary stimulus halves. In general, we suggest 419 that our findings apply to any stimulus feature that promotes grouping along the lines of 420 Gestalt laws of grouping. 421

Neural mechanisms of perceptual multistability. Our observations support the prevailing the-422 ory that perceptual multistability is significantly percept-based and involves higher visual 423 and object-recognition areas (Leopold and Logothetis, 1999). Since the first systematic study 424 on binocular rivalry (Wheatstone, 1838), much work has been devoted to identifying its un-425 derlying neural mechanisms: Mutual inhibition allows for the selection of one percept among 426 many (Lumer, 1998; Tong and et al, 1998; Tong, 2001; Lee et al., 2005; Haynes et al., 2005; 427 Meng et al., 2005; Moutoussis et al., 2005; Wunderlich et al., 2005; Seely and Chow, 2011), 428 adaptation can lead to switching between percepts (Kim et al., 2006; Brascamp et al., 2006; 429

van Ee, 2009), and neuronal noise accounts for the irregularity of perceptual dominance 430 intervals (Brascamp et al., 2006; Moreno-Bote et al., 2007; Shpiro et al., 2009; Lankheet, 431 2006). However, a number of issues remain unresolved. Activity predictive of a subject's 432 dominant percept has been recorded in lateral geniculate nucleus (LGN) (Haynes and Rees. 433 2005), primary visual cortex (V1) (Lee and Blake, 2002; Polonsky et al., 2000), and higher 434 visual areas (e.g., V2, V4, MT, IT) (Logothetis and Schall, 1989; Leopold and Logothetis, 435 1996; Sheinberg and Logothetis, 1997). Thus, rivalry likely results from interactions between 436 networks at several levels of the visual system (Freeman, 2005; Wilson, 2003; Dayan, 1998). 437 Collinear facilitation involves both recurrent connectivity in V1 as well as feedback con-438 nections from higher visual areas like V2 (Angelucci et al., 2002; Gilbert and Sigman, 2007), 439 reenforcing the notion that perceptual rivalry engages a distributed neural architecture. How-440 ever, a coherent theory that relates image features to dominance statistics during perceptual 441 switching is lacking. It is unclear how neurons that are associated to each subpopulation 442 may interact due to grouping factors such as collinearity and color. 443

Conclusion. Our work supports the general notion that perceptual multistability is a distributed process that engages several layers of the visual system. Interocular grouping requires integration in higher visual areas (Leopold and Logothetis, 1996), but orientation processing and competition occurs earlier in the visual stream (Angelucci et al., 2002; Gilbert and Sigman, 2007). Furthermore, the fact that color saturation can modulate the statistics of perceptual multistability provides a novel stimulus parameter that can be varied in visual inputs to probe the neural mechanisms of visual integration and competition.

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458

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456 Supplementary material can be found at https://github.com/YunjiaoWang/multistableRivalry.git
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