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Multiple spatial frames for immersive working memory

Dejan Draschkow^{[],2}, Anna C. Nobre^{[],2} and Freek van Ede^{[],3}

As we move around, relevant information that disappears from sight can still be held in working memory to serve upcoming behaviour. How we maintain and select visual information as we move through the environment remains poorly understood because most laboratory tasks of working memory rely on removing visual material while participants remain still. We used virtual reality to study visual working memory following self-movement in immersive environments. Directional biases in gaze revealed the recruitment of more than one spatial frame for maintaining and selecting memoranda following self-movement. The findings bring the important realization that multiple spatial frames support working memory in natural behaviour. The results also illustrate how virtual reality can be a critical experimental tool to characterize this core memory system.

magine gaining possession of the ball in your favourite game and turning to approach the goal. As you turn, team members disappear from sight. Checked by defenders, and with no time to look around, you make a no-look (blind) pass to one of those team members. Your success depends on two core cognitive abilities: maintaining previously visible team members in memory (after turning) and selecting the appropriate team member (given the defence).

We have poor understanding of how we maintain and select visual information in working memory¹ in the context of natural behaviour²⁻⁷, when information disappears out of sight due to self-movement. This is because, in the laboratory, maintenance⁸⁻¹² and selection¹³⁻¹⁵ of visual information in working memory are traditionally investigated in static settings in which visual material is briefly 'flashed' on a computer monitor while participants remain still. In such constrained settings, visual material is removed from view artificially, and the spatial relations between the observer and the memoranda remain fixed. By contrast, following self-movement, visual material usually remains present in the environment, but is rendered out of sight because the spatial relations between observer and environment change^{16,17}.

Such cases raise interesting questions regarding the nature of the spatial reference frames^{16,18-25} that support the maintenance and selection of information in working memory in service of upcoming behaviour. For example, it is well-established from studies in long-term^{26,27} and trans-saccadic memory²⁸⁻³¹ that multiple spatial frames (such as egocentric and allocentric) cooperate. This literature has brought the important realization that usually not single, but multiple spatial frames are constructed, which enable efficient actions in our environment³². However, little is known about the natural use of and reliance on equivalent spatial frames in immersive working memory—when memorized information disappears from view due to our own movements, but where this information continues to hold relevance for guiding ensuing behaviour.

Do memoranda in visual working memory following selfmovement remain anchored in their spatial positioning relative to other memoranda at encoding, or are memorized locations updated 'in mind' to reflect locations in the external environment? Moreover, might more than one spatial frame be used for maintaining and selecting visual contents in working memory, and does it matter how the visual contents disappear from sight (removed artificially versus following self-movement)?

Here, we used virtual reality (VR) to answer these questions, bypassing traditional laboratory-task constraints to investigate working memory in an immersive context following self-movement.

The recent discovery that small directional biases in gaze track attentional focusing of memorized visual locations^{33,34} provided an exciting new sensitive and continuous metric for investigating the spatial frame(s) used to maintain and select visual information in working memory following self-movement. One particular strength of this approach was that it allowed us to do so without having to explicitly ask participants about the locations of their memory content.

Results

Internal selective attention biases gaze towards memorized item locations in VR. As a first step, we confirmed that gaze bias could be measured when selecting visual contents in working memory in VR. Participants viewed two coloured tilted bars that appeared briefly on the front wall of the virtual room and reproduced the orientation of one bar after a working-memory delay (Fig. 1a). To cue which bar (item) to report, the colour of the central fixation cross changed to match the colour of either memorized bar. Participants then used a hand-held controller to reproduce the precise orientation of the cued bar on a dial appearing around fixation.

Despite the cue and the dial appearing centrally (and despite us never asking participants about the location of the cued memory item), participants' gaze became biased in the direction of the memorized location of the cued (selected) memory item. When the cued item had previously occupied the left position, gaze was biased to the left, whereas when the cued item had occupied the right position, gaze was biased to the right (Fig. 1b). Our measure of towardness captured this 'gaze bias' in a sensitive and time-resolved manner (Fig. 1c; cluster-based permutation analysis³⁵; cluster P < 0.001; Bayes Factor (BF₁₀) = 24738.79 for the 400–1,000 ms post-cue 'selection' period). A density map of gaze positions (contrasting selection of items encoded on the left versus the right) confirmed that

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Fig. 1 Basic working memory task in VR and gaze signature of selection in working memory. a, Twenty-four participants were immersed in a virtual room and memorized the tilt of two coloured bars. After a delay, a change in fixation-cross colour cued participants to report the colour-matching item using the hand-held controller. b, Horizontal gaze after cues for left/right memory items (zero denotes perfect fixation; $\pm 2 \text{ cm} = \pm 0.57^{\circ}$). Shaded areas indicate ± 1 s.e.m. **c**, Gaze bias, expressed as 'towardness'. Horizontal line indicates cluster significance³⁵. **d**, Difference in gaze density (Δ) following cues for right minus left items (400–1,000 ms post cue). Circles indicate item locations at encoding (centred at $\pm 100 \text{ cm}/\pm 28.7^{\circ}$). The inset shows a close-up view. Data are from the no-rotation condition in Experiment 1. See Supplementary Fig. 1 for corresponding data from the no-rotation condition in Experiment 2–4.

this bias was constituted by small displacements in gaze toward the original location of the selected memorandum (Fig. 1d), in line with our prior report³³. Note how this phenomenon is distinct from prior reports of gaze shifts all the way to the original location of the memorized objects, such as those observed in the context of long-term memory retrieval and imagery^{36–38}. Rather, they resemble (related) reports of small biases in fixational gaze behaviour, as also seen during attentional focusing in perceptual tasks^{39–41}. All four working-memory experiments replicated this basic pattern of results in the corresponding no-rotation condition (Supplementary Fig. 1).

The sensitivity and reliability of the spatially indexed gaze bias in VR pave the way for investigating spatial working-memory frames in immersive contexts involving self-movement. In what follows, we present three manipulations (https://doi.org/10.6084/ m9.figshare.16859656.v1) that directly and systematically varied the spatial relations between the observer and the environment in an increasingly realistic manner. The series of experiments (see Supplementary Table 1 for an overview) culminated in the central discovery that multiple spatial frames support immersive working memory during maintenance and selection.

Gaze biases reveal multiple spatial frames for immersive working memory following rotation. In the first experiment, we manipulated the relative spatial positions of the observer and environment by rotating the room during the working-memory delay. The front wall, on which the bars had been presented at encoding, moved to either the left or the right of the participant during the memory delay (Fig. 2a; https://doi.org/10.6084/m9.figshare.16859728.v1). Participants themselves remained in place and were asked to hold fixation on a central cross, which remained fixed. We confirmed that participants could still perform the working-memory task well following a room rotation (Supplementary Fig. 2).

What is the relevant spatial frame for working memory following rotation? Toward what location will gaze be biased? For example, following a rightward room rotation, the environmental location associated with the 'left' memory item will now be to the 'right' of the participant. To formalize this question, we considered two possible spatial frames used for working memory. One pertains to the items' relative positioning as encoded into memory (that is, the left versus right item, regardless of rotation). The other pertains to the items' locations in the external environment (for example, at the left versus right wall, contingent on rotation). We refer to these spaces as 'internal-content space' and 'external-environment space', respectively (illustrated in Fig. 2b,c). Because we manipulated left/right item cues and left/right rotations orthogonally, we were in a position to track evidence for both spatial frames independently.

Experiment 1 tested whether gaze bias remained anchored to the relative original positions of the items, or instead was updated to track the assumed current location of the item in the environment. To quantify this, we constructed separate measures of towardness for each of the aforementioned spaces: one indexing gaze bias toward the left/right cued item (internal-content space) and one indexing gaze bias toward the wall containing the items before the room rotated to the left or right (external-environment space). Following room rotation, we observed a clear gaze bias in internal-content space (Fig. 2b; cluster P < 0.001; BF₁₀ = 3442.982 for the 400–1,000 ms post-cue selection period). Even after the room had rotated, participants' gaze after the cue was still pulled toward

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Fig. 2 | Spatial frames for maintaining and selecting visual information following self-movement. a, Horizontal gaze following cues for left/right items, separately for left/right room-rotation conditions in Experiment 1 (https://doi.org/10.6084/m9.figshare.16859728.v1). **b,c**, Gaze bias relative to whether the left/right item was cued (**b**) or whether the items had been presented on the left/right wall prior to rotation (**c**). **d-i**, Equivalent data following participant-rotation conditions in Experiments 2 (**d-f**, https://doi.org/10.6084/m9.figshare.16859743.v1) and 3 (**g-i**, https://doi.org/10.6084/m9.figshare.16859857). In comparison with Experiment 2, in Experiment 3 items remained visible during rotation, becoming 'out-of-view' because of self-movement (https://doi.org/10.6084/m9.figshare.16859656.v1). The horizontal purple line (**i**) indicates comparison between Experiments 2 and 3. Grey timeline boxes (top left) indicate rotation-manipulation and cue-locked-analysis windows. Rotation ended 1,750-2,250 ms prior to cue onset in Experiment 1 and 1,150 ms in Experiments 2 and 3. The earliest sample (at -500 ms) in our analysis window in the post-rotation memory period was therefore always 650 ms after the fixation cross had stabilized in its new position (and always 835 ms after the bars were removed in Experiment 3, in which the bars remained present during the first part of the rotation). Shaded areas indicate ± 1 s.e.m.

the relative left/right positions in internal-content space (Fig. 2a,b, cf. Fig. 1b,c). By contrast, there was moderate evidence (BF₁₀=0.26) for a lack of gaze bias in the external-environment space during the post-cue selection period (400–1,000 ms), and anecdotal evidence

 $(BF_{10}=0.35)$ for no bias during the -500 to 0 ms pre-cue 'maintenance' period (Fig. 2c; P>0.612 for all clusters of the full time window). The same pattern was observed when the items remained visible during the room rotation (Supplementary Fig. 3).

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In Experiment 2, we increased the ecological validity of the manipulation. Rather than rotating the room, we instructed participants to turn themselves during the working-memory delay (Fig. 2d; https://doi.org/10.6084/m9.figshare.16859743.v1). We asked participants to follow the fixation cross, which moved from the front wall to the wall on the left or right. This yielded equivalent changes in the spatial relations between the memorized information at visual encoding and after rotation as in Experiment 1, but this time induced by self-movement. Participants were still able to perform the task well above chance (Supplementary Fig. 2).

We again found a clear gaze bias in internal-content space after the cue to select the left versus right item (Fig. 2d,e; cluster P < 0.001; BF₁₀=28.61 for the 400–1,000 ms post-cue selection period). Interestingly, we now also started to see signs of a gaze bias in the external-environment space (Fig. 2f). However, the evidence for this was anecdotal in Experiment 2 (cluster P=0.046; BF₁₀=1.94 for the 400–1,000 ms post-cue selection period and BF₁₀=0.5 for the -500 to 0 ms pre-cue maintenance period).

In Experiment 3, the final critical step was taken to simulate real-world visual working memories formed by self-motion in the environment. As in most natural situations, the memory items remained in the environment, rather than only being flashed briefly (Fig. 2g; https://doi.org/10.6084/m9.figshare.16859857)-differing from Experiments 1 and 2, as well as from traditional laboratory tasks of visual working memory. The memory items remained visible on the front wall until after participants turned to an adjacent wall as prompted. Accordingly, in Experiment 3, self-movement (rotation) of the participant made the visual information disappear from sight (that is, 'memory because we move away'). To avoid any 'looking back' as a potential strategy^{5,42}, however, the bars were removed from the wall eventually (after they had disappeared from view through self-movement), which was made explicit to the participants. Thus, during and after the rotation, the impression was that the items remained on the wall from which they rotated away (even if participants knew that the items were removed after becoming out of view). We again found that participants could perform the task well (Supplementary Fig. 2).

As in Experiments 1 and 2, we observed a clear gaze bias in internal-content space after the cue to select the left or the right memory item (Fig. 2g; towardness in Fig. 2h; cluster P < 0.001; $BF_{10} = 1447.6$ for the 400–1,000 ms post-cue selection period). Critically however, this time, we also observed a pronounced gaze bias in the direction of the location of the memory items in the external environment (Fig. 2g; towardness in Fig. 2i; cluster P < 0.001). Interestingly, the bias in external-environment space was already present prior to the selection cue $(BF_{10} = 16.25 \text{ for the})$ -500 to 0 ms pre-cue maintenance period), during the maintenance of both visual items in working memory after the rotation. It did, however, persist throughout the selection period, suggesting that the two spatial frames cooperated when visual content was selected ($BF_{10} = 6.93$ for the 400–1,000 ms post-cue selection period). If the participant rotated to the wall on the left, gaze was pulled slightly rightward, back toward the central wall that had contained the two bars at encoding (Fig. 2g, left). Likewise, if the participant rotated to the right, gaze was pulled leftward (Fig. 2g, right). This bias in external-environment space comprised a 'pull' of gaze (Fig. 3), similar in magnitude to that subsequently observed for the internal-content bias during item selection (Fig. 1d and Supplementary Fig. 1).

We could compare data from Experiments 2 and 3 directly (grey and black time courses in Fig. 2i), because we ran these experiments as a within-participant manipulation (Experiment 2 versus Experiment 3) with the same locomotive demands. We found that the bias during the maintenance period in externalenvironment space was significantly greater when the items disappeared from sight because of self-movement, as opposed to before

Fig. 3 | Density plot for Experiment 3. Difference in gaze density (Δ) between rotations to the left versus right wall in the pre-cue period (-500 to 0 ms) as indicated in the grey box in the timeline at the top. The inset shows a close-up, overlaid on the fixation cross. Similar to the gaze bias in internal-content space (Fig. 1d), this bias in space comprised a 'pull' of gaze (as opposed to large saccades) toward the wall that had contained the memorized items (external-environment space).

self-movement (Experiment 3 versus Experiment 2; Fig. 2i, purple horizontal line; cluster P=0.01; BF₁₀=14.9 for the -500 to 0 ms pre-cue maintenance period; for the 400–1,000 ms post-cue selection period there was moderate evidence, BF₁₀=0.3, in favour of no difference). The more realistic nature by which the memory items disappeared from view (during versus preceding the participant's rotation) thus appeared to increase the reliance on external-environment space—as reflected in our gaze measure during memory.

These biases were observed after the visual array was no longer available and during a period with no stimulation. The first point in the pre-cue period we analysed and visualized (at -500 ms before the cue) was always 835 ms after the items were removed from the wall and 650 ms after the fixation cross stabilized in its new position (at 1,335 and 1,150 ms pre-cue respectively). Participants also knew that the items were removed after becoming out of view. Thus, we associated gaze behaviour in our experiment in this period to directing attention in memory, rather than actually looking back at physically present items^{5,42}.

We could replicate the reliance on the two spatial frames from Experiment 3 in replication Experiment 3b (Supplementary Fig. 4). This further allowed a within-subject comparison of the bias in external-environment space between Experiment 3b and its matched control Experiment 3c, from which we stripped the need to use working memory while retaining the same locomotive demands (Supplementary Fig. 4A). In a similar vein as the comparison between Experiments 2 and 3, this confirmed that this bias in the external-environment space was modulated by memory demands (Supplementary Fig. 4C; cluster P = 0.031; BF₁₀ = 5.63 for the -500 to 0 ms pre-cue maintenance period), being stronger in rotation trials with (Experiment 3b) versus without (Experiment 3c) demands on memory. Importantly, although these data do not rule out the possible contribution of other factors to the overall bias in the external-environment space (such as VR-related⁴³ or other rotation-related effects on eye movements), the comparisons between experimental conditions differing only in memory demands reveal that at least part of this bias must be attributed to the memory-related demands of the task.

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Fig. 4 | Increasing memory demands increases reliance on both spatial frames. a, In Experiment 4, we manipulated the number of to-be-maintained items (two versus four), while again asking 24 participants to rotate away from the memory material, which remained visible throughout the rotation. Four bars were always presented (top, left, right, bottom) and participants were asked to remember only the coloured bars. In load 4, all bars were coloured. In load 2, only the left and right bars were coloured, and the top and bottom bars were grey (serving as fillers). **b**,**c**, Gaze bias relative to whether the left/right item was cued (**b**) or the items had been presented on the left/right wall prior to rotation (**c**). Horizontal purple lines (**b**,**c**) indicate comparison between memory loads 2 and 4. Shaded areas indicate ± 1 s.e.m. **d**, Bias in external-environment space averaged for the –500 to 0 ms pre-cue maintenance period and the 400-1,000 ms post-cue selection period. Lines represent individual participants and error bars indicate s.e.m.

Memory load increases reliance on multiple spatial frames for immersive working memory. If the biases in gaze reflect memory reliance, then we would expect them to increase with memory load¹¹. To test this, we conducted an experiment in which we manipulated memory load (Experiment 4; Fig. 4). Participants maintained two or four items and rotated away from the memory material, which remained visible throughout the rotation (as in Experiments 3 and 3b). Moreover, by using item-configurations as depicted in Fig. 4a, we ensured that the last visible item during the rotation was matched between load 2 and load 4 conditions.

The results confirmed a dependence of the towardness biases on memory demands. In addition to replicating the reliance on two spatial frames, gaze biases were significantly modulated by memory load.

First, there was a clear gaze bias in internal-content space after the cue to select the left or the right memory item (Fig. 4b) for both memory load 2 (grey time course in Fig. 4b; cluster P < 0.001; BF₁₀=3598.309 for the 400–1,000 ms post-cue selection period) and memory load 4 (black time course in Fig. 4b; cluster P < 0.001; BF₁₀=13737.02 for the 400–1,000 ms post-cue selection period). Comparison of gaze biases in loads 2 and 4 confirmed that increasing memory load increased the reliance on internal-content space (Fig. 4b, purple horizontal line; cluster P < 0.001; BF₁₀=27.119 for the 400–1,000 ms post-cue selection period).

We again observed a gaze bias in the direction of the location of the memory items in the external environment for both memory load 2 (grey line in Fig. 4c; towardness in Fig. 2i; cluster P < 0.001; BF₁₀=4.145 for the 400–1,000 ms post-cue selection period and BF₁₀=61.539 for the -500 to 0 ms pre-cue maintenance period) and memory load 4 (black line in Fig. 4c; towardness in Fig. 2i; cluster P < 0.001; BF₁₀=22772.24 for the 400–1,000 ms post-cue selection period and BF₁₀=889.342 for the -500 to 0 ms pre-cue maintenance period). Critically, comparison of gaze biases in loads 2 and 4 confirmed that increasing memory load also increased the reliance on external-environment space (Fig. 4c,d, purple horizontal line; cluster P < 0.001; BF₁₀=16607.71 for the 400–1,000 ms post-cue selection period and BF₁₀=46.082 for the -500 to 0 ms pre-cue maintenance period). These patterns were observed despite the fact

that rotation demands (and the last visible item during rotation) were equated between loads, thus providing further evidence for a link between these biases and memory-related processes.

Discussion

Using VR and systematically approximating the immersive nature of everyday working-memory demands, we learned that visual working memory relies on not one, but at least two spatial frames. These frames were observed while participants maintained and selected visual contents in working memory. We speculate that the two spatial frames may reflect (at least in part) complementary roles served by both maintenance and selection following self-movement in our tasks—pertaining to, respectively, a global frame for remembering where memorized information is (in the environment), and a specific frame that allows us to discriminate and select which information (in memory) is currently needed to guide behaviour.

We found clear reliance on the internal-content space during the selection period in all tested cases. However, reliance on the external-environment space—as reflected in gaze—varied according to the perceived availability of the items and self-movement. Although participants engaged in memory maintenance in each experiment, the towardness gaze bias was especially pronounced in naturalistic cases following self-movement, when items seemed to remain available in the environment. We believe that the use of these two spatial frames for specific working-memory operations will ultimately depend on the nature of the task at hand. Indeed, when memory load increased from two to four items, gaze bias in the external-environment space became amplified during both maintenance and selection. These results directly show that internal selection can rely on multiple spatial frames, and that this joint reliance is increased with higher memory demands.

From related research on long-term memory, we have come to appreciate how multiple reference systems cooperate in complex ways to support natural long-term memory representations^{23,25,26,44}. Among the various critical determinants on the relative importance of each frame of reference are landmarks, spatial structure and viewpoints at encoding and retrieval. We expect these factors to carry over their importance in the realm of working-memory

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representations, though this remains to be addressed in future research. To this end, the current approach provides an ideal starting point for also probing the dynamics of maintenance and selection of working-memory content in the context of even richer environments, with even richer spatial contexts, to better approximate the type of situations faced by our working-memory system in everyday life.

In the study of the spatial frames used for memory, a common approach is to ask participants explicitly where they remember something to be and, for example, to point to it^{44,45}. Such approaches can uncover the (multiple) spatial frames that come into play when deliberately reporting a memorized object's location. Such approaches, however, do not address whether these frames are also used during everyday behaviour when space is an implicit component of the task at hand. In our study, we never asked participants about the memorized location of their working-memory contents (we only asked about the orientation of the memory content whose colour matched the cue; regardless of its spatial position at encoding). Yet we found clear spatial biases in gaze behaviour. Through these implicit biases, we were able to interrogate and uncover the natural use of two complementary spatial frames for immersive working memory following self-movement.

Studying working memory after self-movement is important not only because it better approximates reality^{4,5,46}, but also because it can expose phenomena that otherwise go unnoticed. The gaze bias in external-environment space became apparent particularly when the visual information disappeared from view as a result of the participant's own rotation. This, in turn, helped reveal that overt gaze behaviour is not only sensitive to internal processes of content selection (as per our previous report of this gaze bias³³) but may also be sensitive to content maintenance in immersive visual working memory.

In recent years, VR⁴⁷ has become a go-to tool for investigating long-term memory and spatial navigation^{21,48–53}. By contrast, the use of VR for investigating working memory remains rare⁵. Our study makes clear that VR—here combined with eye-tracking—is indispensable for understanding the nature and mechanisms of this core memory system in the context of natural behaviour.

Methods

The results of Experiments 1–4 are presented in the main text, whereas the remaining experiments are presented in the Supplementary Information.

Participants. We ran seven experiments, each with a sample size of 24 healthy human volunteers. We recruited participants separately for Experiment 1, Experiments 2-3, Experiments 3b-3c, as well as Experiment 4 and the control experiment (Experiment 1: mean age = 25.8 years, age range = 18-40 years, 20 female, all right-handed; Experiments 2-3: mean age = 26.5 years, age range = 19-36 years, 19 female, all right-handed; Experiments 3b and 3c: mean age = 25.5 years, age range = 19-37 years, 13 female, 1 left-handed; Experiment 4 and control experiment: mean age = 26.7 years, age range = 21-31 years, 14 female, all right-handed). Sample size was set based on our prior study that contained four experiments using a similar outcome measure³³ and revealed robust results with 20-25 participants. Here, we set sample size to 24 to enable counterbalancing the order of tasks in Experiments 2-3 and 3b-3c. In total (across all experiments), four participants dropped out during the practice session because of nausea43, All participants had normal or corrected-to-normal vision and reported no history of neurological or psychiatric disorders. Participants received financial compensation (£10 per hour) and provided informed consent prior to participating in the experiment. Protocols were approved by the local ethics committee (Central University Research Ethics Committee #R64089/RE001).

Apparatus and virtual environment. Participants wore an HTC Vive Tobii Pro VR integration with a built-in binocular eye tracker with an accuracy of ~0.5° visual angle. We tracked gaze position in three-dimensional space at a sampling rate of 90 Hz. Gaze position in three-dimensional space was obtained by intersecting the gaze vector with items in the environment (https://docs.worldviz.com/vizard/latest/#Tobii.htm). The head-mounted display (HMD) consisted of two 1080 × 1200 pixel resolution organic light-emitting diode (OLED) screens (refresh rate = 90 Hz, field-of-view = 100° horizontally × 110° vertically). The locations of the headset and hand-held controller were tracked with sub-millimetre precision

using two Lighthouse base stations that emitted 60 infra-red pulses per second, which were detected by 37 infra-red sensors in the HMD and 24 in the controller. Tracking was further optimized by an accelerometer and a gyroscope embedded in the HMD. A trigger button (operated with the index finger) and a touchpad button (operated with the thumb) on the wireless controller were used for response collection.

The virtual environment was presented and rendered with Vizard 6 by WorldViz on a high-performance laptop running Windows 10. The environment consisted of a 420 × 420 cm² room with a ceiling height of 250 cm. The same homogenous texture (https://osf.io/stf4w/) was applied to all walls, creating a concrete-like appearance (Fig. 1a; https://doi.org/10.6084/m9.figshare.16859656. v1). Participants were situated in the centre of the cubic room. Three-dimensional cylinder stimuli (which we will refer to as 'bars' for simplicity) were presented at a distance of 200 cm from the centre of the room, 10 cm in front of the wall.

Procedure and tasks. Upon arrival, participants were familiarized with the HMD, the wireless controller and the lab space. Participants completed a short practice session, including 24 practice trials, during which they were accustomed to both the HMD and the testing procedure.

All experiments involved the same basic procedure (Fig. 1a). Each trial began with the presentation of a fixation cross for 500 ms. The fixation cross subtended \sim 3.4° of visual angle (12 cm) in both width and height. Two oriented bars then appeared 100 cm to the left and to the right of the central fixation cross (200 cm in front of the participant). Bars were 50 cm (14.25°) in length and 5 cm (1.425°) in width and depth. One of the bars was always red and the other always blue, which was randomly sampled. Bars were presented for 250 ms in Experiment 1, for 1,000 ms in the control experiment, for 500 ms in Experiment 2 and for 1,600 ms in Experiments 3–3b (no bars were presented in Experiment 3c). In Experiment 4, four bars were presented (green, purple, blue, orange or grey) for 2,100 ms.

The participant had to memorize the orientation of the bars (drawn independently at a random orientation), in order to reproduce the orientation of either bar after a working-memory delay. At the end of the trial, a colour change of the central fixation cross (the 'memory cue') instructed participants to select and report back the corresponding bar.

The critical manipulations occurred during the working-memory delay, after encoding the visual material but well before we cued either memory item for report (see Supplementary Table 1 for an overview). The environment either rotated around the participant (Experiment 1) or the participant was asked to rotate to face an adjacent wall, by following the movement of the fixation cross (Experiment 2–4). Video material of example trials are presented in https://doi.org/10.6084/m9.figshare.16859656.v1. In all experiments, one-third of trials contained a left rotation, one-third contained a right rotation, and one-third contained no rotation (randomly intermixed).

In Experiment 1, the environment rotated around the participant (that is, Euler rotation) at 180° s⁻¹ for 500 ms for a total rotation of 90° (https://doi.org/10.6084/m9.figshare.16859728.v1). The rotation occurred immediately after the visual offset of the items. In the control experiment (Supplementary Fig. 3), the items remained on the wall during rotation, rendering the bars out of sight due to the rotation rather than due to a sudden visual offset. In Experiment 1, the fixation cross remained positioned centrally in front of the participant, and participants performed this task seated. In the control experiment (Supplementary Fig. 3), participants were standing to better match the critical Experiments 3–3b in which the items also remained visual until after the rotation.

In Experiments 2-4, the environment remained stable and participants were asked to rotate instead (https://doi.org/10.6084/m9.figshare.16859743.v1 and https://doi.org/10.6084/m9.figshare.16859857). In rotation trials, the fixation cross started moving 500 ms (1,000 ms in Experiment 4) after the onset of the visual bars, from the centre of the front wall to the centre of the left or right adjacent wall. Participants were in an upright (standing) position and were instructed to follow the fixation cross, which required rotation of the head and torso. Movement of the fixation cross occurred at a speed of 220 cm s⁻¹, and took ~1,285 ms to travel a distance of ~283 cm. In Experiment 2 the visual bars were removed from sight 500 ms after encoding. By contrast, in Experiments 3, 3b and 4, the bars remained present on the front wall for an additional 1,100 ms during the rotation. This created the visual impression that the items remained on the wall from which participants rotated away, rendering the bars out of sight due to the self-movement rather than due to a sudden visual offset. Participants, however, were informed that the items would eventually disappear (after the rotation) and also experienced the disappearance during non-rotation trials.

Experiments 3 and 3b were identical in set-up, except that Experiment 3 was paired with Experiment 2, whereas replication Experiment 3b was paired with the perceptual-control Experiment 3c (in both cases enabling within-subjects comparisons). In Experiments 2–3 participants were asked to follow the fixation cross with no further instructions, whereas in Experiments 3b–3c participants were explicitly instructed to follow the fixation cross by only rotating their head and torso. Despite this difference, the results support the same conclusion, regardless of whether we based our inference on the critical Experiment 3 ('participant rotates, items remain') or the otherwise identical Experiment 3–3b depended

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on memory demands, we compared working-memory Experiment 3b with perceptual-control Experiment 3c (Supplementary Fig. 4A). Experiment 3c was procedurally identical to Experiment 3b, except that participants were not required to maintain and select items from memory because no bars were presented during the trial. Instead, participants were instructed to press a button as soon as the fixation cross changed colour—with the two potential colours associated with a different instructed button. Thus, what served as the memory ue in Experiments 1–3b, served as a perceptual target in Experiment 3c. The assignment of a button (touchpad versus trigger) to a target colour (blue versus red fixation cross) was counterbalanced across participants.

Experiment 4 was similar in set-up to Experiment 3 but to provide further evidence for the influence of 'memory demands', we manipulated the number of to-be-maintained items (Fig. 4). Four bars were always presented (always at the top, left, right, bottom; see Fig. 4a), and participants were asked to remember only the coloured bars. In load 4, all bars were coloured. In load 2, only the left and right bars were coloured, and the top and bottom bars (that now served as fillers) were grey. Load 2 and load 4 trials were randomly intermixed. We chose to add a central top and bottom item to move from load 2 to load 4, because this configuration allowed us to match load 2 and load 4 conditions with regard to the last visible item during rotation—that would always be the left or the right memory item.

The room rotation in Experiment 1 was followed by a further memory delay of between 1,750 and 2,250 ms (uniformly sampled) before the memory cue was presented (1,150 ms in the control experiment to match the critical Experiments 3–3b). In Experiments 2–4 the movement of the central fixation cross was always followed by an additional memory delay of 1,150 ms before the memory cue (Experiments 2–4) or perceptual target (Experiment 3c) was presented. The earliest sample (at 500 ms prior to the cue) in our analysis window in the post-rotation memory period was thus always 650 ms after the fixation cross had stabilized in its new position (and always 835 ms after the bars were removed in Experiments 3, 3b and 4 in which the bars remained present during the first part of the rotation).

In each trial, both bars were equally likely to be cued for report, independent of their colour, orientation or location. Participants had unlimited time to initiate a response after the memory cue onset. The response dial consisted of a circular torus (50 cm/14.3° in diameter + 1 cm tube radius) with two small spherical handles (3 cm radius) that could be realigned to match the memorized orientation of the cued bar. Dial-up was performed with the wireless controller, operated with the dominant hand. The orientation of the controller was linked directly to the response dial allowing for an intuitive orientation report. The response dial appeared on the screen only at response initiation (that is, movement initiation) and was always positioned around the central fixation cross. Participants had a maximum of 2,000 ms to complete their dial-up report and could complete the report earlier by pressing the trigger button with their index finger. Feedback followed immediately after response termination by presenting the performance (reproduction error scaled between 1 and 100, with 100 reflecting perfect reproduction) above the fixation cross for 500 ms. Finally, after feedback presentation, either the environment (Experiment 1 and control experiment) or the participant (Experiments 2-4) rotated back to the initial position (or remained in position in no-rotation trials), lasting 500 ms in Experiment 1 and the control experiment, and 700 ms in all other experiments. The next trial always started after an intertrial interval that was randomly drawn between 1.5 and 2s.

Each experiment (except Experiment 4) contained 300 trials, separated into five blocks of 60 trials (50 trials overall per condition, given the factorial combination of rotation (left, right, no-rotation) × item side (left, right)). Experiment 4 contained 360 trials, separated into five blocks of 72 trials (15 trials overall per condition for memory load 4, given the factorial combination of rotation (left, right, no-rotation) × item location (left, right, up, down) and 30 trials per condition for memory load 2 (given there were only two possible locations: left and right). This resulted in an equal number of trials in both memory load conditions. In load 4, all four items were equally likely to be probed, just like in load 2 in which both items were equally likely to be probed. For the bias in internal-content space, we only analysed trials in which the left/right item was probed. For the bias in external-environment space, we also included load 4 trials in which the top/bottom item would be probed.

A built-in eye-tracking calibration was conducted before the start of each block. Experiment 1 contained a single session of ~1 h, whereas Experiments 2–3, 3b–3c and 4–control experiment each involved two consecutive sessions of ~1 h each. For Experiments 2–3 and 3b–3c, the order of experiments was counterbalanced across participants.

Data analysis. Eye-tracking samples were collected and saved into a csv file. All data are publicly available at https://osf.io/cj97y/.

Preprocessing and analysis procedures were straightforward and followed previous work on 'gaze bias' during attentional focusing in memorized visual space³³. The data from the left and right eyes were averaged, yielding a single time course of horizontal gaze position (*x* position) and a single time course of vertical gaze position (*y* position). We removed trials in which horizontal gaze position exceeded $\pm 50 \,\mathrm{cm}$ (14.35°) from fixation (that is, further than half the distance

to either item at encoding). We were confident that this procedure would not restrict our analysis of the 'gaze bias' because we had previously reported that this bias is constituted by changes in gaze position close to fixation³³—a finding we also confirmed in the current data (Fig. 1d). At this stage, one participant from Experiments 2–3 had to be removed from the analysis due to a high number of excluded trials (>50%). For the remaining participants this number was much lower (Experiment 1, 7.1 ± 1.8%; Experiment 2–3, 8.7 ± 1.9%; Experiment 3b–3c, 9.0 ± 2%; Experiment 4, 6.0 ± 1.6%; control experiment, 13.9 ± 3% (mean ± s.e.m.)). Data were epoched from 500 ms before to 1,000 ms after cue onset. Gaze time courses were smoothed using a four-sample (44 ms) average moving window.

We compared trial-averaged gaze-position time courses between conditions in which the cued memory item occupied the left or the right position during encoding, separately for trials with no rotation, and for trials in which the items had been presented on the wall that was now left or right of the current wall (after rotation). To increase sensitivity and interpretability, we constructed two measures of 'towardness'. One expressed gaze bias toward the relative location of the cued memory item in reference to the other memory item ('internal-content space'); the other expressed gaze bias (in rotation trials) toward the items' locations in the external environment (that is, toward the wall on which the items had been presented at encoding; 'external-environment space'). Specifically, towardness in internal-content space was defined as the average horizontal gaze position following cues prompting the selection of right minus left memory items, divided by 2. Because the items were displayed at a horizontal distance of 100 cm, the towardness values can be interpreted as a percentage towards the item. Towardness in environment space was calculated by subtracting the average horizontal gaze position when items had been presented on the wall that was to the right versus left after rotation, divided by 2. For the load 4 condition in Experiment 4, we also included trials in which the top/bottom item was probed when considering the external-environment space, because the towardness in this space captures how horizontal gaze position relates to the position of the wall on which the items were presented prior to rotation. That is, in external-environment space, after self-rotation, all items are either to the left or right wall relative to the observed, irrespective of the relative vertical position of the items. Because cued item location and rotation direction were manipulated independently (that is, a left/right rotation was followed equally often by a cue to select the left/right item), we were able to quantify gaze biases in internal-content space and in external-environment space independently.

For time series, statistical results were subjected to a 'cluster mass' cluster-based permutation procedure³⁵ implemented in R^{56,57}, which controls for multiple comparisons across time points, while retaining high sensitivity. To follow-up findings (including null findings), we also averaged gaze towardness values within the pre-defined 'selection' time window of 400–1,000 ms after cue onset (as in ref. ³³) as well as in the 'maintenance' window –500 to 0 ms before cue onset, and conducted Bayesian *t* tests⁵⁸ with the default settings of the Bayes Factor package⁵⁹. BF values indicated anecdotal (BF₁₀ > 1 and BF₁₀ < 3), moderate (BF₁₀ > 3 and BF₁₀ < 10) or strong (BF₁₀ > 10) evidence in favour of the alternative hypothesis^{60,61}. BF values could also indicate anecdotal (BF₁₀ > 0.33 and BF₁₀ < 1), moderate (BF₁₀ > 0.1 and BF₁₀ < 0.33) or strong (BF₁₀ < 0.1) evidence in favour of the null hypothesis.

For visualization purposes we constructed heat-maps of gaze position for samples within the time window of $400-1,000 \text{ ms}^{33}$. We created histograms without removing trials with gaze positions (above $\pm 50 \text{ cm}$) and without averaging samples. Two-dimensional kernel density estimation with a $20 \times 20 \text{ cm}$ bandwidth with an axis-aligned bivariate normal kernel was evaluated on a $200 \times 200 \text{ cm}$ square grid (the distance between the positions of the items on the wall of the environment). This procedure was performed separately for trials in which the probed memory item had different locations (left versus right). We subtracted gaze-density values that were shared between these two conditions which allowed us to focus selectively on the differences between the conditions.

Reporting Summary. Further information on research design is available in the Nature Research Reporting Summary linked to this article.

Data availability

All data are publicly available at https://osf.io/cj97y/.

Code availability

Code is available at https://osf.io/cj97y/.

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Author contributions

D.D., A.C.N. and F.v.E. conceived and designed the experiments. D.D. programmed the experiments and acquired the data. D.D. and F.v.E. analysed the data. D.D., A.C.N. and F.v.E. interpreted the data. D.D., A.C.N. and F.v.E. drafted and revised the manuscript.

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Competing interests

The authors declare no competing interests.

Additional information

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Software and code

 Policy information about availability of computer code

 Data collection
 The virtual environment was presented and rendered with Vizard 6 by WorldViz on a high-performance laptop running Windows 10.

 Data analysis
 Data analysis was carried out in R and all relevant information can be found in the manuscript's Analysis section. All data and code are publicly available at https://osf.io/cj97y/.

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Study description	We ran an experimental virtual reality study.	
Research sample	We ran seven experiments, each with a sample size of 24 healthy human volunteers. We separately recruited participants for Experiment 1, for Experiments 2-3, for Experiments 3b-3c as well as Experiment 4 and the Control Experiment (Exp. 1: mean age = 25.8, range = 18-40, 20 female, all right-handed; Exp. 2-3: mean age = 26.5, range = 19-36, 19 female, all right-handed; Exp. 3b-3c: mean age = 25.5, range = 19-37, 13 female, 1 left-handed; Exp. 4 & Control Experiment: mean age = 26.7, range = 21-31, 14 female, all right-handed).	
Sampling strategy	Sample size was set based on our prior study that contained 4 experiments using a similar outcome measure and revealed robust results with 20 to 25 participants. Here we set sample size to 24 to enable counterbalancing the order of tasks in Experiments 2-3 and 3b-3c.	
Data collection	The experiments were manipulated within-participant and we tracked gaze position in 3D space at a sampling rate of 90 Hz. Gaze position in 3D space was obtained by intersecting the gaze vector with items in the environment.	
Timing	All experiments were conducted between June 2019 and July 2021.	
Data exclusions	We removed trials in which horizontal gaze position exceeded ±50 cm from fixation (i.e. further than half the distance to either item at encoding). We were confident that this procedure would not restrict our analysis of the "gaze bias", as we had previously reported that this bias is constituted by changes in gaze position close to fixation – a finding we also confirmed in the current data (Fig. 1D). At this stage, one participant from Experiments 2-3 had to be removed from the analysis due to a high number of excluded trials (>50%). In the remaining participants, this number was much lower ((Exp. 1: 7.1±1.8%; Exp. 2-3: 8.7±1.9%; Exp. 3b-3c: 9.0±2%; Exp. 4: 6.0±1.6%; Control Exp.: 13.9±3%; [M±SE]).	
Non-participation	In total (across all experiments), four participants dropped out during the practice session because of nausea.	
Randomization	Experimental conditions were manipulated within-participant.	

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Policy information about studies involving human research participants

Population characteristics

We ran seven experiments, each with a sample size of 24 healthy human volunteers. We separately recruited participants for Experiment 1, for Experiments 2-3, for Experiments 3b-3c as well as Experiment 4 and the Control Experiment (Exp. 1: mean age = 25.8, range = 18-40, 20 female, all right-handed; Exp. 2-3: mean age = 26.5, range = 19-36, 19 female, all right-handed; Exp. 3b-3c: mean age = 25.5, range = 19-37, 13 female, 1 left-handed; Exp. 4 & Control Experiment: mean age = 26.7, range = 21-31, 14 female, all right-handed).

Recruitment

Recruited at random.

Ethics oversight

Protocols were approved by the local ethics committee (Central University Research Ethics Committee #R64089/RE001).

Note that full information on the approval of the study protocol must also be provided in the manuscript.