Consequences of Cognitive Offloading: Boosting Performance But Diminishing Memory

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Abstract

Modern technical tools such as tablets allow for the temporal externalization of working memory processes (i.e. cognitive offloading). Although such externalizations support immediate performance on different tasks, little is known about potential long-term consequences of offloading behavior. In the current set of experiments, we studied the relationship between cognitive offloading and subsequent memory for the offloaded information as well as the interplay of this relationship with the goal to acquire new memory representations. Our participants solved the Pattern Copy Task, in which we manipulated the costs of cognitive offloading and the awareness of a subsequent memory test. In Experiment 1 ($N = 172$), we showed that increasing the costs for offloading induces reduced offloading behavior. This reduction in offloading came along with lower immediate task performance but more accurate memory in an unexpected test. In Experiment 2 ($N = 172$), we confirmed these findings and observed that offloading behavior remained detrimental for subsequent memory performance when participants were aware of the upcoming memory test. Experiment 3 ($N = 172$) additionally showed that resources released by cognitive offloading are not necessarily “lost”. Those participants who were forced to offload maximally but were aware of the memory test could almost completely counteract the negative impact of offloading on memory. Therefore, cognitive offloading is not detrimental to memory acquisition under all circumstances. Our experiments highlight the importance of the explicit goal to acquire new memory representations when relying on technical tools as offloading did have detrimental effects on memory without such a goal.

Keywords: Cognitive offloading, working memory, external memory, technology

Already 2.5 million years ago, ancestors of Homo Sapiens used tools in order to improve performance on particular tasks (e.g., using bones for butchery; Ambrose, 2001). Since then, tools have been developed further and modern technologies not only support physical actions but also allow for the externalization of cognitive processes (see Osiurak, Navarro, Reynaud, & Thomas, 2018). Tablets and smartphones are examples of such modern technical tools, and they have become ubiquitous in everyday life (Greenhow, Robelia, & Hughes, 2009). Even though most of the tools support immediate performance, such as performing a task faster and/or with fewer errors, potential mental depletion following their extensive use has been discussed for cognitive tools (e.g., impaired scene recognition after using navigation systems; Fenech, Drews, & Bakdash, 2010). In the present set of experiments, we studied memory as one of the most fundamental cognitive processes. Specifically, we investigated a trade-off between immediate performance and subsequent mental representations due to cognitive offloading.

Cognitive Offloading

Using tools for externalizing cognitive processes is typically referred to as *cognitive offloading* (Risko & Gilbert, 2016). With regard to working memory, the act of cognitive offloading releases resources which otherwise would be necessary to actively hold information in short-term representations. Instead, the corresponding information is externalized into technical tools such as mobile touch devices (Wilson, 2002). Whether humans tend to offload cognitive processes such as memory depends on cost-benefit evaluations of internal processing versus externalization. Raising the costs of externalizations (e.g., by adding additional physical or temporal demands) increases the use of internal strategies such as memory-based processing, whereas lowering the costs of externalizations increases the use of technical tools (e.g., Cary &

Carlson, 2001; Gray & Fu, 2004; Gray, Sims, Fu, & Schoelles, 2006; Morgan & Patrick, 2013; O'Hara & Payne, 1998; Schönplflug, 1986).

A typical working memory task used to study the externalization of memory is the Pattern Copy Task (called Blocks World Task in previous work; Ballard, Hayhoe, Li, & Whitehead, 1992; Ballard, Hayhoe, & Pelz, 1995). In this task, the participants replicate a color pattern displayed in a model window on one side of the screen in an empty workspace window on the other side of the screen. In most versions of the task, the model window and workspace window are not visible at the same time, but instead one window is covered by a gray mask whenever the other one is uncovered (e.g., Fu & Gray, 2000; Gray et al., 2006). This design allows participants to decide whether they prefer to rely on internal memorization (indicated by fewer switches between the two windows) or to rely on externalizations of the memory processes (indicated by more switches between the two windows). The participants' decision between internal memorization and externalization depends on subjective cost-benefit considerations. With regard to these considerations, the work of Fu and Gray (2000; see also e.g., Gray et al., 2006; Grinschgl, Meyerhoff, & Papenmeier, in press; Patrick et al., 2015; Waldron, Patrick, & Duggon, 2011) has shown that increasing access costs by adding temporal delays for each inspection of the model window results in a shift from offloading strategies to more memory-based strategies (e.g., Fu & Gray, 2000; Gray et al., 2006; Grinschgl et al., in press; Patrick, et al., 2015; Waldron et al., 2011). Thus, higher temporal costs reduce offloading behavior. In the present research, we use this robust and consistent finding to experimentally investigate offloading behavior and its immediate impact on performance as well as subsequent memory.

Consequences of Cognitive Offloading

Conceptually, externalization of cognitive processes into a technical tool could be considered an extended mind as externalizations spread cognitive processes beyond the boundaries of the individual mind (Clark & Chalmers, 1998). Empirically, such externalizations have been shown to improve problem-solving accuracy as well as speed (Kirsh & Maglio, 1994). Such beneficial effects on immediate task performance in terms of speed and/or accuracy have been observed across a large variety of tasks (e.g., arithmetic tasks, see Carlson, Avraamides, Cary, & Strasberg, 2007; Goldin-Meadow, Nusbaum, Kelly, & Wagner, 2001; or reading, see Risko, Medimorec, Chisholm, & Kingstone, 2014). Besides these described effects *with* technology (i.e. performing beyond internal cognitive constraints; Salomon, 1990), little is known about the effects *of* technology (i.e. the cognitive consequences of interactions with technology; Salomon, 1990; Salomon & Perkins, 2005).

On the one hand, offloading irrelevant information into technical tools improves cognitive performance for subsequent, unrelated tasks (Runge, Frings, & Temple, 2019) as well as memory for unrelated information (Storm & Stone, 2015). On the other hand, however, a common concern states that frequent externalization of internal cognitive processes leads to an impoverishment of the corresponding internal abilities. This concern has received empirical support from findings on spatial memory (e.g., Fenech et al., 2010; Gardony, Brunyé, & Taylor, 2015), problem solving (Moritz, Meyerhoff, & Schwan, 2020; O'Hara & Payne, 1998; van Nimwegen & van Oostendorp, 2009), as well as the recall of information (Eskritt & Ma, 2014; Kelly & Risko, 2019; Pyke & LeFevre, 2011; Sparrow, Liu, & Wenger, 2011). For instance, O'Hara and Payne (1998) observed that problem solving was less successful in a transfer phase following an increasing amount of interactions with a technical tool relative to using internal mental processes. Moreover, Kelly and Risko (2019) recently studied how relying on external

representations affects memory accuracy for the offloaded information. Despite identical stimulus encoding, the participants of this study remembered word lists less accurately when they thought they would have access to external representations than when they thought they would have to rely on their internal memory.

Critically, in these lines of research, the participants typically could not choose how to perform the task while encoding task-relevant information (e.g., Eskritt & Ma, 2014; Kelly & Risko, 2019; Sparrow et al., 2011). This is different for the Pattern Copy Task, in which the participants can freely adapt their offloading behavior and thus choose their preferred strategy. Nevertheless, research exploring the Pattern Copy Task points toward a similar trade-off between positive and negative effects of cognitive offloading (Morgan et al., 2009; Morgan, Patrick, & Tiley, 2013; Waldron, Patrick, Morgan, & King, 2007). While an increasing amount of cognitive offloading (e.g. in conditions with low temporal costs relative to conditions with high temporal costs) accelerates task processing (Morgan et al., 2009; Waldron et al., 2007), it subsequently diminishes recall performance for visuo-spatial information (Morgan et al., 2009; Morgan et al., 2013; Waldron et al., 2007). Further, an increased amount of offloading was harmful for resumptions (i.e. continuing to rebuild the color pattern from one's memory) after task interruptions (Morgan et al., 2009; Morgan et al., 2013). However, the reported studies tested the memory for the offloaded information immediately after offloading, thus not exceeding the duration of working memory maintenance (Morgan et al., 2009; Morgan et al., 2013; Waldron et al., 2007). It still remains unclear whether the detrimental effects of offloading also persist at longer time intervals, thus affecting long-term memory. This is especially important, as in real-life situations we often offload information in order to access this information at a later stage (i.e. writing a shopping list or using a calendar). The question thereby arises whether offloading information into a technical tool would also be harmful for long-term memory acquisition.

With regard to the question of long-term memory acquisition, the awareness of the relevance of the offloaded information for subsequent testing might alter offloading behavior itself as well as potential consequences. This is because being aware of a subsequent test should induce the goal to foster learning in order to be prepared for later testing. On the one hand, cognitive offloading might not generally have detrimental effects on memory for the offloaded information but might even have beneficial long-term consequences when participants are explicitly instructed to memorize the studied material. For instance, it is commonly argued that cognitive offloading releases internal cognitive resources (Kirsh, 2010). In return, these released cognitive resources might serve to gain a deeper processing of the remaining task-relevant information and, therefore, improve memory (Craik & Lockhart, 1972) as well as learning (Salomon, 1990; Sweller, van Merriënboer, & Paas, 1998). Consequently, someone who aims at acquiring long-term memory might strategically use cognitive offloading to form stronger memory representations.

On the other hand, however, if the released cognitive resources (due to offloading) cannot be directed to the remaining task-relevant information even with the explicit instruction to memorize the stimuli, the availability of technical tools might provide a risk for subsequent memory performance, as offloading decreases the overall amount of internal information processing and elaboration. In this case, strategic considerations should minimize cognitive offloading in order to create desirable difficulties (i.e. conditions of learning that make it more difficult but increase learning; Bjork & Bjork, 2011). Introducing desirable difficulties by using more memory-intensive strategies and less offloading might be more demanding but might also enhance learning and memory (Bjork & Bjork, 2011). Therefore, in our research we also directly tested whether the awareness of a follow-up memory test alters offloading behavior as well as its consequences.

Present research

In the present research, we systematically investigated how cognitive offloading affects subsequent memory for the offloaded information. In particular, we focused on the question how being aware of the relevance of the offloaded information for a subsequent task alters offloading and its potentially detrimental consequences. In Experiment 1, we started with a demonstration of the proposed trade-off between immediate beneficial effects of offloading on task processing and subsequent detrimental effects of cognitive offloading on memory. This experiment is similar to the experiments reported by Morgan et al. (2009; see also Morgan, et al., 2013; Waldron, et al., 2007) with the difference that our memory test was delayed substantially following the completion of the Pattern Copy Task, whereas Morgan et al. (2009) presented the memory test in between the trials of the Pattern Copy Task. Further, our memorized information consisted of more naturalistic stimuli (i.e. images of real-world objects) rather than colored squares. Nevertheless, due to the high similarity across the studies, our first experiment could be considered to be a conceptual replication of the findings of Morgan et al. (2009).

In Experiments 2 and 3, we studied how awareness of the upcoming memory test, and thus the goal to foster learning, influences offloading behavior as well as its consequences for memory. Because the Pattern Copy task is so complex that it cannot be solved without any offloading, it allowed us to test whether the detrimental effects of offloading also arise under conditions in which participants know that they will have to recall the offloaded information at a later point in time. With regard to cognitive offloading, we tested two competitive hypotheses. On the one hand, released cognitive resources due to offloading might be used to build long-term memory representations. If this is the case, offloading behavior would not be detrimental to long-term memory acquisition. On the other hand, if devoting released resources to the formation of

long-term memory is not possible, offloading behavior would be detrimental for long-term memory acquisition. In this case, offloading behavior should be minimized in order to create desirable difficulties that improve learning. In order to distinguish between these hypotheses, we manipulated the awareness of a follow-up memory test and investigated whether test awareness alters the use and the effects of cognitive offloading. In Experiment 2, the participants performed the Pattern Copy Task under free choice conditions (i.e. the participants could freely choose whether to offload or not). In the final Experiment 3, we compared this free choice conditions with a condition in which we enforce offloading to the maximum extent.

Experiment 1

This experiment focused on demonstrating the proposed trade-off between immediate task performance and the formation of memory representations. Our participants completed a version of the Pattern Copy Task which clearly exceeds working memory capacity. Therefore, all participants had to rely on offloading behavior although the amount of offloading might have varied between them. In this task, increasing offloading behavior reduced the amount of information that needed to be handled simultaneously within working memory. Importantly, however, each participant had to process every unit of information to solve the task. Beyond measuring individual offloading behavior, we manipulated the temporal costs of offloading in order to alter the amount of cognitive offloading (i.e. higher costs of externalization induce a stronger reliance on internal resources). Following a retention interval at the end of the experiment, the participants completed an unexpected memory test. We predicted that more offloading increases immediate task performance with regard to efficiency (speed and accuracy) but impairs the formation of memory representations.

Except for the retention interval exceeding the duration of working memory as well as the more naturalistic objects to memorize, our task and procedure is similar to the experiments reported in Morgan et al. (2009). Due to these similarities, our first experiment could be considered to reflect a conceptual replication of the previously established result pattern. Nevertheless, we consider it important to replicate previous findings with novel variants of tasks to prove the generalizability of the concepts under study as well as the suitability of the present materials and procedure.

Method

This experiment was preregistered at the Open Science Framework (OSF; <https://osf.io/n64cd>). Additionally, all materials, data, and analysis scripts are available at <https://osf.io/vmgd4/>.

Participants

Our final sample consisted of 172 students (131 females; 18 - 47 years) recruited at the University of Tübingen. The participants received course credit or a financial compensation of 8€ for one hour of their time. The study was approved by the ethical board of the Leibniz-Institut für Wissensmedien, Tübingen, Germany, and all participants provided informed consent prior to testing. The sample size was preregistered and intended to achieve a statistical power of $(1 - \beta) = .90$ at medium effect sizes of $d = 0.50$. The participants were randomly assigned to one of the two conditions ($n = 86$ per condition). According to the preregistered exclusion criteria, data from participants with missing data (16), failures in complying with the instructions (5), a

priori awareness of the surprise memory test (14)¹, too many errors in the working memory tests to compute capacity (1), or too large deviations ($\pm 3 SD$) in any dependent variable of the Pattern Copy Task or the memory test (15) were replaced. Each participant performed the experiment individually in a testing room.

Apparatus

All tasks were controlled by PsychoPy scripts (Pierce, 2007) running on 12.3'' Microsoft Surface Pro tablets (2736 x 1824 pixels; touch served as input device) lying flat on the table at a viewing distance of approximately 36 cm.

Tasks and Stimuli

Pattern Copy Task. This task was designed to measure cognitive offloading behavior (Ballard et al., 1995). The participants dragged-and-dropped 12 images of distinct objects (each 3.5 x 3.5 deg; selected from the *Bank of standardized stimuli*; Brodeur, Dionne-Dostie, Montreuil, & Lepage, 2010; Brodeur, Guérard, & Bouras, 2014) from a resource window in the lower right screen to a workspace window in the upper right screen. The aim was to replicate a layout of the same objects from an identically shaped model window in the upper left area of the screen (see Fig. 1A). At any time, either the model or the workspace window was visible while the other window was covered. The participants were able to open the model window by using a slider on the right side of that window and the workspace window by touching a bar left to it. For one half of the participants, opening the model window resulted in a delay of two seconds (for which the slider turned red). Therefore, these participants had to wait in order to open the model

¹ Exploratory analyses showed that all reported results and conclusions remained equivalent when participants who reported a priori test awareness were included in the analyses ($N = 186$).

window (lockout condition), whereas the remaining half of the participants could open the model window immediately (no lockout condition; see e.g. Gray et al., 2006; Grinschgl et al., in press; for a similar manipulation). The participants were allowed to switch between the two windows as often as they wanted. At the beginning of each trial, gray masks covered all windows, and the participants could decide which window to open first. After rebuilding the 12 images, they pressed a button in the lower left area of the screen to continue. There were 20 trials with distinct spatial arrangements of the patterns to be copied, preceded by one practice trial. The images showed (colored) common objects from everyday life such as kitchenware, clothing, or food products (for a further description see Brodeur et al., 2010; Brodeur et al., 2014; all images we used are available on <https://osf.io/vmgd4/>). A new set of images was selected randomly without replacement from a collection of 480 objects (240 for the Pattern Copy Task; 240 additional distractors for the memory test) for each trial. The sets of images were counterbalanced across conditions (i.e. one participant from each condition saw the same sets of objects in the same order).

As proxies for cognitive offloading, we analyzed the number of openings of the model window (i.e. openings of the model window), the duration of the very first opening (i.e. initial encoding duration), and the number of correctly copied items following the first opening of the model window (i.e. initially correctly copied items; only the first opening within a trial is independent of preceding openings). More pronounced offloading behavior is indicated by opening the window more often as well as shorter initial encoding durations and fewer initially correctly copied objects. Furthermore, as immediate task performance, we measured the trial duration (corrected for the two second lockout-times) as well as the number of errors. The number of errors refers to the number of incorrectly rebuild images at the end of a trial. Higher trial duration and more errors indicate lower immediate task performance.

Memory Test. This task was designed to assess memory performance for the objects handled in the Pattern Copy Task. The participant's task was to restore each of the 20 unique spatial arrangements of objects from the Pattern Copy Task from their memory (see Fig. 1B). In each trial, one of the grids was presented in the center of the screen. Next to the grid, the original 12 images of this particular grid were presented intermixed with 12 new distractor images from the same database that had not been presented before (each 3.5 x 3.5 deg). The participants were instructed to rebuild the original arrangement by drag-and-dropping the correct images to the correct locations within the arrangement. As proxies for memory performance, we calculated the proportion of correctly restored identity-location bindings (i.e. correct image at the correct location). We calculated this proportion relative to both the reproduced pattern in the Pattern Copy Task (i.e. identity-location bindings corrected) as well as the original pattern within the Pattern Copy Task (i.e. identity-location bindings). We conducted this two-fold analysis to exclude the possibility of our results emerging from carry-over effects of initial copy errors. Furthermore, we calculated the proportion of correctly restored identities (i.e. correct image in any location; identity).

Figure 1. Illustration of the Pattern Copy Task and Memory Test. (A) Pattern Copy Task. Participants copied the layout of images from the model window (left) to a workspace window (right). Importantly, only one of the windows was visible at a time. This task measures offloading behavior (i.e. the amount of simultaneously copied images) as well as the immediate task performance (i.e. speed and accuracy). On a group level, we induced offloading behavior by manipulating the temporal costs of accessing the model window. (B) Memory Test. The participants restored the configurations of the Pattern Copy Task from memory. (Tablet frame designed by Freepik; Index finger designed by Jannoon028 / Freepik.)

Additional Tests. Between the Pattern Copy Task and the memory test, our participants completed two additional working memory tests as a proxy for their working memory capacity without offloading. In the first test, the participants had to reconstruct visual patterns of colored squares (*Visual Patterns Test*; adapted from Della Sala, Gray, Baddeley, Allamano, & Wilson, 1999). In the second task, the participants had to reconstruct a temporal sequence of spatial locations (*Corsi Blocks Task*; adapted from Milner, 1971). Both tests followed an adaptive staircase of difficulty (starting with 2 objects, +1 object if correct, -1 object if false, minimum of 2 objects), and we analyzed the set size of the last 10 correctly solved trials (out of a total of 30 trials).

Results

In line with our preregistered hypothesis, the participants in the no lockout condition performed more cognitive offloading and had a higher efficiency in immediate task performance, but subsequently showed less accurate memory performance. Further, individual differences in offloading behavior revealed the same pattern of results.

Cognitive Offloading

For all three proxies of cognitive offloading, *t*-tests for independent samples indicated more offloading in the no lockout than in the lockout condition (see Table 1). The participants in the no lockout condition opened the model window more frequently, $t(170) = 7.55, p < .001, \eta_p^2 = .25, 95\% \text{ CI } [.15; .35]$, showed a shorter initial encoding of the model window, $t(170) = -3.87, p < .001, \eta_p^2 = .08, 95\% \text{ CI } [.02; .17]$, and copied fewer items correctly within the first copy cycle, $t(170) = -4.13, p < .001, \eta_p^2 = .09, 95\% \text{ CI } [.03; .18]$, in comparison to those participants in the lockout condition.

Table 1

Means and Standard Errors of Dependent Variables in Experiment 1

	No Lockout		Lockout		Test Statistics		
	<i>M</i>	<i>SE</i>	<i>M</i>	<i>SE</i>	<i>t</i> (170)	<i>p</i>	η_p^2
Cognitive Offloading:							
Openings of the Model Window	3.61	0.15	2.31	0.09	7.55	<.001	.25
Initial Encoding Duration (sec)	13.99	0.89	20.14	1.31	-3.87	<.001	.08
Initially Correctly Copied Items	5.45	0.28	7.22	0.32	-4.13	<.001	.09
Immediate Task Performance:							
Trial Duration (sec)	49.33	1.19	55.06	1.25	-3.31	.001	.06
Errors	0.19	0.04	0.21	0.03	-0.37	.709	<.01
Memory Performance:							
Identity	10.55	0.11	10.93	0.09	-2.76	.006	.04
Identity-Location Bindings	5.91	0.30	7.07	0.33	-2.59	.010	.04
Identity-Location Bindings (corrected)	5.91	0.30	7.08	0.33	-2.63	.009	.04
Working Memory Capacity:							
Visual Patterns Test	3.84	0.05	3.89	0.05	-0.56	.576	<.01
Corsi Blocks Task	4.76	0.07	4.73	0.08	0.23	.820	<.01

Note: Cognitive offloading (openings of the model window and initial encoding duration), immediate task performance, and working memory capacity refer to open-ended count or time data. Initially correctly copied items and memory performance refer to count data with a maximum of 12.

Immediate Task Performance

Two *t*-tests for independent samples showed that participants in the no lockout condition solved the Pattern Copy Task more efficiently than participants in the lockout condition (see Table 1; values are corrected for lockout times). In other words, they solved the task in less time, $t(170) = -3.31, p = .001, \eta_p^2 = .06, 95\% \text{ CI } [.01; .14]$, without decrements in accuracy, $t(170) = -0.37, p = .709, \eta_p^2 < .01, 95\% \text{ CI } [.00; .03]$. With on average below one error per trial in both groups, performance in terms of accuracy was at ceiling.

Memory Performance

While being more efficient in immediate task performance, the participants in the no lockout condition performed less accurately in the unexpected memory test (see Table 1). A series of t -tests for independent samples confirmed that the participants in the no lockout condition remembered the identity of the involved images, $t(170) = -2.76$, $p = .006$, $\eta_p^2 = .04$, 95% CI [.003; .12], as well as uncorrected, $t(170) = -2.59$, $p = .010$, $\eta_p^2 = .04$, 95% CI [.002; .11], and corrected (i.e. for errors in the Pattern Copy Task) identity-location bindings, $t(170) = -2.63$, $p = .009$, $\eta_p^2 = .04$, 95% CI [.002; .11], worse than the participants in the lockout condition. In other words, a high degree of cognitive offloading in the no lockout condition negatively affected subsequent memory accuracy. This finding was further emphasized by an exploratory analysis of individual differences, which showed strong correlations between offloading behavior and memory accuracy (see Table 2 and Figures S1.1, S1.2 and S1.3 in the electronic supplementary material (ESM) for the corresponding scatter plots). In both experimental conditions, Pearson-correlations showed that increasing offloading behavior was clearly associated with decreasing memory accuracy across all proxies for offloading and memory, all $|r/s(84)| \geq .51$, all $ps < .001$.

Table 2

Pearson-Correlations Between Cognitive Offloading and Memory Performance in Experiment 1

	Identity	
	No Lockout	Lockout
Openings of the Model Window	-.54***	-.61***
Initial Encoding Duration (sec)	.51***	.63***
Initially Correctly Copied Items	.68***	.70***
	Identity-Location Bindings	
	No Lockout	Lockout
Openings of the Model Window	-.58***	-.69***
Initial Encoding Duration (sec)	.65***	.67***
Initially Correctly Copied Items	.85***	.79***
	Identity-Location Bindings (corrected)	
	No Lockout	Lockout
Openings of the Model Window	-.58***	-.69***
Initial Encoding Duration (sec)	.65***	.67***
Initially Correctly Copied Items	.85***	.79***

Note: * $p < .05$, ** $p < .01$, *** $p < .001$

Mediation Analyses

An alternative explanation for improved memory performance in the lockout condition is that this benefit does not stem from the reduction in offloading behavior but that participants take advantage of the two seconds lockout for additional rehearsal in this condition. In order to provide evidence that reduced offloading behavior indeed increased memory performance, we conducted a set of exploratory mediation analyses. Within these analyses, we probed whether our independent variable, temporal lockout, directly affected subsequent memory performance or whether this relationship was mediated by cognitive offloading (see Table 3). We observed a mediated effect of the predictor lockout (no lockout/lockout) via cognitive offloading (mediator) on all three memory variables (identity, identity-location bindings, identity-location bindings corrected), all mediated effects ≥ 0.58 , all $ps < .001$. In fact, the mediations substantially reduced all direct effects of the predictor on the memory performance measures, all

|direct effects| ≤ 0.86 , all p s $> .040$. Only in two cases (out of nine), did the direct effect remain significant. This indicates that the reduction in offloading behavior accompanying temporal lockouts rather than the lockout manipulation itself enhanced memory performance.

Table 3

Mediation Analyses With the Predictor Lockout (No Lockout/Lockout), Mediator Cognitive Offloading and Outcome Memory Performance in Experiment 1

	Identity			
	Mediated Effect	95% CI	Direct Effect	95% CI
Openings of the Model Window	0.58***	[0.41; 0.83]	-0.20	[-0.43; 0.06]
Initial Encoding Duration (sec)	0.29***	[0.16; 0.47]	0.09	[-0.17; 0.29]
Initially Correctly Copied Items	0.39***	[0.20; 0.58]	-0.01	[-0.23; 0.19]
	Identity-Location Bindings			
Openings of the Model Window	2.01***	[1.48; 2.55]	-0.86*	[-1.65; -0.05]
Initial Encoding Duration (sec)	1.13***	[0.63; 1.70]	0.02	[-0.73; 0.62]
Initially Correctly Copied Items	1.50***	[0.74; 2.29]	-0.34	[-0.92; 0.17]
	Identity-Location Bindings (corrected)			
Openings of the Model Window	2.01***	[1.54; 2.63]	-0.84*	[-1.59; -0.05]
Initial Encoding Duration (sec)	1.13***	[0.58; 1.72]	0.04	[-0.65; 0.73]
Initially Correctly Copied Items	1.50***	[0.81; 2.23]	-0.33	[-0.78; 0.21]

Note: * $p < .05$, ** $p < .01$, *** $p < .001$; all mediation analyses were conducted with a bootstrapping procedure (1000 simulations) using the package “mediation” in R (Tingley, Yamamoto, Hirose, Keele, & Imai, 2014).

Working Memory Capacity

Two t -tests for independent samples confirmed that there were no group differences between participants in the lockout and the no lockout condition with regard to memory capacity as measured by the Visual Patterns Test, $t(170) = -0.56$, $p = .576$, $\eta_p^2 < .01$, 95% CI [.00; .03], $BF_{10} = 0.19$ and the Corsi Blocks Task, $t(170) = 0.23$, $p = .820$, $\eta_p^2 < .01$, 95% CI [.00; .02],

$BF_{10} = 0.17$ (see Table 1). Exploratory correlational analysis of working memory capacity, cognitive offloading, and subsequent memory performance are available in Table S1 of the ESM.

Experiment 2

The observation that more cognitive offloading impairs the formation of memory representation in Experiment 1 arises from an incidental experimental setup (i.e. participants were not aware of the memory test while performing the Pattern Copy Task). Whereas this finding shows impaired memory for situations with implicit formation of new memory representations, it does not necessarily transfer to scenarios in which participants explicitly aim at forming memory representations for subsequent testing. In the second experiment, we therefore investigated how awareness of the subsequent memory test alters offloading behavior as well as the formation of memory representations. To study this, we added a new factor to the design of Experiment 1. Whereas one half of the participants remained uninformed with regard to the subsequent memory test, we explicitly informed the other half of the participants that they would have to complete a memory test after the Pattern Copy Task. With this setup, we tested two competing hypotheses. The first hypothesis is that cognitive offloading releases internal cognitive resources and that test awareness is necessary in order to devote these released resources to the formation of memory representations. The second hypothesis is that released resources do not contribute to the formation of memory representations. In this case, the participants might rely more on their own internal encoding strategies and thus avoid cognitive offloading in order to foster long-term learning (i.e. a desirable difficulty).

Method

This experiment was preregistered at the OSF (<https://osf.io/pb89m>). All materials, data and analysis scripts are available at <https://osf.io/ke9dj/>.

Participants

The final sample size consisted of 172 students (137 females; 18-35 years), who were randomly assigned to the four conditions ($n = 43$ per condition) and tested individually in a testing room. According to the preregistered exclusion criteria, we replaced data from participants with missing data (1), a priori awareness of the surprise memory test (19)², or too large deviations ($\pm 3 SD$) in any dependent variable of the Pattern Copy Task or the memory test (4). These exclusion criteria were identical to those of Experiments 1 and 3.

Tasks and Stimuli

All tasks and stimuli were identical to Experiment 1 with the exceptions described in this section.

Pattern Copy Task. For one half of the participants, the instructions included information announcing the upcoming memory test at the end of the experiment (translated from German: “Please note: Following the task, you will have to take a memory test which will test your memory of the presented patterns of images.”). Additionally, before the first trial of the Pattern Copy Task, the participants were reminded about the memory test (translated from German: “Please try to remember the pictures and patterns as well as possible, as a recognition test will be

² When exploratorily including participants that were excluded due to false memory test awareness in the analysis ($N = 191$), the results remain essentially the same.

carried out after this test.”). For the other half of the participants, none of this information about the upcoming memory test was included in the instructions. The original instructions for each condition as well as the tests themselves are available at <https://osf.io/ke9dj/>.

As the focus of this experiment was on the effect of offloading on subsequent memory rather than immediate task performance, we aimed to ensure that all participants had the same chance to remember the initial pattern of objects. Therefore, the participants had to solve the Pattern Copy Task correctly in this experiment. Consequently, the participants could not proceed to the next trial without correctly replicating the layout from the model window. Nevertheless, we will still report trial duration as an index of immediate task performance. The patterns of this experiment consisted of eight images only (these images are a subset of the images used in Experiment 1; see <https://osf.io/ke9dj/>).³

Memory Test. The layout within the memory test was slightly different. The eight original and eight distractor images were presented beneath instead of next to the corresponding grid. As we used fewer images (compared to the other experiments), this adapted layout was more user-friendly.

Results

Matching the results of Experiment 1, more offloading resulted in faster task processing but less accurate memory performance. Interestingly, participants who knew about the subsequent memory test reduced offloading behavior and subsequently showed an improved memory performance.

³ Full disclosure: We conducted Experiment 2 before Experiments 1 and 3. As participants performed rather well on the memory test in this experiment, we increased the number of images for Experiment 1 and 3.

Cognitive Offloading

We analyzed all three proxies for cognitive offloading using 2 x 2 between-subjects ANOVAs with lockout and announcement of the memory test as the independent variables. Each proxy of cognitive offloading indicated more offloading in the no lockout than in the lockout condition (see Table 4). The participants in the no lockout condition opened the model window more frequently, $F(1, 168) = 37.25, p < .001, \eta_p^2 = .18, 95\% \text{ CI } [.09; .28]$, showed a shorter initial encoding of the model window, $F(1, 168) = 15.58, p < .001, \eta_p^2 = .09, 95\% \text{ CI } [.02; .17]$, and copied fewer items correctly within the first copy cycle, $F(1, 168) = 24.50, p < .001, \eta_p^2 = .13, 95\% \text{ CI } [.05; .22]$, than the participants in the lockout condition. Further, across all variables, the participants in the uninformed condition offloaded more than the participants in the informed condition. Thus, the participants in the uninformed condition opened the model window more frequently, $F(1, 168) = 10.31, p = .002, \eta_p^2 = .06, 95\% \text{ CI } [.009; .14]$, showed a shorter initial encoding of the model window, $F(1, 168) = 19.29, p < .001, \eta_p^2 = .10, 95\% \text{ CI } [.03; .19]$, and copied fewer items correctly within the first copy cycle, $F(1, 168) = 12.21, p < .001, \eta_p^2 = .07, 95\% \text{ CI } [.01; .15]$, than the participants in the informed condition. No interactions between the conditions were found, all $F_s(1, 168) \leq 1.83$, all $p_s \geq .178$.

Table 4

Means and Standard Errors of Dependent Variables in Experiment 2

	No Lockout				Lockout			
	Uninformed		Informed		Uninformed		Informed	
	<i>M</i>	<i>SE</i>	<i>M</i>	<i>SE</i>	<i>M</i>	<i>SE</i>	<i>M</i>	<i>SE</i>
Cognitive Offloading:								
Openings of the Model Window	2.49	0.15	1.98	0.13	1.65	0.09	1.45	0.07
Initial Encoding Duration (sec)	9.52	0.80	14.08	1.18	13.63	1.01	17.83	0.95
Initially Correctly Copied Items	4.73	0.27	5.72	0.28	6.09	0.25	6.87	0.19
Immediate Task Performance:								
Trial Duration (sec)	28.85	0.99	32.73	1.05	33.76	1.24	36.79	1.15
Memory Performance:								
Identity	6.99	0.12	7.32	0.09	7.27	0.14	7.66	0.04
Identity-Location Bindings	4.20	0.29	5.17	0.29	5.24	0.31	6.28	0.19
Working Memory Capacity:								
Visual Patterns Test	3.88	0.08	3.95	0.07	3.76	0.09	3.95	0.09
Corsi Blocks Task	4.61	0.10	4.79	0.09	4.60	0.09	4.87	0.10

Note: Cognitive offloading (openings of the model window and initial encoding duration), immediate task performance, and working memory capacity refer to open-ended count or time data. Initially correctly copied items and memory performance refer to count data with a maximum of 8.

Immediate Task Performance

With regard to immediate task performance, more cognitive offloading came along with faster task processing (see Table 4). We confirmed this with an exploratory 2 x 2 between-subjects ANOVA with lockout and announcement of the memory test as the independent variables and trial duration as the dependent variable. This ANOVA revealed that the participants in the no lockout condition completed the trials faster than the participants in the lockout condition, $F(1, 168) = 16.24, p < .001, \eta_p^2 = .08, 95\% \text{ CI } [.02; .18]$ (trial duration was corrected for lockout-times). Further, the participants in the uninformed condition completed the trials faster than the participants in the informed condition, $F(1, 168) = 9.62, p = .005, \eta_p^2 = .05, 95\% \text{ CI } [.01; .13]$. The interaction between both conditions was not significant, $F(1, 168) = 0.14, p = .706$.

Memory Performance

While offloading more within the Pattern Copy Task, the participants in the no lockout condition as well as the uninformed condition performed less accurately in the memory test (see Table 4). We analyzed both proxies for memory accuracy using 2 x 2 between-subjects ANOVAs with lockout and announcement of the memory as the independent variables. The participants in the no lockout condition performed less accurately in identifying the involved images, $F(1, 168) = 8.29, p = .004, \eta_p^2 = .05, 95\% \text{ CI } [.005; .12]$, as well as in retrieving identity-location bindings, $F(1, 168) = 15.09, p < .001, \eta_p^2 = .08, 95\% \text{ CI } [.02; .17]$, in comparison to the participants in the lockout condition. Further, uninformed participants performed less accurately in identifying the involved images, $F(1, 168) = 11.58, p < .001, \eta_p^2 = .06, 95\% \text{ CI } [.01; .14]$, and the identity-location bindings, $F(1, 168) = 13.20, p < .001, \eta_p^2 = .07, 95\% \text{ CI } [.02; .16]$, than informed participants. There was no interaction between the investigated conditions, all $F_s(1, 168) \leq 0.08$, all $p_s \geq .773$. These findings were further supported by the exploratory analyses of individual differences which showed correlations between offloading behavior and memory accuracy (see Table 5; scatter plots of all correlations are available in the ESM Figures S2.1 and S2.2). Increasing offloading behavior was associated with decreasing memory accuracy.

Table 5

Pearson-Correlations Between Cognitive Offloading and Memory Performance in Experiment 2

	Identity			
	No Lockout		Lockout	
	Uninformed	Informed	Uninformed	Informed
Openings of the Model Window	-.70***	-.47**	-.55***	-.37*
Initial Encoding Duration (sec)	.53***	.47**	.40**	.29
Initially Correctly Copied Items	.67***	.57***	.55***	.42**
	Identity-Location Bindings			
	No Lockout		Lockout	
	Uninformed	Informed	Uninformed	Informed
Openings of the Model Window	-.53***	-.58***	-.61***	-.64***
Initial Encoding Duration (sec)	.45**	.60***	.35*	.47**
Initially Correctly Copied Items	.53***	.69***	.65***	.68***

Note: * $p < .05$, ** $p < .01$, *** $p < .001$

Mediation Analyses

As in Experiment 1, we conducted a set of exploratory mediation analyses in order to provide evidence that the reduction of offloading behavior increased memory accuracy in the lockout conditions (see Table 6). We observed a mediated effect of the predictor lockout (no lockout/lockout) via cognitive offloading (mediator) on all memory variables (identity, identity-location bindings), all mediated effects ≥ 0.18 , all $ps \leq .001$, all $|\text{direct effects}| \leq 0.53$, all $ps \geq .046$. In only one case (out of 6), the direct effect remained significant while the mediating factor still appears to be the stronger predictor. Hence, the lockout manipulation influenced subsequent memory performance by affecting offloading behavior. Further, regarding the announcement of the upcoming memory test (informed/not informed), we also observed a mediation of the effect of announcement via cognitive offloading, all $|\text{mediated effects}| \geq 0.18$, all $ps \leq .004$, rather than a direct effect on subsequent memory performance, all

|direct effects| ≤ 0.50 , all p s $\geq .026$ (see Table 7). In two cases (out of 6), the direct effect remained significant; however, the mediated effect appears to be stronger overall.

Table 6

Mediation Analyses With the Predictor Lockout (No Lockout/Lockout), Mediator Cognitive Offloading and Outcome Memory Performance in Experiment 2

	Identity			
	Mediated Effect	95% CI	Direct Effect	95% CI
Openings of the Model Window	0.36***	[0.22; 0.56]	-0.06	[-0.29; 0.16]
Initial Encoding Duration (sec)	0.18***	[0.08; 0.32]	0.12	[-0.12; 0.30]
Initially Correctly Copied Items	0.30***	[0.18; 0.48]	-0.003	[-0.23; 0.17]
	Identity-Location Bindings			
Openings of the Model Window	0.99***	[0.68; 1.35]	0.09	[-0.42; 0.60]
Initial Encoding Duration (sec)	0.55***	[0.29; 0.89]	0.53*	[0.01; 1.06]
Initially Correctly Copied Items	0.90***	[0.52; 1.32]	0.17	[-0.33; 0.67]

Note: * $p < .05$, ** $p < .01$, *** $p < .001$; all mediation analyses were conducted with a bootstrapping procedure (1000 simulations) using the package “mediation” in R (Tingley et al., 2014).

Table 7

Mediation Analyses With the Predictor Announcement of the Memory Test

(Informed/Uninformed), Mediator Cognitive Offloading and Outcome Memory Performance in Experiment 2

	Identity			
	Mediated Effect	95% CI	Direct Effect	95% CI
Openings of the Model Window	-0.18**	[-0.32; -0.06]	-0.18*	[-0.36; -0.03]
Initial Encoding Duration (sec)	-0.20***	[-0.31; -0.10]	-0.15	[-0.32; 0.02]
Initially Correctly Copied Items	-0.21***	[-0.37; -0.09]	-0.15	[-0.33; 0.00]
Identity-Location Bindings				
Openings of the Model Window	-0.50**	[-0.83; -0.19]	-0.50*	[-0.99; -0.05]
Initial Encoding Duration (sec)	-0.62***	[-1.02; -0.32]	-0.39	[-0.88; 0.18]
Initially Correctly Copied Items	-0.63**	[-1.04; -0.26]	-0.38	[-0.82; 0.08]

Note: * $p < .05$, ** $p < .01$, *** $p < .001$; all mediation analyses were conducted with a bootstrapping method (1000 simulations) using the package “mediation” in R (Tingley et al., 2014).

Working Memory Capacity

We analyzed both proxies for working memory capacity using 2 x 2 between-subjects ANOVAs with lockout and announcement of the memory test as the independent variables. We did not find any main effects or interactions in working memory capacity for identity-location bindings as measured by the Visual Patterns Test, all $F_s(1, 168) \leq 2.38$, all $p_s \geq .13$, all $BF_{10}s \leq 0.50$ (see Table 4). In the Corsi Blocks Task, the participants in the uninformed condition showed a lower working memory capacity for temporal sequence of spatial locations, than the participants in the informed condition, $F(1, 168) = 4.85$, $p < .029$, $\eta_p^2 = .03$, 95% CI [.00; .09], $BF_{10} = 1.57$. However, performance in the Corsi Blocks Task was uncorrelated with cognitive offloading, all $|r/s(41)| \leq .21$, all $p_s > .173$, as well as memory performance in the main task, all $|r/s(41)| \leq .21$, all $p_s > .166$ (exploratory analyses; see Table S2 in the ESM). Therefore, we will not address this discrepancy any further. Nevertheless, please note, the Corsi Blocks Task

was performed after the Pattern Copy Task in order to serve as a retention interval. Thus, it cannot be considered independent of our experimental design and differences in Corsi Blocks capacity might have been induced by our experimental manipulations. There were no other group differences or interactions in the Corsi Blocks Task, all $F_s(1, 168) \leq 0.12$, all $p_s \geq .66$, all $BF_{10s} \leq 0.37$ (see Table 4).

Experiment 3

Experiments 1 and 2 both showed that cognitive offloading was associated with reduced subsequent memory performance. When participants were aware of the upcoming memory test, however, they seem to reduce offloading behavior in order to foster long-term memory (Experiment 2). This finding suggests that cognitive resources which are released by offloading are rather “lost” than devoted to the acquisition of memory representations. In this third experiment, we further pursue on this finding by probing its’ generality and/or boundaries. Therefore, we manipulated whether participants were allowed to freely choose their offloading behavior as in the previous experiments (choice condition) or whether they were forced to offload to a maximum extent (forced condition). Identically to Experiment 2, we further manipulated whether the participants were aware of the upcoming memory test (informed condition) or not (uninformed condition). If the cognitive resources that are released due to cognitive offloading cannot contribute to the formation of memory representations in general, being aware of the upcoming memory test should have no beneficial effect when the participants are forced to offload maximally. Furthermore, the condition with the free choice offloading also allows us to reinvestigate the interesting finding of Experiment 2, namely, that participants who were aware of the subsequent memory test rather avoided offloading in order to improve memory performance.

Method

We preregistered this experiment at OSF (<https://osf.io/4ye2c>). Further, all materials, data, and analysis scripts are available at (<https://osf.io/k6t7q/>). All methods of this experiment were identical to Experiment 1 and 2 with the exceptions described in this section.

Participants

Our final sample consisted of 172 new students (136 females; 18-66 years), randomly assigned to one of four experimental conditions ($n = 43$ per condition). Based on our preregistered exclusion criteria, we replaced data of participants with missing data (12), a priori awareness of the surprise memory test (27)⁴, or too large deviations (± 3 SD) in any preregistered dependent variable of the Pattern Copy Task or the memory test (6). These exclusion criteria were identical to Experiments 1 and 2. This experiment was conducted in a group setting with a maximum of four participants at once. The testing room was divided into separate chambers by movable walls so that the participants could not see each other during the study.

⁴ Including these participants in the analysis ($N = 199$) turned the interactions between announcement of the memory test and offloading conditions from statistical significance into numerical trends (i.e., $.05 < p < .1$). However, as participants in the forced offloading condition still benefited from test awareness with regard to their memory performance, such a change would not have a major impact on the interpretation of the current study. Further, the group difference in the Corsi Blocks Task attenuates from statistical significance into a numerical trend when including participants with memory test awareness which deviated from their instructions. Please note, the Corsi Blocks Task was performed after the Pattern Copy Task in order to serve as a retention interval. It can thus not be considered independent of our experimental design, and differences in Corsi Blocks capacity might have been induced by our experimental manipulations.

Tasks and Stimuli

Pattern Copy Task. Identical to Experiment 2, the participants in the informed conditions were informed about the upcoming memory test before starting the Pattern Copy Task, whereas the participants in the uninformed conditions received no such instructions. Orthogonally to the memory test awareness, we manipulated whether participants could freely choose their offloading behavior (choice condition) or whether they were forced to offload to a maximum extent (forced condition). The choice condition was identical to the no lockout condition in Experiments 1 and 2. In the novel forced condition, the participants were only allowed to rebuild a single object in the workspace window within each copy cycle of the Pattern Copy Task. Therefore, the participants had to change between the model and the workspace window at least twelve times to rebuild the twelve images in this condition. In this experiment, the participants could open the model window by just clicking on the bar next to it (instead of using a slider as in Experiments 1 and 2). For all conditions, the Pattern Copy Task had to be solved correctly (see also Experiment 2). As proxies of cognitive offloading, we preregistered the number of openings of the model window and the number of correctly copied items after the first opening⁵. Additionally, we also analyzed the trial duration as an index of immediate task performance.

Memory Test. The memory test was identical to Experiment 1.

⁵ Due to the forced offloading condition in this experiment, the proxies for offloading were of minor relevance. Nevertheless, we analyzed the number of openings of the model window and the number of correctly copied items after the first opening to demonstrate that participants were offloading more when they were forced to do so than under free choice conditions.

Results

In line with our previous findings, we observed that cognitive offloading was detrimental to subsequent memory performance when participants were unaware of the upcoming memory test. Nonetheless, when participants were aware of the memory test, the detrimental effects of cognitive offloading on memory performance were less pronounced. In particular, the participants who were forced to offload to a maximum extent recovered remarkably from the lack of memory representations relative to their uninformed counterparts.

Cognitive Offloading

Because one half of our participants were forced to offload to a maximum extent, we analyzed offloading behavior only for the participants performing the task under the free choice conditions. First, we confirmed that the participants in the choice condition actually offloaded less extensively than maximum offloading. Therefore, we conducted one-sample *t*-tests for the informed and uninformed conditions. In both choice (sub-)conditions, the participants offloaded less than they maximally could (see Table 8). We observed fewer openings of the model window in the choice/uninformed condition, $t(42) = -39.33, p < .001, d = 6.07, 95\% \text{ CI } [4.75; 7.38]$, as well as the choice/informed condition, $t(42) = -43.18, p < .001, d = 6.66, 95\% \text{ CI } [5.22; 8.10]$, compared to $\mu = 12$ (i.e. the minimum amount of opening the model window in the forced condition). Additionally, we also observed that the participants copied more items initially correctly in the choice/uninformed condition, $t(42) = 11.01, p < .001, d = 1.69, 95\% \text{ CI } [1.23; 2.17]$, and the choice/informed condition, $t(42) = 12.89, p < .001, d = 1.98, 95\% \text{ CI } [1.47; 2.50]$, compared to $\mu = 1$ (i.e. the maximum amount of copied items in forced

condition per opening). Therefore, consistent with the previous experiments, the participants in the choice condition relied on offloading, but they did not offload maximally.

Further, a two-sample t -test showed that offloading behavior in the choice sub-conditions did not differ between the conditions with and without announcement of the memory test. Hence, the participants in the choice/informed condition and the choice/uninformed condition did not differ in the openings of the model window, $t(84) = -0.39$, $p = .693$, $\eta_p^2 < .01$, 95% CI [.00; .03], as well as the initially correctly copied items, $t(84) = 0.78$, $p = .439$, $\eta_p^2 = .01$, 95% CI [.00; .04]. This finding contrasts with the observation of Experiment 2, in which memory test announcement under free choice conditions resulted in reduced offloading behavior. We will further elaborate on this in the General Discussion.

Table 8

Means and Standard Errors of Dependent Variables in Experiment 3

	Choice				Forced			
	Uninformed		Informed		Uninformed		Informed	
	<i>M</i>	<i>SE</i>	<i>M</i>	<i>SE</i>	<i>M</i>	<i>SE</i>	<i>M</i>	<i>SE</i>
Cognitive Offloading:								
Openings of the Model Window	3.68	0.21	3.79	0.19	12.36	0.04	12.29	0.03
Initially Correctly Copied Items	4.96	0.36	4.61	0.28	0.97	0.01	0.98	0.01
Immediate Task Performance:								
Trial Duration (sec)	42.56	1.48	45.38	2.98	35.35	1.59	45.36	2.37
Memory Performance:								
Identity	9.97	0.18	10.20	0.13	8.17	0.17	9.34	0.22
Identity-Location Bindings	4.69	0.41	5.18	0.43	1.84	0.18	4.18	0.45
Working Memory Capacity:								
Visual Patterns Test	3.87	0.06	3.97	0.07	3.81	0.08	3.87	0.08
Corsi Blocks Task	4.59	0.09	4.71	0.09	4.65	0.12	4.94	0.09

Note: Cognitive offloading (openings of the model window and initial encoding duration), immediate task performance, and working memory capacity refer to open-ended count or time data. Initially correctly copied items and memory performance refer to count data with a maximum of 12.

Immediate Task Performance

We analyzed trial duration (Each trial had to be solved correctly.) as a proxy for immediate task performance within the Pattern Copy Task. We observed a faster completion of the trials when participants were not aware of the upcoming memory test (uninformed condition) than when they expected the upcoming memory test (informed condition, see Table 8). A 2 x 2 exploratory between-subjects ANOVA with memory test announcement as well as offloading condition (forced vs. choice) confirmed that this difference was significant. The participants in the uninformed condition solved the task faster than the participants in the informed condition, $F(1, 168) = 8.54, p = .004, \eta_p^2 = .05, 95\% \text{ CI } [.005; .12]$. However, there was no main effect of the offloading condition, $F(1, 168) = 2.70, p = .102, \eta_p^2 = .01, 95\% \text{ CI } [.00; .07]$, as well as no interaction between both variables, $F(1, 168) = 2.68, p = .103, \eta_p^2 = .01, 95\% \text{ CI } [.00; .07]$.

Memory Performance

In the conditions forcing participants to offload maximally, awareness of the upcoming memory test increased memory performance almost to the level of the condition with free choice offloading behavior (see Figure 2). For both proxies of memory performance, we conducted a separate 2 x 2 between-subject ANOVA with announcement of the memory test and offloading condition as the independent variables as well as memory performance as the dependent variable. We observed interactions between the independent variables for both proxies of memory performance “identity”, $F(1, 168) = 6.89, p = .009, \eta_p^2 = .04, 95\% \text{ CI } [.002; .11]$, as well as “identity-location bindings”, $F(1, 168) = 5.99, p = .015, \eta_p^2 = .03, 95\% \text{ CI } [.001; .10]$. Additionally, all main effects in both analyses reached significance, all $F(1, 168)s \geq 13.92$, all $ps < .001$, all $\eta_p^2s \geq .08$.

To further investigate the interaction effects, we conducted two-sample t -tests. With regard to both memory variables (identity and identity-location bindings), we observed less accurate memory performance in the forced/uninformed condition than in all other groups, all $t(84)s \geq 4.17$, all $ps < .001$, all $\eta_p^2s \geq .18$. Further, we observed no difference in memory accuracy between the choice/informed and choice/uninformed conditions, all $t(84)s \leq 1.04$, all $ps \geq .302$, all $\eta_p^2s \leq .01$. Whether or not the forced/informed condition reached the level of the free choice conditions differed between the two proxies of memory accuracy. When analyzing only the identity of the recalled objects, the participants in the forced/informed condition showed a lower recognition accuracy than the participants in the choice/informed condition as well as the choice/uninformed condition, all $t(84)s \geq 2.21$, all $ps \leq .029$, all $\eta_p^2s \geq .05$. However, this difference was absent when analyzing identity-location bindings. Here, the participants in the forced/informed condition did not differ in their subsequent memory performance from the participants in the choice/informed condition as well as the participants in the choice/uninformed condition, all $t(84)s \leq 1.59$, all $ps \geq .115$, all $\eta_p^2s \leq .03$.

In line with the previous two experiments, exploratory correlational analyses within the free choice conditions revealed that an increased amount of cognitive offloading was associated with a lower subsequent memory performance in the choice conditions (see Table 9; scatter plots of all correlations are available in Figure S3.1 and S3.2 of the ESM). Due to the study design, there was hardly any variance in offloading behavior in the forced condition. Therefore, we did not conduct correlational analyses for these groups. Further, we did not repeat the mediation analyses of Experiments 1 and 2 as we directly manipulated offloading behavior in this experiment.

Figure 2. Interaction Effect of the Independent Variables Announcement of the Memory Test and the Offloading Condition on Memory Performance in Experiment 3. Error bars refer to the standard error.

Table 9

Pearson-Correlations Between Cognitive Offloading and Memory Performance in Experiment 3

	Identity	
	Choice	
	Uninformed	Informed
Openings of the Model Window	-.80***	-.55**
Initially Correctly Copied Items	.70***	.57***
	Identity-Location Bindings	
	Choice	
	Uninformed	Informed
Openings of the Model Window	-.69***	-.38*
Initially Correctly Copied Items	.78***	.60***

Note: * $p < .05$, ** $p < .01$, *** $p < .001$

Working Memory Capacity

With regard to the Visual Pattern Test, 2 x 2 between-subjects ANOVAs with announcement of the memory test and offloading condition as the independent variables revealed

no group differences or interactions, all $F_s(1, 168) \leq 1.25$, all $p_s \geq .265$, all $\eta_p^2s < .01$, all $BF_{10}s \leq 0.85$. With regard to the Corsi Blocks Task, the participants in the uninformed condition showed a lower working memory capacity for temporal sequences of spatial locations than the participants in the informed condition, $F(1, 168) = 4.43$, $p = .039$, $\eta_p^2 = .02$, 95% CI [.00; .09], $BF_{10} = 2.38$. This matches the results of the Corsi Blocks Task in Experiment 2. As the Visual Patterns Test and Corsi Blocks Task were conducted after the experimental manipulation in the offloading task (to delay the memory test), it therefore seems likely that the experimental manipulation induced the reduced Corsi Blocks capacity. Offloading behavior (in the free choice conditions), however, was uncorrelated with capacity in the Corsi Blocks Task, all $|r|s(41) \leq .23$, all $p_s \geq .138$. Further, we observed no significant correlations between capacity in the Corsi Blocks Task and performance in the two memory measures all $|r|s(41) \leq .28$, all $p_s \geq .066$ (exploratory analyses; see Table S3 in the ESM for all correlations). We observed no other group differences or interaction effects in the Corsi Blocks Task, all $F_s(1, 168) \leq 1.96$, all $p_s \geq .163$, all $\eta_p^2s < .01$, all $BF_{10}s \leq 0.69$. Given the absence of group differences in the Visual Pattern Test (which is conceptually closer to the Pattern Copy Task) as well as no correlations of the capacity in the Corsi Blocks Task, we will not address this issue any further.

General Discussion

In the present research, we studied how offloading behavior affects memory performance for the offloaded information. In particular, we were interested in how the awareness of subsequent testing alters offloading behavior as well and its potentially detrimental consequences. Our first two experiments demonstrate that cognitive offloading induces a trade-off between immediate task performance in the Pattern Copy Task and the formation of memory representations for the information presented in this task (within the same experiments and

participants). In other words, while cognitive offloading accelerated task processing, it interfered with the formation of memory for the processed information. This finding replicates and extends previous results reported by Morgan et al. (2009; see also Morgan, et al., 2013; Waldron, et al., 2007) on longer retention intervals exceeding working memory maintenance as well as on stimuli depicting naturalistic objects (rather than colored squares). This pattern of results appears to be genuine for an implicit formation of memory representations (i.e. Experiment 1 and the uninformed conditions of Experiment 2). Most importantly, the effect also arose when we directly manipulated offloading behavior in Experiment 3. When participants were unaware of the memory test, their memory performance was more accurate when they were offloading less under free choice conditions than when they were forced to offload to a maximum extent.

With regard to explicit formations of memory representations, the results were a bit more mixed. In Experiment 2, the participants who were aware of the upcoming memory test reduced their amount of cognitive offloading and subsequently revealed more accurate long-term memory performance. In the conditions with free choice in Experiment 3, however, we did not observe such a reduction of offloading behavior induced by the awareness of the upcoming memory test relative to the condition without such awareness. The lack of an equivalent effect with regard to reduced offloading behavior in order to foster learning raises questions regarding the generality, reliability, or magnitude of this effect. As the origin of this difference in the results pattern cannot be fully explained within this manuscript, we will only briefly discuss this finding below without drawing strong conclusions from it. A potential source for the diverging patterns might be that only one half of the participants performed the Pattern Copy Task under free choice conditions in Experiment 3 (the remaining participants were forced to offload and therefore could not adapt their offloading behavior). This reduction of statistical power or unexplained variance in the two samples seem to be plausible candidates as most other methods were virtually identical (despite

the number of images). Nevertheless, what remained consistent in Experiments 2 and 3 is that the amount of offloading inversely matched the subsequent memory performance under free choice and informed conditions. Whereas the reduction of offloading in the informed conditions in Experiment 2 came along with more accurate subsequent memory, the absence of such a reduction in Experiment 3 was accompanied by the absence of differences in the subsequent memory tests. This consistency seems to suggest that there is a link between offloading and memory performance. Such a link would suggest that cognitive resources which remain “free” due to offloading are “lost” and do not contribute to the formation of memory. However, the forced offloading conditions in Experiment 3 prove the strong version of this argument to be wrong.

The results of Experiment 3 demonstrate that the amount of offloading does not necessarily determine memory accuracy. On the contrary, despite being forced to offload maximally, the participants in the forced/informed condition of this experiment showed almost the same memory accuracy as those participants in the choice/informed and choice/uninformed condition. Therefore, these conditions demonstrate that offloading does not necessarily have a detrimental impact on memory performance. Instead, at least under the extreme conditions of enforced maximum offloading, it seems to be possible to counteract the negative impact of offloading on the formation of memory (i.e. the released resources were not lost). This finding suggests that the announcement of the memory test and the corresponding induction of the specific goal to enhance memory accuracy contributes to the formation of long-term memory representations. What remains an open question for future research is why such beneficial effects of released resources do not arise with free choice offloading behavior. There are at least two speculative explanations for this pattern. First, it is possible that it is costly in terms of mental resources to coordinate a task solution at a medium memory load with a simultaneous medium

use of released resources. Second, it could be that a minimum amount of released resources is necessary to reveal their positive effects. In the case of forced offloading, there are probably more “free” than “used” resources which might have enabled their impact on the general pattern of results.

A remarkable finding across all experiments are the high correlations between offloading behavior and memory performance on an individual level. These correlations were present within implicit (i.e. uninformed) as well as explicit (i.e. informed) setups of the experiments and support our findings on the group level in Experiments 1 and 2. More pronounced offloading behavior diminishes subsequent memory performance for the offloaded information. It seems important to note, however, that this correlational relationship is not deterministic. In this third experiment, we forced participants to offload to a maximum extent and observed differences on the group level in the memory performance despite constant offloading behavior on the individual level. An alternative explanation for our correlational results could be that individual differences in memory abilities induce both more offloading behavior as well as lower memory performance. In this case, participants who generally memorize information more accurately do not need to rely on offloading strategies as extensively as participants with lower memory abilities. However, our study was not designed to trace back individual differences. Both working memory tests were administered only after the experimental manipulation in order to prolong the retention interval. Thus, explaining the individual differences which we consistently observed across all experiments urges for further research exploring their causal relationship.

A central question for the interpretation of our results is whether offloading behavior itself impacts memory performance. Alternatively, the participants in the lockout conditions could have used the 2-second lockout-times to rehearse the visual information and thus showed an improved subsequent memory performance relative to participants in the no lockout conditions. In this case,

the additional rehearsal time in the lockout condition rather than less cognitive offloading would have determined subsequent memory performance. Contrary to this view, however, our mediation analyses highlight the detrimental effects of offloading for the formation of memory representations. The impact of our manipulations (lockout/no lockout and informed/uninformed memory test) on subsequent memory performance was mediated by offloading behavior. This suggests that offloading behavior itself is associated with memory accuracy.

The Trade-Off of Cognitive Offloading

Beyond the conceptual replication of previous reports of a trade-off between immediate positive and subsequent negative effects of offloading memory processes in the Pattern Copy Task (Morgan et al., 2009; Morgan et al., 2013; Waldron et al., 2007), our results are also in line with studies reporting detrimental effects of cognitive offloading in other paradigms (Eskritt & Ma, 2014; Kelly & Risko, 2019; O'Hara & Payne, 1998; Pyke & LeFevre, 2011; Sparrow et al., 2011). For instance, Pyke and LeFevre (2011) observed that using a calculator in an alphanumerical test led to a higher response accuracy but in return to a worse subsequent recall of the solution. They therefore concluded that using a calculator results in less active learning than self-generating answers. Studies such as this one show that using technical tools to offload cognitive processes diminishes long-term learning across various paradigms and cognitive functions. With regard to our Pattern Copy Task, temporarily high loads of working memory (i.e. copying multiple objects simultaneously) rather than continuously low loads (i.e. copying the objects sequentially) enhanced subsequent memory accuracy under free choice conditions, although all participants had to handle the same overall amount of information.

Please note that these temporarily high loads of working memory enhanced memory for the identity of the objects as well as their locations relative to each other. The general pattern of

our findings matches the notion of desirable difficulties. Conceptually, desirable difficulties are supposed to enforce a more effortful and therefore more elaborate processing of information in order to enhance long-term learning (Bjork & Bjork, 2011). Thus, saving a lot of information internally places a high effort on internal cognitive resources which in return might lead to a deep processing of the information at hand and therefore foster learning. Within this account, avoiding offloading behavior (such as in Experiment 2) in order to foster long-term learning could be seen as self-generated desirable difficulty. Nevertheless, as observed in Experiment 3, the relationship between offloading and memory is not fully deterministic. As differences in memory could also arise with the same amount of offloading, it remains possible that participants could use released cognitive resources to acquire more accurate memory representations. Whether these released resources are employed in a manner that would be consistent with a self-generated desirable difficulty is one of the open questions to pursue in future research.

Our findings are also compatible with the framework of Salomon (1990) who proposed effects *with* technology on task processing as well as effects *of* technology on the development of cognitive abilities in the field of learning sciences. Effects *with* technology are supposed to affect immediate task processing due to utilizing technical tools, whereas effects *of* technology are potential long-term consequences (e.g., development of cognitive abilities) caused by preceding interactions with technology. Hence, cognitive offloading with technical tools might enable performance beyond internal cognitive limitations and thus increase immediate performance (Kirsh & Maglio, 1994; Salomon & Perkins, 2005). However, what users learn in this context appears to be how to effectively utilize the offloading device rather than solving the problem at hand with one's own cognitive abilities (Moritz et al., 2020). In return, it might be the absence of practice and routine in using internal resources which causes the detrimental effects of cognitive offloading (Risko & Gilbert, 2016; Salomon, 1990).

Positive consequences of cognitive offloading

Although Experiments 1 and 2, as well as the uninformed conditions in Experiment 3, constantly suggest that cognitive offloading is generally harmful for the formation of memory, one condition in our third experiment demonstrates that participants could counteract these detrimental effects under certain circumstances. In this experiment, we observed that the participants who were forced to offload to a maximum extent but were aware of the long-term memory test hardly differed in their memory performance from those participants who offloaded less under free choice conditions. This finding indicates that if it is necessary to acquire memory representations and there is no possibility to regulate offloading behavior, individuals can use released internal resources to improve memory performance. Please note that this improvement is relative to a condition in which participants are not aware of the subsequent memory test and therefore have no incentive to memorize the information. Overall, this improvement brings these participants (almost) back to the level of the participants who were able to freely choose their offloading behavior. As there is no benefit above the level of freely chosen offloading behavior, this might also be a reason why the participants in our Experiment 2 solved that task with more internal memory rather than with more offloading when they were aware of the memory test.

Our observation that participants in principle can take advantage of released resources matches a common argument in favor of cognitive offloading. One might consider that such released resources which come along with externalizations (Kirsh, 2010) could serve a deeper elaboration of the processed information (Sweller et al., 1998). In return, such a deeper elaboration could cause stronger memory representations (Craik & Lockhart, 1972). From the results of our experiments, it appears that such an argument rests on two essential preconditions. First, participants need to have the goal to foster long-term learning, as detrimental consequences

under implicit learning conditions are likely. Without such a goal, released cognitive resources seem to be “lost”. Second, the amount of released cognitive resources needs to be substantially large to contribute to learning. In our experiments, we only observed such a contribution of released resources when we forced participants to complete the task with a minimum of internal resources. It appears likely that the same pattern of results would have emerged if our participants had completed the task with minimal internal memory themselves. This leads to the interesting hypothesis that a substantial amount of released resources can contribute to learning, whereas a small amount cannot. Future research should therefore study the relationship between the amount of released resources and their beneficial effects on learning.

It seems noteworthy that the announcement of upcoming memory tests does not generally result in beneficial effects of cognitive offloading. In an experiment reported by Sparrow et al. (2011), the participants transferred trivia statements into a computer document. Whereas the participants remembered fewer of these statements when they believed their document was saved in the computer rather than when they believed their document was erased, announcing the memory test had no effect on performance. Given the substantial differences between both paradigms (task, materials, difficulty, etc.), it seems hardly helpful to speculate about the origin of the differences in the results. Nevertheless, this discrepancy again shows that the interactions between the released resources due cognitive offloading and the goal of acquiring new mental representations is understudied and not well understood yet. Given the widespread distribution of modern technical tools that allow for cognitive offloading, however, a deeper understanding of this interaction is highly relevant to enable an appropriate usage of such tools.

Our experiments as well as those of Sparrow et al. (2011) focused on the interplay of offloading and memory accuracy for the offloaded information itself. Beyond the offloaded information itself, however, cognitive offloading could also affect cognitive performance for

unrelated materials or in unrelated tasks (Runge et al., 2019; Storm & Stone, 2015). For instance, Storm and Stone (2015) observed that saving information in a technical tool before studying further information improved the memory performance of the latter information (i.e. reduced interference from the first information on the second). Further, there appear to be carry-over effects in offloading behavior between successive tasks (i.e. participants relying more on offloading in one task also rely more on offloading in a subsequent task; Storm, Stone, & Benjamin, 2016).⁶

Cognitive offloading as a strategy

Given the growing impact on people's everyday lives by technical tools including external memories (Finley, Naaz, & Goh, 2018), a careful consideration of the apparent benefits and the hidden risks of cognitive offloading seems needed in order to avoid unintended detrimental long-term effects. First, it appears necessary to evaluate the goal of the task at hand. If the goal focuses on immediate performance, our study suggests that the adequate strategy would be increasing externalizations. In contrast, if the task's goal involves components of memorization or learning, different strategies should be applied. On the one hand, offloading behavior could be avoided in order to create desirable difficulties and foster learning. On the other hand – if avoiding offloading is not possible – released resources due to offloading could be activated to foster learning.

In Experiment 2, we observed that participants who were aware of the upcoming memory test offloading less but had a better memory than participants who were not aware of the

⁶ For the interested readers, we added plots displaying offloading behavior across all trials and for each group within the Pattern Copy Task in the ESM (Figure S4, Figure S5, Figure S6). These plots show that participants mostly maintained their level of offloading after the first few trials for the rest of the task.

upcoming memory test. This finding suggests that the participants might have been aware of the negative consequences of cognitive offloading or at least did not believe that cognitive offloading could be used beneficially. Thus, it appears that the participants decided to rely more on their internal memory rather than on externalizations. Critically, we did not observe such a change in offloading behavior based on the announcement of the memory test in Experiment 3 (choice condition). Therefore, we cannot conclude from our experiments whether participants do or do not have metacognitive knowledge about the impact of cognitive offloading on memory. Nevertheless, our findings from Experiment 2 urge for further research directly investigating how metacognitions about the impact of offloading alter offloading behavior across tasks with varying goals focusing either on immediate performance or subsequent memory. A plausible venue for such research to explore this question would be to directly manipulate metacognitions.

Conclusion

Taken together, we can derive the following insights from our experiments: First, there is a trade-off between positive immediate and negative subsequent consequences of cognitive offloading. Second, under free choice offloading, more cognitive offloading was associated with a lower subsequent memory performance on the group level as well as on the level of individual differences. Third, announcing subsequent testing could compensate for at least some of the detrimental effects of cognitive offloading on memory acquisition. Fourth, reducing the amount of offloading as a self-generated desirable difficulty as well as a taking advantage of released cognitive resources might reflect competing strategies when counteracting the detrimental effects of cognitive offloading. Fifth and finally, resources released by cognitive offloading only contribute to the formation of memories in explicit learning contexts (i.e. when participants have the goal to learn) but are rather “lost” without such a learning context.

Author contributions:

All authors developed the study concept and contributed to the study design. S. Grinschgl was responsible for testing and data collection. S. Grinschgl performed the data analysis and interpretation under the supervision of F. Papenmeier and H. S. Meyerhoff. S. Grinschgl drafted the manuscript, F. Papenmeier and H. S. Meyerhoff provided critical revisions. All authors approved the final version of the manuscript for submission.

Open Practice Statement:

All experiments reported in this article were preregistered. The preregistrations, data as well as materials, have been made available on the Open Science Framework.

Experiment 1: <https://osf.io/vmgd4/>

Experiment 2: <https://osf.io/ke9dj/>

Experiment 3: <https://osf.io/k6t7q/>

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Electronic Supplementary Material Scatter Plots for Experiment 1

Figure 1.1 Scatter Plots of Correlational Analyses between Cognitive Offloading and Memory Performance (Identity) for Experiment 1 (see also Table 2 in article).

Figure 1.2 Scatter Plots of Correlational Analyses between Cognitive Offloading and Memory Performance (Identity-Location Bindings) for Experiment 1 (see also Table 2 in article).

Figure 1.3 Scatter Plots of Correlational Analyses between Cognitive Offloading and Memory Performance (Identity-Location Bindings corrected) for Experiment 1 (see Table 2 in article).

Scatter Plots for Experiment 2

Figure 2.1 Scatter Plots of Correlational Analyses between Cognitive Offloading and Memory Performance (Identity) for Experiment 2 (see also Table 5 in article).

Figure 2.2 Scatter Plots of Correlational Analyses between Cognitive Offloading and Memory Performance (Identity-Location Bindings) for Experiment 2 (see also Table 5 in article).

Scatter Plots for Experiment 3

Figure 3.1 Scatter Plots of Correlational Analyses between Cognitive Offloading and Memory Performance (Identity) for Experiment 3 (see also Table 9 in article).

Consequences of Cognitive Offloading

Figure 3.2 Scatter Plots of Correlational Analyses between Cognitive Offloading and Memory Performance (Identity-Location Bindings) for Experiment 3 (see also Table 9 in article).

Plots for Experiment 1

Figure 4. Plots of Offloading Behavior across Trials in Pattern Copy Task in Experiment 1. The first trial (Trial Number 1) was the practice trial, followed by twenty test trials (Trial Number 2-21).

Plots for Experiment 2

Figure 5. Plots of Offloading Behavior across Trials in Pattern Copy Task in Experiment 2. The first trial (Trial Number 1) was the practice trial, followed by twenty test trials (Trial Number 2-21).

Plots for Experiment 3

Figure 6. Plots of Offloading Behavior across Trials in Pattern Copy Task in Experiment 3. The first trial (Trial Number 1) was the practice trial, followed by twenty test trials (Trial Number 2-21).

Correlations for Experiment 1

Table 1

Pearson-Correlations Between Working Memory Capacity and Cognitive Offloading, Immediate Task Performance as well as Memory Performance in Experiment 1

	Cognitive Offloading	
	Openings of the Model Window	
	No Lockout	Lockout
Working Memory Capacity		
Visual Patterns Test	-.35***	-.22*
Corsi Blocks Task	-.29**	-.06
	Initial Encoding Duration (sec)	
	No Lockout	Lockout
Visual Patterns Test	.34**	-.04
Corsi Blocks Task	.28**	-.02
	Initially Correctly Copied Items	
	No Lockout	Lockout
Visual Patterns Test	.39***	-.11
Corsi Blocks Task	.38***	.004
	Immediate Task Performance	
	Trial Duration (sec)	
	No Lockout	Lockout
Visual Patterns Test	.07	-.32**
Corsi Blocks Task	-.09	-.23*
	Errors	
	No Lockout	Lockout
Visual Patterns Test	-.26*	-.26*
Corsi Blocks Task	-.09	-.04
	Memory Performance	
	Identity	
	No Lockout	Lockout
Visual Patterns Test	.28**	.09
Corsi Blocks Task	.26*	-.13
	Identity-Location Bindings	
	No Lockout	Lockout
Visual Patterns Test	.38***	.17
Corsi Blocks Task	.33**	-.08
	Identity-Location Bindings (corrected)	
	No Lockout	Lockout
Visual Patterns Test	.37***	.17
Corsi Blocks Task	.33**	-.08

*Note: * $p < .05$, ** $p < .01$, *** $p < .001$*

Correlations for Experiment 2

Table 2

Pearson-Correlations Between Working Memory Capacity and Cognitive Offloading, Immediate Task Performance as well as Memory Performance in Experiment 2

	Cognitive Offloading			
	Openings of the Model Window			
	No Lockout		Lockout	
	Uninformed	Informed	Uninformed	Informed
Working Memory Capacity				
Visual Patterns Test	-.51***	-.32*	-.38*	-.33*
Corsi Blocks Task	-.21	-.07	-.11	-.19
Initial Encoding Duration (sec)				
	No Lockout		Lockout	
	Uninformed	Informed	Uninformed	Informed
	.25	.10	.24	-.08
	-.15	-.04	.15	.005
Initially Correctly Copied Items				
	No Lockout		Lockout	
	Uninformed	Informed	Uninformed	Informed
	.38*	.34*	.24	-.21
	.01	.14	.03	.16
Immediate Task Performance				
Trial Duration (sec)				
	No Lockout		Lockout	
	Uninformed	Informed	Uninformed	Informed
	-.27	-.10	-.01	-.41**
	-.41*	-.19	-.08	-.18
Memory Performance				
Identity				
	No Lockout		Lockout	
	Uninformed	Informed	Uninformed	Informed
	.37*	.23	.15	.04
	-.04	-.09	.21	.02
Identity-Location Bindings				
	No Lockout		Lockout	
	Uninformed	Informed	Uninformed	Informed
	.32*	.27	.08	.19
	.01	-.06	.09	.17

Note: * $p < .05$, ** $p < .01$, *** $p < .001$

Correlations for Experiment 3

Table 3

Pearson-Correlations Between Working Memory Capacity and Cognitive Offloading, Immediate Task Performance as well as Memory Performance in Experiment 3

	Cognitive Offloading			
	Openings of the Model Window			
	Choice			
	Uninformed	Informed		
Working Memory Capacity				
Visual Patterns Test	-.22	-.39**		
Corsi Blocks Task	-.12	.06		
	Initially Correctly Copied Items			
	Choice			
	Uninformed	Informed		
Visual Patterns Test	-.03	.04		
Corsi Blocks Task	-.002	-.23		
	Immediate Task Performance			
	Trial Duration (sec)			
	Choice	Forced		
	Uninformed	Informed	Uninformed	Informed
Visual Patterns Test	-.50***	-.33*	-.19	-.11
Corsi Blocks Task	-.31*	-.24	-.36*	.06
	Memory Performance			
	Identity			
	Choice	Forced		
	Uninformed	Informed	Uninformed	Informed
Visual Patterns Test	-.003	.18	.07	.22
Corsi Blocks Task	.03	.04	.14	.24
	Identity-Location Bindings			
	Choice	Forced		
	Uninformed	Informed	Uninformed	Informed
Visual Patterns Test	.01	.01	.16	.17
Corsi Blocks Task	.10	.09	.13	.28

No analyses with forced condition due to no variance in offloading data

No analyses with forced condition due to no variance in offloading data

Note: * $p < .05$, ** $p < .01$, *** $p < .001$