

Object grouping based on real-world regularities facilitates perception by reducing competitive interactions in visual cortex

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In virtually every real-life situation humans are confronted with complex and cluttered visual environments that contain a multitude of objects. Because of the limited capacity of the visual system, objects compete for neural representation and cognitive processing resources. Previous work has shown that such attentional competition is partly object based, such that competition among elements is reduced when these elements perceptually group into an object based on low-level cues. Here, using functional MRI (fMRI) and behavioral measures, we show that the attentional benefit of grouping extends to higher-level grouping based on the relative position of objects as experienced in the real world. An fMRI study designed to measure competitive interactions among objects in human visual cortex revealed reduced neural competition between objects when these were presented in commonly experienced configurations, such as a lamp above a table, relative to the same objects presented in other configurations. In behavioral visual search studies, we then related this reduced neural competition to improved target detection when distracter objects were shown in regular configurations. Control studies showed that low-level grouping could not account for these results. We interpret these findings as reflecting the grouping of objects based on higher-level spatial-relational knowledge acquired through a lifetime of seeing objects in specific configurations. This interobject grouping effectively reduces the number of objects that compete for representation and thereby contributes to the efficiency of real-world perception.

object perception | visual regularity | biased competition | chunking | natural scenes

In daily life, humans are confronted with complex and cluttered visual environments that contain a large amount of visual information. Because of the limited capacity of the visual system, not all of this information can be processed concurrently. Consequently, elements within a visual scene are competing for neural representation and cognitive processing resources (1, 2). Such competitive interactions can be observed in neural responses when multiple stimuli are presented at the same time. Single-cell recordings in monkey visual cortex revealed that activity evoked by a neuron's preferred stimulus is suppressed when a nonpreferred stimulus is simultaneously present in the neuron's receptive field (3–5). Corresponding evidence for mutually suppressive interactions among competing stimuli has been obtained from human visual cortex using functional magnetic resonance imaging (fMRI) (6).

According to biased competition theory, these competitive interactions occur between objects rather than between the parts of a single object (1). This idea of object-based competition is supported by behavioral studies showing that judgments on two properties of one object are more accurate than judgments on the same properties distributed over two objects (7). However, the degree of competition among objects is strongly influenced by contextual factors, such as stimulus similarity (8–10), geometric relationships between stimuli (11), and perceptual grouping (12, 13). For example, competitive interactions in human visual cortex

are greatly reduced when multiple single stimuli form an illusory contour and hence can be perceptually grouped into a single gestalt (12).

Whereas the attentional benefit of grouping based on low-level cues is well established, much less is known about object grouping at more conceptual levels. Many objects in real-world scenes occupy regular and predictable locations relative to other objects. For example, a bathroom sink is typically seen together with a mirror in a highly regular spatial arrangement. When considering highly regular object pairs like these it becomes clear that the world can be carved up at different levels: based on low-level cues such as those specified by gestalt laws, but also based on conceptual knowledge and long-term visual experience; a plate flanked by a fork and a knife is both a dinner plate set and three separate objects.

In the present fMRI and behavioral studies, we asked whether grouping based on real-world regularities modulates attentional competition. We hypothesized that objects that appear in frequently experienced configurations are, to some extent, grouped, resulting in reduced competition between these objects. To test this prediction, we presented pairs of common everyday objects either in their typical, regular configuration (e.g., a lamp above a table) or in an irregular configuration (e.g., a lamp below a table). Our findings indicate that grouping of objects based on real-world regularities effectively reduces the number of competing objects, leading to reduced neural competition and more efficient visual perception.

Results

fMRI Experiment. To measure competitive interactions between objects in human visual cortex, we followed the rationale of

Significance

A major challenge for visual perception is to select behaviorally relevant objects from scenes containing a large number of distracting objects that compete for limited processing resources. Here, we show that such competitive interactions in human visual cortex are reduced when distracters are positioned in commonly experienced configurations (e.g., a lamp above a dining table), leading to improved detection of target objects. This indicates that the visual system can exploit real-world regularities to group objects that typically co-occur; a plate flanked by a fork and a knife can be grouped into a dining set. This interobject grouping effectively reduces the number of competing objects and thus can facilitate the selection of targets in cluttered, but regular environments.

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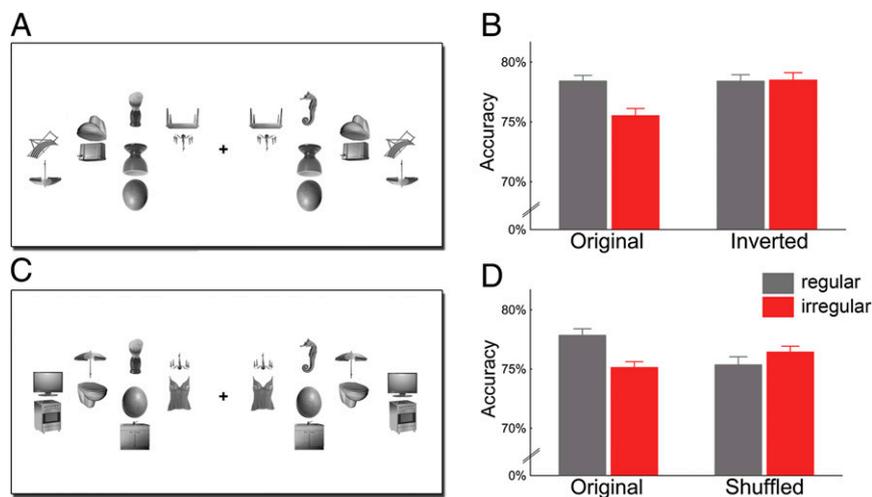


Fig. 3. Improved detection of targets among regularly positioned distracters cannot be explained by low-level grouping: when the distracter pairs were inverted (A), regular and irregular distracters led to comparable target detection accuracy (B). Also the relative position of single objects cannot account for the effect: when the top objects were interchanged between pairs (shuffled condition, C), the accuracy benefit for regular configurations disappeared (D). Original conditions are independent replications of the first experiment.

world situations where multiple but often regularly positioned distracter objects compete for visual representation.

Previous studies have demonstrated that contextual factors can reduce competitive interactions among simple, artificial stimuli that were perceptually grouped based on physical similarity, geometric relationships, or gestalt principles (12, 13). Distracters that can be grouped based on such low-level cues can be rejected at once rather than on an item-by-item basis, leading to enhanced target detection (16–22). For example, when distracters can be grouped by color, search performance depends on the number of distracter groups rather than on the number of individual distracters in each group (17). Our results show that benefits of grouping are not limited to grouping based on low-level cues, but that these can also be observed for grouping based on knowledge about the typical spatial relations between objects in our visual environment.

The present way of measuring neural competition closely resembles the logic of monkey electrophysiology work on attentional competition (3–5), in that we recorded neural activity to a region's preferred stimuli in the presence of competing nonpreferred stimuli. Reduced neural competition from non-preferred stimuli was reflected in an increased PPA response to the region's preferred house stimuli when the PPA's non-preferred object stimuli could be grouped based on real-world regularities. The sequential presentation condition, in which houses and objects did not compete for attention, provided an important control, showing that the increased PPA response was not driven by response differences between the regular and irregular object pairs themselves.

This raises the interesting question of whether there are brain regions that differentially respond to regular and irregular object pairs. None of our regions of interest (ROIs) showed such a difference, and no regions were found in a whole-brain analysis testing for the main effect of pair configuration (*SI Text*). Previous work that tested for response differences as a function of action relations between objects (e.g., a hammer positioned to hit a nail) provided evidence for greater LO activity to interacting objects than to noninteracting objects (23, 24). Patient and transcranial magnetic stimulation studies further showed that action relationships are processed independently of attentional influences from parietal cortex (25, 26). Together with the absence of grouping effects in LO in the current study, these previous findings suggest a special status of object grouping based

on action relations (26). Future studies are needed to test this notion, directly comparing effects of grouping based on real-world regularities, action cues (23, 24), and more basic perceptual cues (27–30).

Beneficial effects of grouping are not limited to object perception and attentional competition but have also been observed in studies of visual working memory (VWM). Similar to its effects on attention, low-level grouping has been shown to enhance VWM capacity (31, 32). Recent studies have started to investigate VWM grouping based on statistical regularities in relative stimulus positions (33): stimuli that appeared in regular combinations were better remembered (34, 35), as if they had been compressed into a single VWM representation. An interesting avenue for future study will be to test whether VWM capacity is similarly enhanced for real-world object pairs like those used here, as suggested by accurate memory for objects in natural scenes (36).

The reduced competition from regularly positioned objects demonstrated in the present study may constitute a powerful neural and perceptual mechanism to contend with the multitude of visual information contained in real-world scenes. The present findings could thus contribute to the understanding of perceptual efficiency in real-world scenes: Target detection in natural scenes is surprisingly efficient considering the large number of distracter objects present in real-world environments (37). As an explanation for this efficiency, it has been proposed that scene context guides attention to likely target locations (38, 39). For example, we look above the sink when searching for a mirror. Such contextual guidance can stem from implicit or explicit memory for specific target locations within a specific context (38–40), global scene properties (41, 42), and also from relations between target and nontarget objects (43, 44). At a general level, the current results might similarly reflect the learning of real-world correlational structure. However, our study differs from previous work in that it addressed the grouping of distracter objects independently of their role in guiding attention toward the search target, as the targets were completely unrelated to the distracters. Thus, such high-level grouping of objects forms an additional mechanism likely to support efficient target detection in cluttered real-world environments. Future studies are needed to extend our findings to attentional selection in real-world scenes. Because scenes contain a large number of objects that occur in regularly positioned groups of two or more objects, grouping of

appeared in either the regular or the irregular configuration. In experiment 1, participants completed eight blocks of the task. In experiment 2, we exactly replicated experiment 1, and additionally included blocks with inverted object pairs, in which all distracter pairs were presented upside down (i.e., rotated by 180°), whereas the single objects appeared in normal orientation. This inverted condition was included to control for the potential influence of low-level grouping effects, as inversion disrupts the object pairs' configuration, although all low-level properties are identical to the original upright pairs. In experiment 3, blocks with "shuffled" pairs were included, in which the top and bottom items of the pairs were recombined into new pairs.

These shuffled pairs (e.g., computer screen above stove) did not form typical spatial configurations, whereas the actual position of individual objects was identical to the original upright pairs. Thus, the inclusion of this shuffled condition allowed us to control for the potential influence of the actual position of single objects within pairs.

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