

# Neural Computation of Perceived Relative Size and Depth in Complex 2D Image Configurations

Birgitta Dresp-Langley  
 Centre National de la Recherche Scientifique (CNRS)  
 UMR 7357 ICube Lab Strasbourg University  
 Strasbourg, France  
 e-mail: birgitta.dresp@icube.unistra.fr

Adam Reeves  
 Department of Psychology  
 Northeastern University  
 Boston, USA  
 e-mail: a.reeves@northeastern.edu

**Abstract**—The neural networks of the human visual brain are capable of extracting 3D structure from specific 2D cues available in planar images. Many of the functional principles governing this ability are still not fully understood. Neural models backed by psychophysical data predict how local differences in either luminance contrast or physical size of local boundaries in 2D images may determine the perception of 3D structure, but do not generate predictions relative to the role of color in this process. To further clarify the potential contribution of color to 3D perceptual organization, we created 2D image configurations with multiple surface representations where the relative physical size of local boundaries between contrast regions was held constant. The only potential cues to 3D available in the images were specific local combinations of color and luminance contrast. Psychophysical experiments with human observers were run to test for selective local effects on the subjective relative depth and the subjective relative size of image regions. It was found that response probabilities for subjective depth and subjective size are systematically and consistently determined by local surface colors and their immediate backgrounds. The results show consistently varying perceptual judgments with a statistically significant correlation between subjective depth and subjective size. Moreover, there is a color specific effect on both dependent variables, and this effect depends on the polarity of the immediate surround of the reference surface rather than local center-surround contrast intensity. These findings are not predicted by any of the current neural models and suggest that the perceptual mechanisms generating 3D effects from 2D visual input selectively exploit specific color and background cues to enable the intrinsically coherent 3D perceptual organization of otherwise ambiguous 2D images with multiple surface representations.

**Keywords** - colour; local contrast; background intensity; complex images; 2D image parts; subjective size; relative depth.

## I. INTRODUCTION

Leonardo da Vinci [1] was the first to report on the importance of local luminance contrast as a perceptual cue to 3D in 2D images. Contemporary neural models and psychophysical data predict that contrast variations across image parts directly determine which parts of a planar image will be seen as "nearer" or "further away from" the human observer [1] - [10]. Previous studies on functional aspects of mechanisms for depth perception from neural computation of local image contrast properties have not yet fully explored all

the complex interactions between color, luminance, and general background field intensities. In the absence of other spatial cues to depth, it appears that specific colors in combination with specific contrast intensities may produce more powerful 3D effects than others, as suggested by results on perceptual figure-ground organization, for example [10] [1] - [14]. Moreover, variations in brightness or luminance displayed across two or more different surface layers in complex 2D multiple-surface configurations may alter these perceptual effects significantly [7] [14] [15], or even reverse them [16] [17]. This study was designed to explore some of such possible interactions more systematically. Complex 2D image configurations with carefully controlled physical variations in local color, luminance, general background intensity, and constant spatial parameters were generated for this purpose. The local physical size of the test and reference surfaces submitted to perceptual judgments was not varied across comparisons. Center-surround surface combinations within image configurations were displayed on a high resolution monitor in a computer controlled psychophysical study with human subjects completing four Two-Alternative spatial Forced Choice (2AFC) judgment tasks. The subjects had to judge which of two comparison surfaces in the configurations appeared "bigger" (task 1) or "nearer" (task 3), and which of all the possible reference surfaces in a given configuration appeared "the biggest" (task 3) or "the nearest" (task 4) of all.

In Section 2, the materials and methods used to generate the image configurations for this study, some of the characteristics of the study population, and the experimental task procedures are explained. Section 3 summarizes the principal results and discusses their implications for our current understanding of perceptual 3D organization from 2D image input. Section 4 provides a conclusion in terms of the consistency and/or discrepancy of the findings with regard to current neural models of 3D perception from planar image input.

## II. MATERIALS AND METHODS

Image configurations were computer generated and displayed on a high resolution color monitor (EIZO COLOR EDGE CG 275W, 2560x1440 pixel resolution) connected to a DELL computer equipped with a high performance graphics card (NVIDIA). Color and luminance calibration of the RGB channels of the monitor was performed using the appropriate Color Navigator self-calibration software, which

was delivered with the screen and runs under Windows 7. RGB values here correspond to ADOBE RGB. All luminance levels were cross-checked with an external photometer (OPTICAL, Cambridge Research Systems). RGB coordinates, luminance parameters (cd/m<sup>2</sup>), and color coordinates (X, Y, Z) of the different reference surfaces in the image configurations from this study are given in Table 1.

The size of each of the square surfaces in the center of each of the twelve local configurations in the images was 160x160 pixels and the size of each of the square surrounds was 400x400 pixels. The twelve local configurations were equally spaced, with 50 pixels between their surrounds, along the horizontal and vertical dimensions. They were displayed centrally on the dark and light general background of the 2560x1440 pixel screen. The size of a single pixel on the screen is 0.023 cm.

Grey, red, and blue-green center squares on their light and dark immediate surrounds were presented in pairs, as shown in Figure 1. Their position (left, right) in a pair was counterbalanced between trials and subjects. Presentation on light and dark general backgrounds was also counterbalanced between trials and subjects. The subject pool consisted of mostly undergraduate medical students, with normal or corrected-to-normal vision. All of them were naïve to the purpose of the experiment and run in individual sessions. They were comfortably seated in a semi-dark room, in front of the EIZO monitor at a viewing distance of about 1 meter. Each individual received the same standard instructions for the psychophysical tasks.

In the first task, the subject had to decide which of the two central squares in a paired configuration (*paired comparison*) appeared to be the "bigger" one of the two. In the second task, the subject had to pick the central square from all of the twelve configurations that appeared the "biggest" of all (*single pick*). In the third task, the subject was instructed to judge which of the two central squares in a paired configuration (*paired comparison*) appeared to be "nearer" to them, and in the fourth task he/she had to pick the central square from all of the twelve configurations that appeared the "nearest" of all (*single pick*) to the observer.

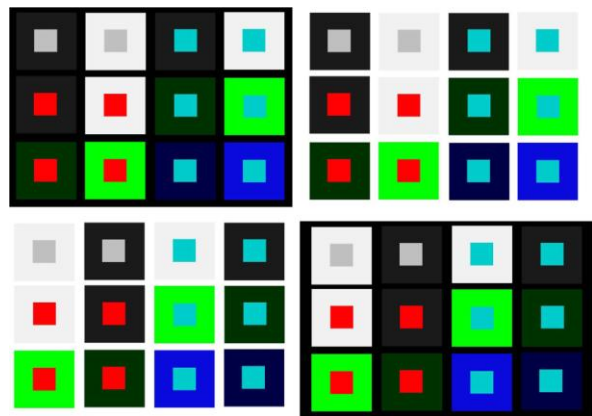


Figure 1. Center-surround surface configurations on dark and light general backgrounds.

The twelve local configurations shown in Figure 1 produce subjective differences in the relative size and depth of the centrally displayed squares. Grey, red, and blue-green center squares displayed on dark and light surrounds were paired for the relative psychophysical judgments. Trials were sequenced in counterbalanced sessions producing eight psychophysical judgments for each *paired comparison* and *single pick* task, general background condition, and subject. Therefore, a total of 80 data was generated for each of the four tasks and for each of the two general background conditions

The subjects who participated in this study were adult volunteers all naïve to the purpose of the study. We selected seven men and three women with normal or corrected-to-normal vision. The experiments were non-invasive and conducted in accordance with the Declaration of Helsinki (1964) and with full approval of the corresponding author's host institution's (CNRS) ethical standards committee. Informed consent was obtained from each of the participants.

TABLE I. COLOR AND LUMINANCE PARAMETERS

Reference Surface	Image Luminance (L) And Color Coordinates						
	R	G	B	L (cd/m <sup>2</sup> )	X	Y	Z
Grey Center	190	190	190	58.6	49.8	52.3	57.0
Red Center	255	0	0	35.8	57.7	29.7	2.7
Blue Center	0	205	205	52.3	23.1	43.5	65.7
Dark-Grey Surround	25	25	25	2.0	0.6	0.6	0.6
Light-Grey Surround	240	240	240	95.3	83.2	87.5	95.3
Dark-Green Surround	0	50	0	2	0.5	1.7	0.2
Light-Green Surround	0	255	0	78.5	18.5	62.7	7.1
Dark-Blue Surround	0	0	70	0.5	1.1	0.4	5.8
Light-Blue Surround	10	10	220	5	13.7	5.52	71.6
Dark General Background	0	0	0	0.5	0	0	0
Light General Background	255	255	255	120.0	13.7	5.52	71.6

### III. RESULTS AND DISCUSSION

#### A. Response probabilities for "bigger" and "nearer"

The response probabilities (*p*) from the two paired comparison tasks (task 1, task 3) were calculated for each of the twelve local center-surround configurations in the order in which they are displayed in the first of the four general display-panels shown in Figure 1. A *p* of 1 would correspond to the case where a local configuration of a given pair produces a total number of 80 observed/80 possible responses for "bigger" or for "nearer". In this case, the *p* associated with the other configuration from that pair would be 0. In the case a given pair produces random perceptual responses for "bigger" or for "nearer", the response probability associated with each of the two paired

configurations would be 0.50. In a first analysis, the twelve configurations were sorted as a function of the magnitude of the response probabilities they produced for "bigger" and "nearer" and plotted in ascending order for each of the two "general background intensity" conditions. These plots are shown in Figure 2. The two graphs reveal consistent  $p$  distributions for "bigger" and "nearer" ranging from 0.10 to 0.90 in each of the two general background conditions.

*B. Correlation between response probability distributions from the paired comparison tasks*

The response probability distributions from the paired comparison tasks were submitted to statistical correlation analyses (Pearson's product moment), returning statistically significant correlation coefficients ( $P$ ), with 0.98 ( $p < .001$ ) for "bigger" and "nearer" in the "dark general background" condition, and 0.99 ( $p < .001$ ) for the probability distributions for "bigger" and "nearer" in the "light general background" condition. These analyses show that the center-surround configurations produced a wide range of significantly correlated perceptual differences in relative size and depth of their local center surfaces.

*C. Response probabilities for "bigger" and "nearer" as a function of luminance contrast*

In a second analysis, the configurations were sorted as a function of their local contrast intensity. The luminance contrasts ( $LumC$ ) are expressed here in terms of Weber Ratios, which are calculated using

$$LumC = \frac{Lum_{center} - Lum_{surround}}{Lum_{surround}} \quad (1)$$

The response probabilities for "bigger" and "nearer" were then plotted as a function of the twelve different Weber contrasts of the configurations and the two general background conditions, shown in Figure 2. Graphs in the top panel show significantly correlated magnitudes of  $p$  for "bigger" and "nearer" produced by the twelve configurations on the two general backgrounds, plotted in ascending order. The graphs in the middle panel show  $p$  distributions as a function of the luminance contrast intensity (Weber ratios) of the twelve configurations and the general background conditions. The graphs in the bottom panel show  $p$  as a function of the local color contrast of the configurations with positive (+) Weber contrasts, which produced greater magnitudes of  $p$  for "bigger" and "nearer" in the paired comparison tasks.

The data reveal that there is no simple function linking the  $p$  for relative size and depth to the luminance contrast of the local configurations. There is a systematic effect of the general background condition on all the  $p$ : the lighter general background produced systematically stronger response probabilities for "bigger" and "nearer". The configurations with the positive local contrast signs all produced greater magnitudes of  $p$  in comparison with their negative-contrast-sign pairs, however, the configurations with the strongest positive contrasts did not produce the highest response

probabilities, neither for "bigger" (relative size), nor for "nearer" (relative depth) in the paired comparison tasks.

This is clarified further by the graphs shown in the panel at the bottom of Figure 2, where  $p$  for "bigger" and "nearer" are shown as a function of the local color contrast of the configurations which produced the stronger  $p$  magnitudes, and as a function of the general background condition. The highest  $p$  for "bigger" (relative size) and "nearer" (relative depth) are produced by the RED central squares on the dark-grey surround displayed on the light general background, and by the GREY central squares on the dark grey surrounds displayed on the general background. The BLUE central squares on dark surrounds produced noticeably lower  $p$  for "bigger" and "nearer" in comparison with the RED centers, yet, the blue on dark surrounds has a much stronger luminance contrast (25.5) than the red on dark surrounds (16.9). For the blue centers on dark surrounds we observe the strongest effect of general display background condition: the  $p$  for "bigger" and "nearer" are well above a certain positive probability threshold ( $\geq 0.75$ ) for the blue-on-dark configurations displayed on a light general background, but approach the chance level ( $\sim 0.50$ ) in the condition where they were displayed on a dark general background.

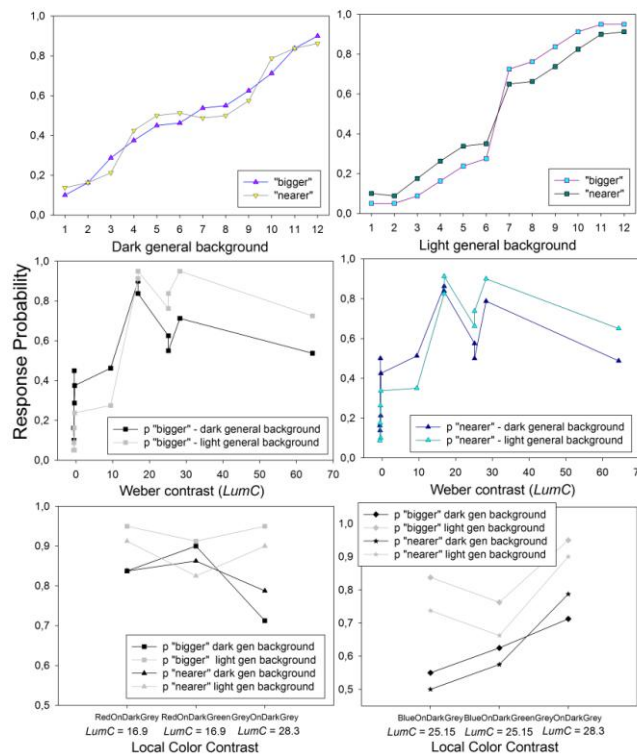


Figure 2. Response probability ( $p$ ) distributions for relative size ("bigger of two") and relative depth ("nearer of two") judgments from the paired comparison tasks.

D. Response probabilities for "biggest of all" and "nearest of all" as a function of luminance contrast

In the final analysis, we plotted the  $p$  distributions from the two *single pick* tasks as a function of the contrast intensity of the twelve local configurations and the general display background condition. These results, shown in Figure 3, consistently indicate that the highest response probabilities for "biggest" and "nearest" are produced by RED centers on dark GREEN or GREY local surrounds. This result is consistent with earlier observations [9] and further highlights the hitherto not shown dependency of this selective color effect on physical parameters relative to the immediate and the general background intensities.

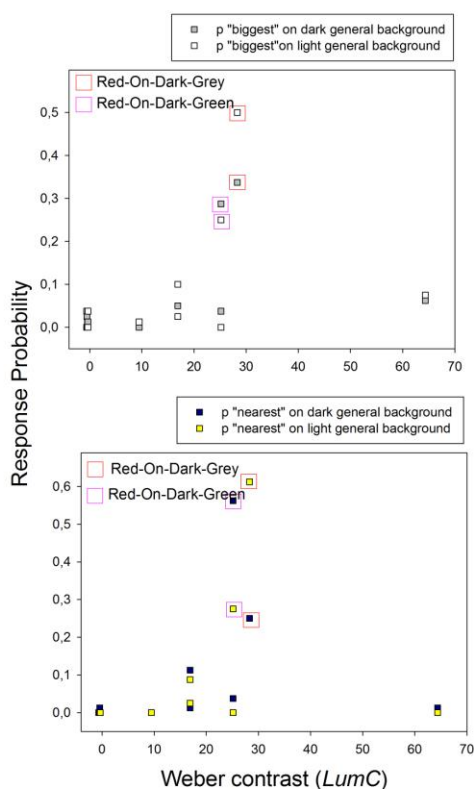


Figure 3. Response probability distributions for "biggest of all" and "nearest of all" as a function of local Weber contrasts (Weber Ratios) and general background condition from the *single pick* tasks.

IV. CONCLUSIONS

The results highlight complex interactions between color, local luminance contrast and global display background in the production of perceptual effects of subjective relative size and depth. Some of them, but not all, are predicted by current neural theories [6] [10] [15] [17] [18]. The subjective relative size of surface boundaries is significantly correlated with subjective depth, generating a perceptual 2D cue to 3D structure functionally equivalent to the "real", physically

grounded, monocular depth cue. Although not explicitly predicted by any of the neural models, this observation supports a specific class of computational models of relative surface depth from ambiguous contrast input generated by 2D contrast surfaces and their boundaries [7] [11] [15] [17]. The perceptual judgments from this study support the idea that the human brain is capable of producing functional perceptual representations of figure and ground by using a multitude of different local and global cues in the 2D image. Ambiguous image input is dealt with by effectively exploiting whatever cue to structure is available in the display. Absence of a specific physically grounded depth cue may be compensated for by perceptually generated cues that allow the brain to compute coherent depth representations on the basis of global perceptual sensation rather than merely the direct or strictly local visual processing of an existing stimulus parameter such as a physical difference in the size of 2D surface boundaries, for example. Also, the way in which contrast is computed to achieve perceptual 3D structure reaches well beyond local processing. As shown here, the lighter general backgrounds of the configurations, resulting in image representations with more than two 2D surface layers, systematically produced stronger subjective depth effects, irrespective of the local color or contrast of the reference surfaces and their immediate surrounds. This has potentially important implications for the development of effective visual interface technology for image-guided systems designed to assist human operators in precision tasks [16]. The results from this study are consistent with previous findings that the color red is the most likely to produce depth effects in simple figure-ground displays with only two 2D surface representations [3] [9]. Red surface color on an achromatic background, for example, possesses a clear competitive advantage over other colors such as green [9] or blue [12] in the likelihood to be perceived as closer to the human observer. As shown here, when more than two surface layers are present in an image configuration, the advantage of the surface color red for perceptual organization appears to depend on the contrast polarities of all the image regions surrounding the reference surface, not on the local reference-surround luminance contrast. This result is new and may seem surprising, yet, it is fully consistent with experimental evidence from other studies showing that many different cues may cooperate adaptively and non-locally in figure-ground segregation from 2D cues [19]. Physiologically inspired model approaches which simulate how figure-ground segregation may be computed by neural mechanisms "beyond the classic receptive field", involving long-range feedback interactions between cells with increasingly larger receptive fields in higher visual cortical areas beyond V1, V2, or even V4 [15] [19] [20], are in principle suitable to account for the non-local processing of figure-ground. However, it is not clear how these models would account for selective color effects, as those shown here. It is possible that these effects may be linked to psychological effects of selective attention to specific colors and/or color cognition in a more general sense [21] [22]. These are still poorly understood and need to be investigated further.

## ACKNOWLEDGMENT

The authors are grateful to Anne KELLY and Keith LANGLEY for helpful discussions.

## REFERENCES

- [1] L. Da Vinci, *Trattato della Pittura di Leonardo da Vinci*. Scritta da Raffaele du Fresne, Langlois, Paris, 1651.
- [2] G. E. Mount, H. W. Case, J. W. Sanderson, and R. Brenner, "Distance judgment of colored objects", *Journal of General Psychology*, vol. 55, pp. 207-214, 1956.
- [3] H. Egusa, "On the color stereoscopic phenomenon", *Japanese Psychological Review*, vol. 20, pp. 369-386, 1977.
- [4] M. Farnè "Brightness as an indicator to distance: relative brightness per se or contrast with the background?", *Perception*, vol. 6, pp. 287-293, 1977.
- [5] H. Egusa, "Effects of brightness, hue, and saturation on the perceived depth between adjacent regions in the visual field.", *Perception*, vol. 12, pp. 167-175, 1983.
- [6] S. Grossberg, "3D vision and figure-ground separation by visual cortex", *Perception and Psychophysics*, vol. 55, pp. 48-120, 1994.
- [7] B. Dresp, "On illusory contours and their functional significance", *Current Psychology of Cognition*, vol. 16(4), pp. 489-518, 1997.
- [8] B. Dresp, S. Durand, and S. Grossberg, "Depth perception from pairs of overlapping cues in pictorial displays", *Spatial Vision*, vol. 15, pp. 255-276, 2002.
- [9] C. R. C. Guibal and B. Dresp, "Interaction of color and geometric cues in depth perception: When does "red" mean "near"?" *Psychological Research*, vol. 10, pp. 167-178, 2004.
- [10] F. Qiu, T. Sugihara, and R. von der Heydt, "Figure-ground mechanisms provide structure for selective attention", *Nature Neuroscience*, vol. 11, pp. 1492-9, 2007.
- [11] B. Dresp and S. Fischer, "Asymmetrical contrast effects induced by luminance and colour configurations", *Perception & Psychophysics*, vol. 63, pp. 1262-1270, 2001.
- [12] B. Dresp-Langley and A. Reeves, "Simultaneous brightness and apparent depth from true colors on grey: Chevreul revisited", *Seeing and Perceiving*, vol. 25, pp. 597-618, 2012.
- [13] B. Dresp-Langley and A. Reeves, "Color and figure-ground: From signals to qualia", In S. Magnussen, M. Greenlee, J. Werner, A. Geremek (Eds.): *Perception beyond Gestalt: Progress in Vision Research*. Psychology Press, Abingdon (UK), pp. 159-71, 2014.
- [14] B. Dresp-Langley and A. Reeves, "Effects of saturation and contrast polarity on the figure-ground organization of color on gray", *Frontiers in Psychology*, vol. 5, pp. 1136, 2014.
- [15] S. Grossberg, "Cortical dynamics of figure-ground separation in response to 2D pictures and 3D scenes: How V2 combines border ownership, stereoscopic cues, and Gestalt grouping rules", *Frontiers in Psychology*, vol. 6, pp. 02054, 2015.
- [16] B. Dresp-Langley, "Principles of perceptual grouping: implications for image-guided surgery", *Frontiers in Psychology*, vol. 6, pp. 1565, 2015.
- [17] B. Dresp-Langley and S. Grossberg "Neural Computation of Surface Border Ownership and Relative Surface Depth from Ambiguous Contrast Inputs", *Frontiers in Psychology*, vol. 7, pp. 1102, 2016.
- [18] R. von der Heydt, "Figure-ground and the emergence of proto-objects in the visual cortex", *Frontiers in Psychology*, vol. 6, pp. 1695, 2015.
- [19] M. Dimiccolli, "Figure-ground segregation: a fully non-local approach. *Vision Research*, vol. 126, pp.308-317, 2016.
- [20] L. Spillmann, B. Dresp-Langley, and C. H. Tseng, "Beyond the classic receptive field: The effect of contextual stimuli", *Journal of Vision*, vol. 15, pp. 7, 2015.
- [21] T. Xia, L. Song, T. Wang, L. Tan, and L. Mo, "Exploring the effect of red and blue on cognitive task performances", *Frontiers in Psychology*, vol.7, pp. 784, 2016.
- [22] B. Dresp-Langley and A. Reeves, "Colour for behavioural success", *i-Perception*, vol. 9(2), pp. 1-23, 2018.