

Task difficulty and individual differences in picture naming speed

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## Abstract

Studies show a wide range of individual variability in the time it takes speakers to produce a word or short phrase (e.g., in picture naming tasks). This variability in language production has often been attributed to variability in cognitive skills, such as attention, working memory, or inhibition. However, these skills are not necessarily unitary constructs, and different tasks that measure a certain construct (e.g., inhibition) may measure different aspects of the skill. There is also some evidence (e.g., from dual-task paradigms) that the relationships between cognitive skills and language production are more apparent with more demanding production tasks. In two experiments, we examined the relationship between a variety of cognitive measures (thought to tap into different aspects of these cognitive skills) and picture naming speed. In one of the experiments, the role of task difficulty was also probed by manipulating the perceived amount of time participants were given to name a picture. Only one significant correlation was found between a measure of cognitive skills (sustained attention) and picture naming speed; however, this was not replicated in the second experiment. We discuss the implications of these findings with respect to statistical power, reliability, and the specific tasks used to measure cognitive skills.

*Keywords:* language production, individual differences, cognitive skills, picture naming

## Task difficulty and individual differences in picture naming speed

Speaking is a well-practiced activity that, under many circumstances, feels fairly effortless. However, there is ample evidence that speaking does not necessarily happen automatically and may be at least partially dependent on available cognitive resources. For instance, speaking can interfere with a simultaneous task, such as driving a vehicle (e.g., Kubose et al., 2006) because it takes cognitive resources away from driving (Strayer & Johnston, 2001). Many laboratory studies of language production report a large amount of individual variability in how quickly speakers can, for example, name a picture (Bürki, 2017; Laganaro, Valente, & Perret, 2012; Valente, Bürki, & Laganaro, 2014), and this variability has been assumed to reflect differences in cognitive resources or abilities (e.g., Jongman, 2017; Jongman, Meyer, & Roelofs, 2015; Jongman, Roelofs, & Meyer, 2015; Piai & Roelofs, 2013; Shao, Meyer, & Roelofs, 2013; Shao, Roelofs, Acheson, & Meyer, 2014; Shao, Roelofs, Martin, & Meyer, 2015; Shao, Roelofs, & Meyer, 2012; Sikora, Roelofs, Hermans, & Knoors, 2016).

**Cognitive abilities that predict speed of language production**

Several studies have shown that how quickly an individual can produce words or short phrases is related to more general cognitive skills, including attention (Jongman, 2017; Jongman, Meyer, et al., 2015; Jongman, Roelofs, et al., 2015), working memory (Lorenz, Zwitserlood, Regel, & Abdel Rahman, 2019; Piai & Roelofs, 2013; Shao et al., 2012; but see Klaus & Schriefers, 2018), and inhibition (Shao et al., 2013, 2014, 2015, 2012; Sikora et al., 2016). For the current study, we are interested in how generalizable these relationships are, specifically, whether we find similar relationships between picture naming speed and cognitive tasks when employing a wider battery of cognitive tests that are thought to measure these constructs. As we discuss in more detail in the next section, some tasks that have been used to measure certain cognitive skills do not necessarily correlate well with each other. For example, Flanker and Simon tasks are both thought to measure inhibition,

but correlations between these measures are consistently low (e.g., Paap & Sawi, 2014). A skill like inhibition (like other cognitive abilities) is not a unitary construct, and different tasks may very well tap into different types or components of inhibition.

This provides an opportunity to learn more about which aspects or components of inhibition, working memory, or attention are involved in language production. In the following sections, we will give an overview of the cognitive functions that have been found to correlate with language production speed (working memory, inhibition, and sustained attention), and we will discuss tasks that are often used to measure these constructs.

**Working memory.** Working memory can be described as the ability to hold information in mind and manipulate it in order to perform a cognitive task (e.g., Baddeley, 1992, 2010). Commonly used tasks to evaluate working memory include, for example, span tasks (e.g., Conway et al., 2005). In span tasks, participants are asked to remember target items whose presentation alternates with distractor items or another task. For instance, the operation span task consists of the alternating presentation of a letter and an arithmetic problem. Participants are asked to solve each math problem and to recall all letters at the end of a sequence (e.g., Unsworth, Heitz, Schrock, & Engle, 2005). Given that this task requires the participant to recall verbal material, it is often used to determine whether participants' performance on a linguistic task correlates or is predicted by working memory scores. In other tasks, participants are asked to remember the positions of a shape on a grid (symmetry span task, e.g., Unsworth, Redick, Heitz, Broadway, & Engle, 2009) or the length and directions of arrows (rotation span task, Harrison et al., 2013).

Shao et al. (2012) found a correlation between participants' performance on the operation span task and their speed of naming pictures of actions (though not pictures of objects), suggesting that working memory is at least partially involved with word production. However, as suggested by various authors (Conway et al., 2005; Engle, Tuholski, Laughlin, & Conway, 1999; Shipstead, Redick, & Engle, 2012), participants'

80 scores on span tasks are not completely independent from the demands of the task. For  
81 instance, two participants with the same working memory capacities but different  
82 arithmetic skills will likely obtain different scores on the operation span task. Therefore, it  
83 is of interest to test whether other types of span tasks (e.g., rotation or symmetry) are also  
84 related to picture naming speed, as the demands of the distractor items in these tasks may  
85 influence participants' scores on the tasks.

86 **Inhibition.** Inhibition is described as the ability to resolve conflicts and suppress  
87 irrelevant information. Recent studies, however, suggest that inhibition is not a unitary  
88 construct (Rey-Mermet & Gade, 2018; Rouder & Haaf, 2019). For instance, inhibition can  
89 be characterized as being selective or non-selective (Shao et al., 2013, 2015). Non-selective  
90 inhibition is the ability to inhibit any unwanted response (De Jong, Coles, & Logan, 1995),  
91 while selective inhibition describes the ability to inhibit a more specific response that  
92 directly competes with the desired response. Several authors further subdivide selective  
93 inhibition into two different types: stimulus-stimulus conflict and stimulus-response conflict  
94 (Hommel, 1997; Kornblum, 1994; Scerrati, Lugli, Nicoletti, & Umiltà, 2017).  
95 Stimulus-stimulus conflicts arise from an incompatibility between overlapping task-relevant  
96 and task-irrelevant features of the stimulus to be processed, while stimulus-response  
97 conflicts arise from an overlap of incongruent stimulus and response features (Kornblum,  
98 1994).

99 Measures of both selective and non-selective inhibition have been found to correlate  
100 with picture naming speed or the magnitude of experimental effects in a picture naming  
101 task (Shao et al., 2013, 2015). For instance, Shao et al. (2013) measured non-selective  
102 inhibition by means of a stop-signal reaction time task (Logan & Cowan, 1984), which is  
103 thought to assess the ability to inhibit a motor response that has already been initiated,  
104 i.e., a non-linguistic response. On this task, participants are asked to respond to a stimulus  
105 presented, but on a certain proportion of the trials, they hear a tone to indicate they  
106 should withhold their response on that trial. Shao et al. (2013) report correlations between

performance on the stop-signal reaction time task and word production speed, suggesting that the relationship between language production and non-selective inhibition may not be specific to the language domain.

Shao et al. (2013, 2015) measured selective inhibition using a within-task measure derived from distributional properties of the task. In those studies, participants performed a picture-word-interference task, in which they named pictures with printed distractor words overlayed on them. The distractor words were either semantically related or unrelated to the target word. Participants typically need more time to produce words when they see semantically related distractors than unrelated distractors (i.e., the semantic interference effect, see Bürki, Elbuy, Madec, & Vasishth, 2020 for review). Shao et al. (2013, 2015) used the delta plot procedure (Ridderinkhof, Scheres, Oosterlaan, & Sergeant, 2005; Ridderinkhof, Wildenberg, Wijnen, Burle, et al., 2004) to compute a measure of inhibition, which can be understood as the change in the semantic interference effect over the trials in the experiment with the slowest response times. Shao et al. (2013, 2015) found that this within-task measure of inhibition correlated with the magnitude of the semantic interference effect in a picture-word interference task, as well as in a semantic blocking task (Shao et al., 2015).

While it is certainly intuitive that inhibition is needed for a task such as the picture-word interference task, we showed using simulated data that the correlation between this within-task measure of inhibition and the semantic interference effect arises as a mere consequence of the distributional properties of the data (Fuhrmeister & Bürki, 2022). Specifically, the semantic interference effect is largest in the slowest responses; therefore, it is not surprising that this measure that is computed in part with the effect size over the slowest trials correlates strongly with the mean semantic interference effect. Especially since Shao et al. (2014) found a correlation between the size of the semantic interference effect and the ERP N2 component (thought to reflect inhibition), it is certainly

possible that selective inhibition is involved in language production; however, we need different measures of inhibition to support this idea. In the current study, we have two different measures of selective inhibition that we will correlate with picture naming speed to further test this assumption.

**Attention.** Sustained attention describes the ability to maintain alertness to detect infrequent events over a long period of time (Sarter, Givens, & Bruno, 2001). Several studies have found relationships between measures of sustained attention and language production (Jongman, Meyer, et al., 2015; Jongman, Roelofs, et al., 2015). For example, Jongman and colleagues have used measures of sustained attention with geometrical shapes (Jongman, Roelofs, et al., 2015) or digits (Jongman, Meyer, et al., 2015; Jongman, Roelofs, et al., 2015). In addition, they have used both visual and auditory variations of a sustained attention task and found that both variations correlated with word production speed (Jongman, Roelofs, et al., 2015). This provides some evidence that relationships between sustained attention and language production measures may reflect more general attention abilities and may not be specific to a certain domain.

## Experiment 1

The goal of the current study is to extend previous findings on the relationship between cognitive skills and word production and to test how generalizable these relationships are. As discussed above, some tasks thought to measure a common construct do not necessarily correlate with each other, suggesting they measure different aspects of the skill. This provides an opportunity to better understand relationships between cognitive skills and word production. For instance, we ask whether cognitive tasks performed in different domains (e.g., linguistic, non-linguistic, auditory, visual) thought to measure a similar construct similarly predict word production speed.

In the first experiment, participants performed a picture-word interference task, in which they named pictures with printed distractor words superimposed on the pictures.

The task included several conditions: a baseline condition, in which participants saw a line of Xs printed on the picture; a semantic condition, in which participants saw a distractor that was either semantically related or unrelated to the picture; and a phonological condition, in which participants saw a distractor that was either phonologically related or unrelated to the target. The picture naming data have been reported elsewhere (Bürki & Madec, 2022; Fuhrmeister, Madec, Lorenz, Elbuy, & Bürki, 2022). For the present reanalysis, we analyze only trials in the baseline condition to test whether measures of working memory, inhibition, or attention predict speed of simple picture naming.

## Method

### Participants

A total of 45 participants (ages 18-30, mean age = 23,  $SD = 3.51$ ) were recruited for the study. All participants were native speakers of German and reported normal hearing and no history of psychiatric, neurological, or language disorders. Participants were paid or received course credit for their participation in the study, and they gave informed consent according to the University of Potsdam's (Germany) ethical committee guidelines.

### Procedure

Participants performed several tasks over three different sessions. In the first session, participants completed a picture-word interference task, a delayed naming task, and a word naming task (i.e., reading aloud). Again, only the baseline condition of the picture-word interference task is reported here. The continuous EEG was also recorded during the picture-word interference task, but those data are also reported elsewhere (Fuhrmeister et al., 2022). In the second and third sessions of the experiment, the following cognitive tests were administered: the German MWT-B (Mehrfachwahl-Wortschatztest, Version B, Lehrl, 1975), the coding subtest of the Wechsler Adult Intelligence Scale–Fourth Edition (WAIS-IV, Wechsler, 2008), the digit span forward and backward subtest of the Wechsler



Memory Scale Revised (Wechsler, 1987), and the Corsi Block-Tapping Task forward and backward. These tests are part of the battery of tests used in an institutional project on variability in language and are used to allow comparisons across age groups and to screen potential control participants for projects that involve participants with aphasia. These tests were not analyzed in the present study and will not be reported further. During the third session, participants performed eight cognitive tasks (see Table 1) to test for relationships between measures of cognitive functions and performance on the language production task.

## Stimuli and task descriptions

**Picture naming task.** Stimuli for the picture naming task consisted of 90 pictures from the Multipic database (Duñabeitia et al., 2018). Lemma frequencies (mean frequency = 1991.3,  $SD = 3678.4$ , range 9-21184) for the words were obtained from the dlex database (Heister et al., 2011). As mentioned above, the original task contained several conditions with distractor words printed on the pictures; however, only trials from the baseline condition, which consisted of six Xs superimposed on the picture, are reported here.

Participants were first familiarized with the pictures: They saw one picture at a time on the screen with its corresponding name and were asked to read the words silently. The presentation of items was randomized.

For the picture naming task, participants first completed a short training phase, followed by the main task, which consisted of five blocks of trials. Each picture was presented once per block, and there was an equal number of trials in each condition per block. Pictures were presented in a pseudorandom order in each block. The structure of a trial was as follows: a fixation cross appeared on the screen for 2200-2300ms; then the picture was displayed either for 2300ms or until the participant started speaking. Vocal responses were recorded for 3000ms starting at the onset of picture presentation. A trial

ended with an inter-trial interval that had a random duration between 1000 and 1200ms.

**Cognitive skills.** Following previous work on the relationship between language production and domain-general cognitive abilities, we included tasks to measure participants' working memory, sustained attention, and inhibition abilities. In order to replicate and extend previous findings in the language production literature, we included several tasks that have been used (or were similar to those that have been used) in previous studies. In addition, we included tasks that targeted different aspects of these cognitive skills.

**Span tasks.** We administrated two blocks of each span task (operation span, symmetry span, and rotation span), following the recommendations of Foster et al. (2015)<sup>1</sup>. Recall that each task consists of sequences of target and distractor items, and participants are asked to respond to distractor items (e.g., solve a math problem). At the end of each sequence, participants attempted to recall all target items in the order they were presented.

As discussed in the introduction, the operation span task consists of target items (letters to be recalled) and distractor items (math problems). The target and distractor items are presented in alternating order, and participants are asked to recall the letters in the order they were presented. In the symmetry span task, a sequence consists of the alternating presentation of a 4x4 grid containing a single square and a geometrical shape that may or may not be symmetrical relative to the vertical axis. The positions of the squares in the 4x4 grid are the target items, and the symmetrical or asymmetrical geometrical shapes are the distractor items. After each geometrical shape, participants must determine whether the shape was symmetrical or not. After each sequence, participants are asked to recall the positions of the squares in the 4x4 grid. In the rotation span task, a sequence consists of a rotated letter that can be vertically reversed or not and

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<sup>1</sup> These tasks are available from the Georgia Tech Attention and Working Memory Lab website (<http://englelab.gatech.edu>). We used their scripts to implement the tasks in OpenSesame (Mathôt, Schreij, & Theeuwes, 2012) for stimulus presentation.

of an arrow (long or short) pointing in one of 8 possible directions. Arrow lengths and directions are the target items, and rotated letters are the distractor items. After each distractor item, participants must determine whether the letter was reversed or not. Following the presentation of a sequence, participants are asked to recall the lengths and directions of the arrows.

To determine the length of a sequence in the span tasks, we followed recommendations from Draheim, Harrison, Embretson, and Engle (2018). In the operation span task, the length of a sequence varied from three to eight items; in the symmetry span task, from two to six items; and in the rotation span task, from two to five items. Each block contained sequences of all possible lengths, and each block was repeated for each task (i.e., two blocks total per task).

***Stop-signal reaction time task.*** As described briefly above, the stop-signal reaction time task is thought to measure non-selective inhibition, i.e., the suppression of any unwanted or irrelevant response (De Jong et al., 1995). In this task, participants are asked to respond to various stimuli (“go” trials), but on some trials, they are asked to inhibit their response (“no-go” trials).

During the go trials, a fixation cross was displayed for 250 ms at the center of the screen and then replaced by either the symbol “<” or the symbol “>”. Participants were instructed to press a left keyboard key after the onset of the “<” symbol and a right keyboard key after the onset of the “>” symbol. During the no-go trials, a tone (750Hz, lasting 75 ms) sounded shortly after the onset of the visual symbols, indicating to the participants that they should not respond on these trials. This was an adaptive task: At the beginning of the procedure, the delay between the onset of the visual symbol and the onset of the tone (i.e., the stop signal delay) was 250 ms (i.e., the tone was displayed 250 ms after the onset of the visual symbol). The stop signal delay was then adjusted depending on the participant’s performance. Following successful inhibition, the stop signal

delay was increased by 50 ms. When participants failed to inhibit the response on a no-go trial, the stop signal delay was reduced by 50 ms.

Following the recommendations of Matzke, Verbruggen, and Logan (2018), the task started with a familiarization block of 20 go trials. Then, participants performed a practice block with 18 go trials and 6 no-go trials. For this practice block, participants were instructed to not slow down their responses on go trials (Matzke et al., 2018). Three experimental blocks followed, consisting of 48 go trials and 16 no go trials. Participants were asked to perform the task as quickly as possible.

**Flanker task.** In the Flanker task, an arrow pointing either to the left or to the right is presented at the center of the screen, and participants have to determine the direction of the arrow using the corresponding left or right arrow key on the keyboard. This central arrow is flanked either by arrows pointing in the same direction («»», congruent condition), the opposite direction («>«, incongruent condition), or by straight lines (->-, neutral condition). Participants started with 18 training trials, six in each condition. There were four experimental blocks, each consisting of 46 congruent trials, 46 incongruent trials and 46 neutral trials (see Hedge, Powell, & Sumner, 2018 for justification regarding the number of trials in this task).

**Simon task.** In the Simon task, participants started with a familiarization phase of 40 trials. During this phase, a blue (50% of trials) or red circle appeared in the center of the screen. Participants had to press a key on the left hand side of the keyboard upon seeing a blue circle and on the right hand side upon seeing a red circle. They were asked to respond as quickly as possible. The familiarization phase was followed by a practice phase with 56 trials. A trial started by the presentation of a fixation cross located at the center of the screen for 500ms. Then a blue or red circle appeared either on the left-hand or right-hand side of the fixation cross. Trials with the blue circle appearing on the left-hand side or with a red circle appearing on the right hand side are called congruent trials, because the position of the circle and the correct response key are on the same side.

Conversely, trials where the blue circle appears on the right-hand side or a red circle on the left-hand side are called incongruent trials. During this practice phase, there were 42 congruent trials (21 blue and 21 red circles), and 12 incongruent trials (6 blue and 6 red circles). After the practice phase, participants performed the same task in two experimental blocks of 120 trials each, with 90 congruent trials and 30 incongruent trials (see Wöstmann et al., 2013 on the selection of the number of trials).

***Conjunctive continuous performance task.*** In this task, participants see a flow of visual symbols that vary in shapes (i.e. squares, triangles, stars, circles) and in color (i.e. blue, green, red, yellow). Participants must press a button as soon as they see a red square. We followed the procedure outlined in Shalev, Ben-Simon, Mevorach, Cohen, and Tsal (2011). The task included 320 trials: 30% of trials contained the target (i.e., the red square); 17.5% of trials contained red, non-square symbols; 17.5% of trials contained square, non-red symbols, and the remainder of the trials contained non-red and non-square symbols. The inter-trial interval ranged from 1000 ms to 2500 ms, by steps of 500 ms.

***Continuous time expectancy task.*** For this task, participants saw visual patterns and were asked to identify a pattern that was presented for a longer duration than the others. We used four visual patterns, as in O’Connell et al. (2009). The standard duration in our task was set to 800ms, and the target duration was set to 1300ms. The procedure started with a familiarization block, followed by a training block, and ended with a single experimental block. During the familiarization block, 32 patterns appeared one by one on the screen. Four of these patterns were target patterns, while the other ones were standard patterns. Participants had to detect the target patterns but were not asked to respond. A training block followed only if participants reported that, during the familiarization block, they noticed some patterns (the target) lasting longer than the other ones. During the training block, they were instructed to press the space bar as soon as they noticed a target. There were 24 trials and among them, 3 targets. If participants were unable to detect the three targets during the training block, they had to perform it again

until they were able to detect every target. The experimental block consisted in 674 trials, with 84 targets. Distances between two deviant trials ranged from 4 to 10 trials, with 12 trials for each of these numbers. Following the presentation of a target, participants had to provide an answer within 700ms.

## Analyses

### Computing scores from cognitive measures

#### Picture naming measures and correlations

To derive measures of word production speed, we estimated ex-gaussian parameters of each participant's response time distribution, following previous work (Jongman, Meyer, et al., 2015; Jongman, Roelofs, et al., 2015; Shao et al., 2013). An ex-gaussian distribution often provides a good fit to reaction time data and is composed of three parameters:  $\mu$ ,  $\sigma$ , and  $\tau$ . The  $\mu$  and  $\sigma$  parameters represent the mean and standard deviation of the Gaussian portion of the distribution, respectively, and the  $\tau$  parameter represents the mean and standard deviation of the exponential part of the distribution (Balota & Yap, 2011; Tse, Balota, Yap, Duchek, & McCabe, 2010). The  $\tau$  parameter can be understood conceptually as the proportion of abnormally slow responses, or the right tail of the reaction time distribution. We estimated ex-gaussian parameters for each participant separately using the `mexgauss()` function in the `retimes` package (Massidda & Massidda, 2013) in R (R Core Team, 2021). We then tested for correlations between the ex-gaussian parameters  $\mu$  and  $\tau$  and measures of cognitive skills ( $\mu$  and  $\tau$  because we do not have theoretical motivation to think that we should find relationships between cognitive skills and variance). We acknowledge that this approach leads to a number of statistical tests being done, which can inflate Type I error rates. However, because we do not know which cognitive tests these relationships will generalize to, it is important to fully explore these relationships. Therefore we view Experiment 1 as an exploratory endeavor, in which we will first pinpoint plausible extensions of the relationships found previously in the literature

by reporting correlations without correcting for multiple comparisons. We will replicate relationships found in Experiment 1 in a confirmatory manner in Experiment 2. All analyses were performed in R (R Core Team, 2021), and pre-processed data and analysis scripts are publicly available in the OSF repository at <https://osf.io/4ftex/>.

## Results

### Descriptive statistics

We first calculated descriptive statistics (mean and standard deviation) of all of the cognitive measures to determine whether there is a sufficient amount of variability among participants to obtain meaningful correlations with each of the measures. In Table 1 we report the mean and standard deviation of each of the measures, and a histogram of the scores can be seen in Figure 1. Visual inspection of the histograms suggests a ceiling effect for the conjunctive continuous performance task, which is confirmed by the descriptive statistics ( $M = 1.00$ ,  $SD = .01$ ). Due to this ceiling effect, we would not expect to be able to find meaningful correlations with this measure, so we do not consider it in any further analyses. All other measures seem to have a sufficient spread of scores to use in further analyses.

### Correlations among measures

Next, we report correlations among all measures to determine whether the cognitive tests thought to measure similar constructs are correlated with each other. Based on previous literature, we expected to find correlations among the inhibition measures (Simon, Flanker, and SSRT tasks) and working memory measures (operation, symmetry, and rotation span tasks). However, some previous work has not found correlations among tasks thought to measure similar skills, such as inhibition (e.g., Paap & Sawi, 2014); therefore, we may see only weak or no correlations among these skills. Figure 2 reports correlations between all pairs of tasks. The span tasks correlated fairly well with each other, and there

Table 1

*Mean and standard deviation (sd) of scores on all cognitive tests.*

| <i>Test</i>                        | <i>Skill being measured</i> | <i>mean</i> | <i>sd</i> |
|------------------------------------|-----------------------------|-------------|-----------|
| Conjunctive continuous performance | Sustained attention         | 1.00        | 0.01      |
| Continuous time expectancy         | Sustained attention         | 0.82        | 0.15      |
| Flanker RT cost                    | Selective inhibition        | 63.47       | 21.73     |
| Operation Span                     | Working memory              | 0.75        | 0.16      |
| Rotation Span                      | Working memory              | 0.77        | 0.15      |
| Simon RT cost                      | Selective inhibition        | 63.95       | 26.62     |
| Stop-signal reaction time          | Non-selective inhibition    | 207.41      | 47.63     |
| Symmetry Span                      | Working memory              | 0.73        | 0.13      |

was also a significant correlation between the SSRT task and the symmetry span task.

### Correlations between cognitive skills and word production speed

The correlations between the ex-gaussian parameters and measures of cognitive skills can be found in Table 2. Only the continuous time expectancy task correlated with the  $\mu$  parameter (i.e., the mean) suggesting that higher scores on the sustained attention task corresponded to faster naming speed. No correlations were found between cognitive skills and  $\tau$  (exponential).

### Discussion

In Experiment 1, we tested whether several cognitive skills thought to be related to individual differences in language production correlated with other related measures (that perhaps tap into different aspects of these skills). We additionally tested whether any of these measures correlated with the  $\mu$  and  $\tau$  (exgaussian) parameters of the distribution of response times in a picture naming task.



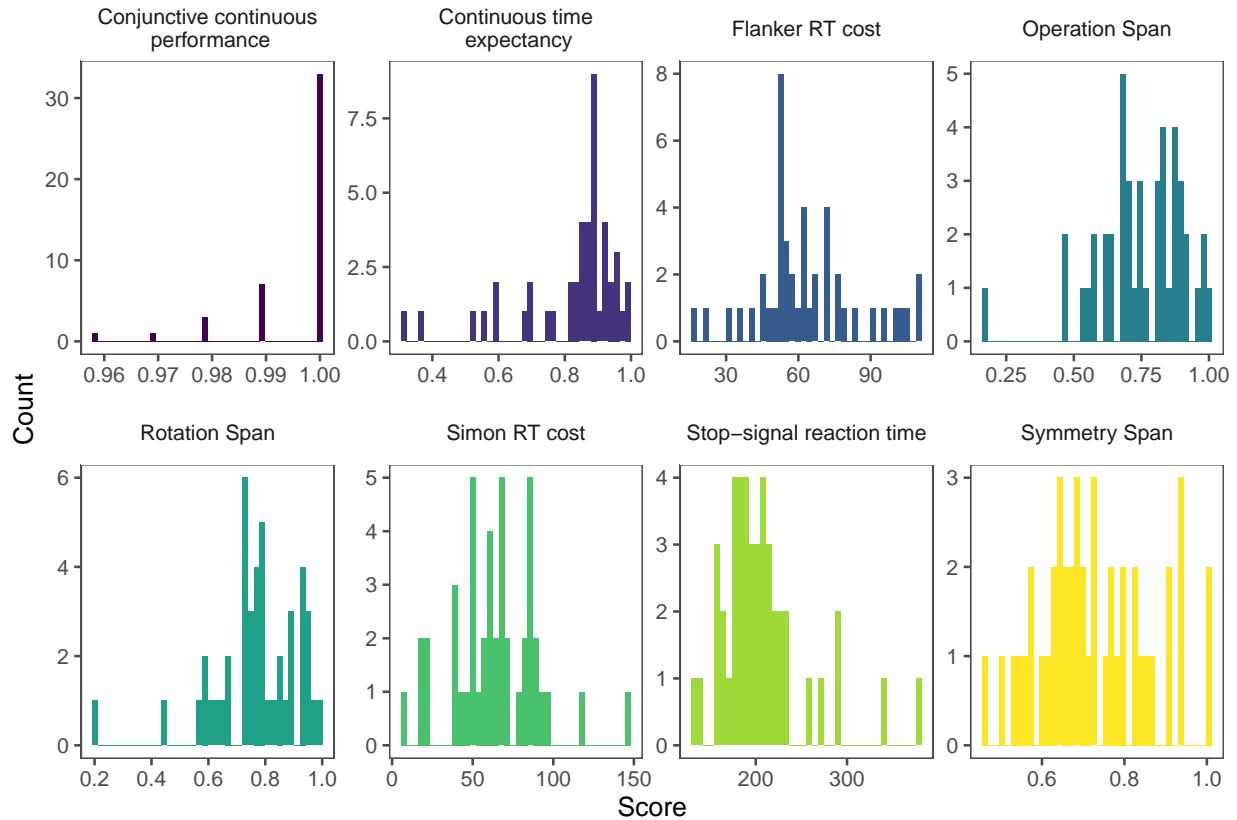


Figure 1. Histogram of participants' scores on all cognitive tests. Note the difference in axes.

We found significant correlations among the span tasks that measure working memory. However, the inhibition measures did not seem to related to each other very well, with some correlations close to zero. We did not have enough variability in the conjunctive continuous performance task that measures attention to test for a correlation with the other measure of attention (continuous time expectancy task).

\*\*\* something about replicating Jongman et al attention correlations (did we, or was theirs with tau?) maybe discuss in a little detail...

## Experiment 2

In Experiment 2, we test whether certain cognitive skills predict picture naming speed when participants are encouraged to respond faster, and we compare this with a non-speeded condition.

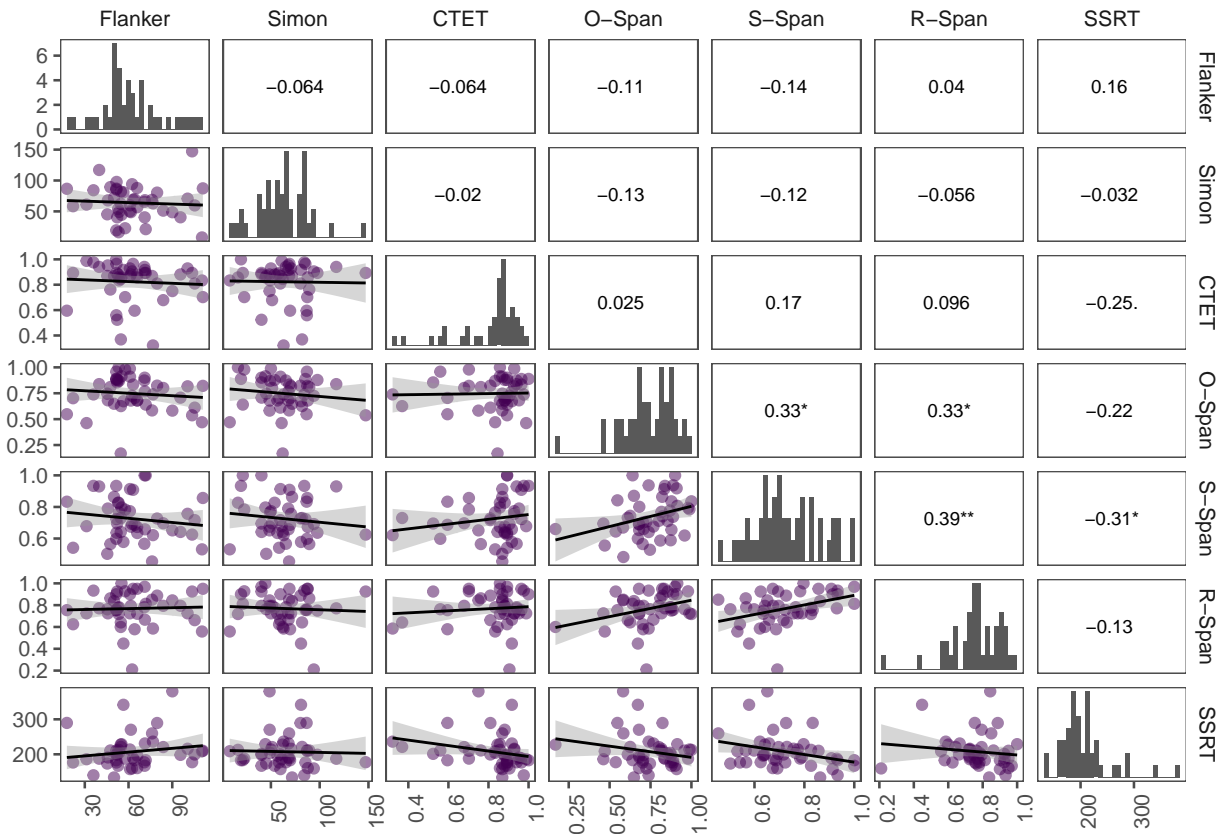


Figure 2. Correlations between all cognitive measures in Experiment 1. Flanker = Flanker RT cost, Simon = Simon RT cost, CTET = continuous time expectancy task, O-Span = operation span task, S-Span, R-Span = rotation span task, SSRT = stop-signal reaction time task. Significance levels: \*\*\* = < .001, \*\* = .01, \* = .05, . = .1

In Experiment 1, we found little support for the idea that cognitive skills predict picture naming latencies. However, the picture naming task was quite simple, and cognitive skills or resources may be more important when the task is more difficult. Some evidence for this idea comes from studies using a dual-task paradigm (e.g., Ferreira & Pashler, 2002). For example, Piai and Roelofs (2013) had participants perform picture naming and tone discrimination tasks in a dual-task paradigm. They found a relationship between a measure of updating ability (i.e., working memory, as measured by an operation span task) and participants' picture naming speed, as well as the interference effect from the dual task: Participants with better updating or working memory abilities were faster to

Table 2

*Correlations between cognitive skills and  $\mu$  and  $\tau$  parameters of picture naming response time distributions.*

|         | $\mu$ $r$ | $\mu$ $p$ | $\tau$ $r$ | $\tau$ $p$ |
|---------|-----------|-----------|------------|------------|
| Flanker | -0.06     | 0.67      | 0.17       | 0.25       |
| Simon   | 0.11      | 0.47      | 0.05       | 0.75       |
| CTET    | -0.31     | 0.04      | -0.20      | 0.18       |
| O-Span  | -0.08     | 0.62      | 0.01       | 0.95       |
| S-Span  | -0.14     | 0.35      | 0.25       | 0.10       |
| R-Span  | -0.15     | 0.33      | 0.00       | 0.99       |
| SSRT    | 0.16      | 0.30      | 0.14       | 0.36       |

name pictures and were not as affected by the interference from the two tasks. Shao et al. (2012) similarly found evidence that cognitive skills are related to picture naming speed in more demanding task conditions. For example, updating ability (also measured by an operation span task) was correlated with picture naming speed for pictures of actions but not objects. They argue that naming pictures of actions is more difficult than naming pictures of objects because actions are conceptually and grammatically more complex.

The goal of Experiment 2 is to test whether relationships between cognitive skills and word production speed is stronger when the task is more difficult. In the current study, we manipulated task difficulty by the perceived amount of time that participants have to name a picture.

If more difficult tasks place higher cognitive demands on participants, we predict that better performance on cognitive skills will predict faster response times during the picture naming task in the speeded condition. We may see similar relationships in the non-speeded

condition, but we expect that these relationships will be stronger in the speeded than in the non-speeded condition. Additionally, if the correlation found in Experiment 1 is not a Type I error, we expect to replicate it here.

## Method

### Participants

A total of 48 participants (ages 18-20,  $M = 23.2$ ,  $SD = 3.5$ ) took part in the experiment. All participants were right-handed, native speakers of German with typical hearing and no history of neurological or language disorders. Participants were either paid for their participation or received course credit. Participants were given details about the experimental procedure and gave informed consent before starting the experiment. The study received ethical approval by the ethical committee of the University of Potsdam (Germany).

### Procedure

The experiment was conducted in two sessions. In the first session, participants completed a picture-word-interference task and three related tasks: a recall task, a delayed naming task, and a reading task; only the results from the picture-word-interference task are reported here. Next, we obtained the following measures of cognitive skills: the German MWT-B (Mehrfachwahl-Wortschatztest, Version B; Lehrl, 1975); the Coding subtest of the Wechsler Adult Intelligence Scale- Fourth Edition (WAIS-IV; Wechsler, 2008); the digit span forward and backward subtest of the Wechsler Memory Scale Revised (Wechsler, 1948) and the Corsi Block-Tapping Task forward and backward (Corsi, 1973). During the second session, we administered three span tasks to assess participants' updating abilities, two tasks testing sustained attention abilities, and three tasks measuring non-selective and selective inhibition (see below for tasks descriptions).

## Stimuli and task descriptions

**Picture naming task.** To test whether cognitive skills are more strongly related to word production speed in more difficult tasks, participants performed picture-word-interference task (as described in Experiment 1) under two conditions: a speeded and a non-speeded condition. The experiment consisted of two blocks, and each condition was administered in one block. Participants named two lists of pictures: Each list consisted of 20 training trials, 110 filler trials, and 225 test trials (order of condition and presentation of lists were counterbalanced). The structure of each block was as follows: Participants were first familiarized with the pictures and corresponding words that were used in that block of the task. Participants saw each picture displayed with its name in written form, and they were asked to read the name silently and to press a button to advance to the next picture. Participants were told they would be asked to name the pictures using the name from the familiarization phase in a later phase of the experiment. Next, participants completed a short training phase that consisted of 20 trials; training trials were not included in the analyses. After the training phase, participants completed the main picture-word-interference task. On each trial, a fixation cross was displayed on the screen for 800ms, and then the picture appeared. Participants were instructed to produce the name of the picture as fast as possible. The duration for which the item stayed on the screen depended on the experimental condition. Each block contained filler and test trials, and condition (speeded vs. non-speeded) was manipulated with the filler trials only. In each block (both speeded and non-speeded), the picture on each test trial stayed on the screen for 1200ms, but the duration varied for the filler trials. In the non-speeded condition, the pictures on the filler trials stayed on the screen for 1200ms, just like the test trials. However, in the speeded condition, the pictures on the filler trials stayed on the screen for a shorter duration that varied between 400 and 600ms. Only the test trials were analyzed; the purpose of the filler trials was to manipulate the perceived amount of time that participants were given to name the picture. This ensured that the naming latencies

that were compared across blocks were based on the same type of trials.

**Cognitive skills.** We used the same battery of cognitive tests that were used in Experiment 1 and computed scores in the same way.

## Analyses

The analyses were identical to Experiment 1, except the exgaussian parameters were calculated for each condition (speeded vs. non-speeded) separately. We first report descriptive statistics, then correlations of cognitive measures with each other, and finally, correlations between cognitive measures and mu and tau parameters from the response time distribution.

## Results

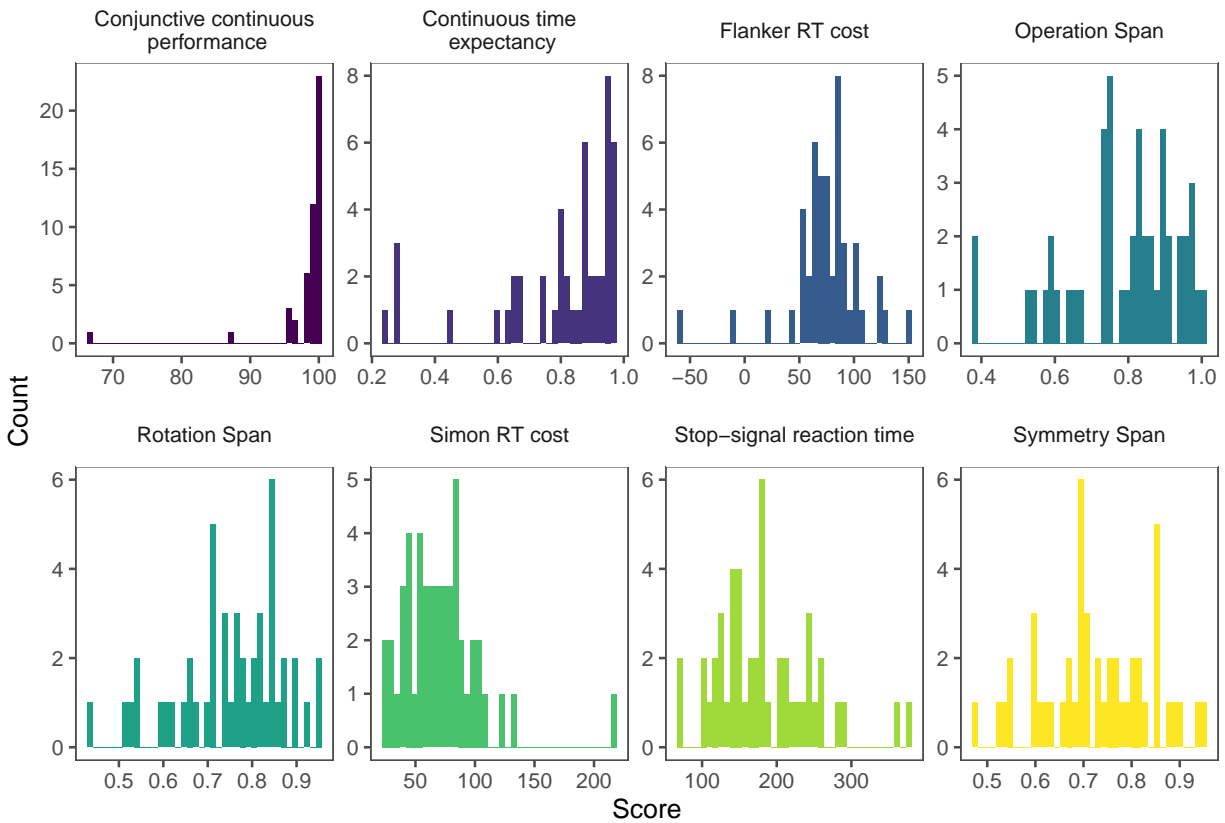
We first report descriptive statistics on all cognitive measures. Similar to Experiment 1, we want to ensure we have enough variability among participants to find meaningful correlations with the measures. Means and standard deviations for each measure can be found in Table 3, and histograms in Figure 3. Similar to Experiment 1, we see a ceiling effect for the conjunctive continuous performance task, although there is slightly more variability than in Experiment 1. This is mostly due to one participant who has a much lower score; however, this participant did not consistently score low on all measures; therefore, we assume the participant was indeed doing the tasks in good faith. As in Experiment 1, we will not include this measure in the following analyses.

Next, we computed the correlations of all the cognitive measures with each other, just as we did in Experiment 1. All correlations can be found in Figure 4. Here we see more significant correlations: The working memory (span task) measures patterned together again, the continuous time expectancy task correlated moderately with the span tasks, and the stop-signal reaction time task correlated with the Simon task (another measure of inhibition), as well as two of the span tasks.

Table 3

*Mean and standard deviation (sd) of scores on all cognitive tests.*

| <i>Test</i>                        | <i>Skill being measured</i> | <i>mean</i> | <i>sd</i> |
|------------------------------------|-----------------------------|-------------|-----------|
| Conjunctive continuous performance | Sustained attention         | 98.13       | 5.08      |
| Continuous time expectancy         | Sustained attention         | 0.80        | 0.20      |
| Flanker RT cost                    | Selective inhibition        | 75.39       | 32.86     |
| Operation Span                     | Working memory              | 0.79        | 0.15      |
| Rotation Span                      | Working memory              | 0.75        | 0.12      |
| Simon RT cost                      | Selective inhibition        | 70.99       | 33.04     |
| Stop-signal reaction time          | Non-selective inhibition    | 182.63      | 65.70     |
| Symmetry Span                      | Working memory              | 0.73        | 0.11      |



*Figure 3.* Histogram of participants' scores on all cognitive tests. Note the difference in axes.

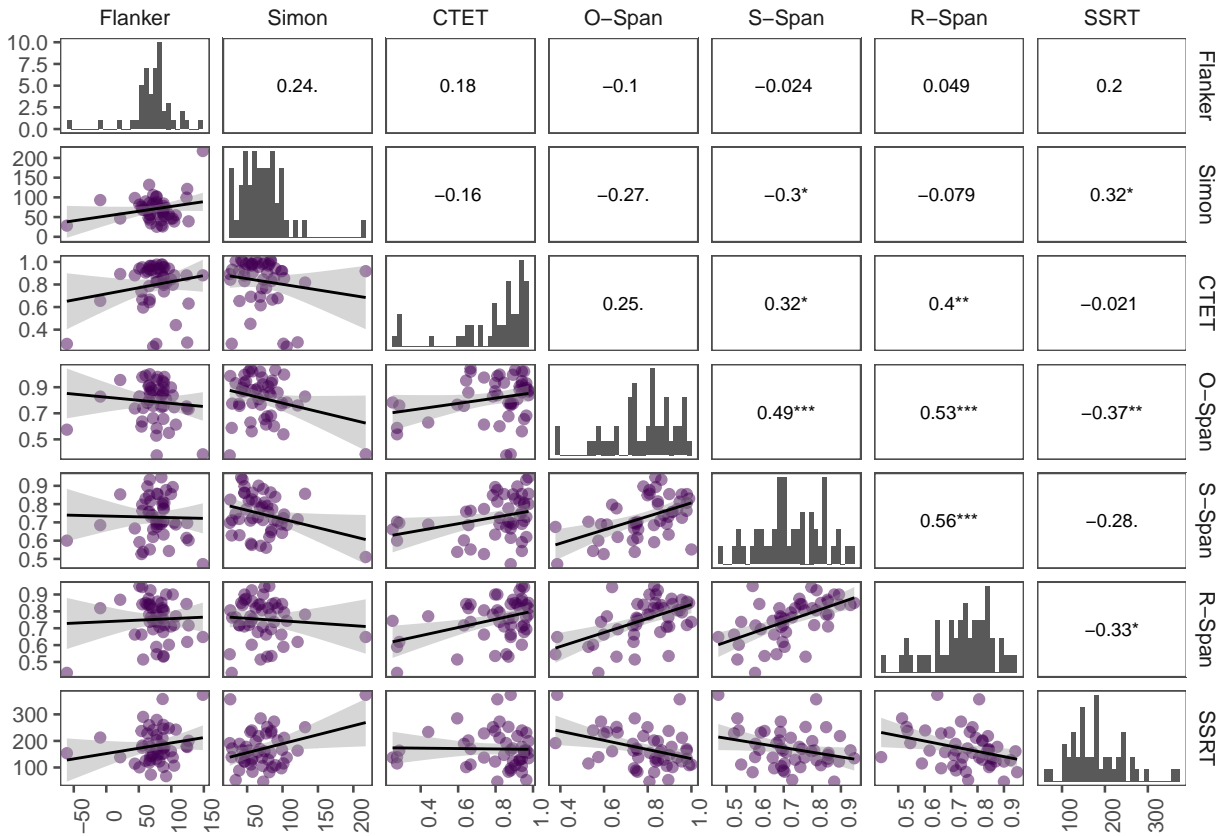


Figure 4. Correlations between all cognitive measures in Experiment 2. Flanker = Flanker RT cost, Simon = Simon RT cost, CTET = continuous time expectancy task, O-Span = operation span task, S-Span, R-Span = rotation span task, SSRT = stop-signal reaction time task. Significance levels: \*\*\* = < .001, \*\* = .01, \* = .05, . = .1



Table 4

*Correlations between cognitive skills and  $\mu$  and  $\tau$  parameters of picture naming response time distributions in the non-speeded condition of Experiment 2.*

|         | $\mu r$ | $\mu p$ | $\tau r$ | $\tau p$ |
|---------|---------|---------|----------|----------|
| Flanker | -0.22   | 0.14    | 0.00     | 1.00     |
| Simon   | 0.01    | 0.93    | 0.21     | 0.16     |
| CTET    | -0.15   | 0.32    | 0.05     | 0.75     |
| O-Span  | 0.13    | 0.36    | -0.24    | 0.10     |
| S-Span  | -0.04   | 0.77    | 0.12     | 0.43     |
| R-Span  | 0.11    | 0.46    | -0.11    | 0.45     |
| SSRT    | 0.02    | 0.89    | 0.17     | 0.24     |

Table 5

*Correlations between cognitive skills and  $\mu$  and  $\tau$  parameters of picture naming response time distributions in the speeded condition of Experiment 2.*

|         | $\mu r$ | $\mu p$ | $\tau r$ | $\tau p$ |
|---------|---------|---------|----------|----------|
| Flanker | -0.03   | 0.82    | -0.16    | 0.28     |
| Simon   | 0.19    | 0.21    | 0.14     | 0.35     |
| CTET    | -0.19   | 0.18    | 0.14     | 0.34     |
| O-Span  | 0.09    | 0.54    | -0.03    | 0.86     |
| S-Span  | 0.01    | 0.96    | 0.10     | 0.49     |
| R-Span  | 0.04    | 0.78    | -0.01    | 0.94     |
| SSRT    | -0.08   | 0.58    | 0.19     | 0.21     |

## References

- Baddeley, A. (1992). Working memory. *Science*, 255(5044), 556–559.
- Baddeley, A. (2010). Working memory. *Current Biology*, 20(4), R136–R140.
- Balota, D. A., & Yap, M. J. (2011). Moving beyond the mean in studies of mental chronometry: The power of response time distributional analyses. *Current Directions in Psychological Science*, 20(3), 160–166.
- Bürki, A. (2017). Electrophysiological characterization of facilitation and interference in the picture-word interference paradigm. *Psychophysiology*, 54(9), 1370–1392.
- Bürki, A., Elbuy, S., Madec, S., & Vasishth, S. (2020). What did we learn from forty years of research on semantic interference? A bayesian meta-analysis. *Journal of Memory and Language*, 114, 104125.
- Bürki, A., & Madec, S. (2022). Picture-word interference in language production studies: Exploring the roles of attention and processing times. *Journal of Experimental Psychology: Learning, Memory, and Cognition*.
- Conway, A. R., Kane, M. J., Bunting, M. F., Hambrick, D. Z., Wilhelm, O., & Engle, R. W. (2005). Working memory span tasks: A methodological review and user’s guide. *Psychonomic Bulletin & Review*, 12(5), 769–786.
- De Jong, R., Coles, M. G., & Logan, G. D. (1995). Strategies and mechanisms in nonselective and selective inhibitory motor control. *Journal of Experimental Psychology: Human Perception and Performance*, 21(3), 498.
- Draheim, C., Harrison, T. L., Embretson, S. E., & Engle, R. W. (2018). What item response theory can tell us about the complex span tasks. *Psychological Assessment*, 30(1), 116.
- Duñabeitia, J. A., Crepaldi, D., Meyer, A. S., New, B., Pliatsikas, C., Smolka, E., & Brysbaert, M. (2018). MultiPic: A standardized set of 750 drawings with norms for six european languages. *Quarterly Journal of Experimental Psychology*, 71(4), 808–816.
- Engle, R. W., Tuholski, S. W., Laughlin, J. E., & Conway, A. R. (1999). Working memory,

short-term memory, and general fluid intelligence: A latent-variable approach. *Journal of Experimental Psychology: General*, 128(3), 309.

Ferreira, V. S., & Pashler, H. (2002). Central bottleneck influences on the processing stages of word production. *Journal of Experimental Psychology: Learning, Memory, and Cognition*, 28(6), 1187.

Foster, J. L., Shipstead, Z., Harrison, T. L., Hicks, K. L., Redick, T. S., & Engle, R. W. (2015). Shortened complex span tasks can reliably measure working memory capacity. *Memory & Cognition*, 43(2), 226–236.

Fuhrmeister, P., & Bürki, A. (2022). Distributional properties of semantic interference in picture naming: Bayesian meta-analyses. *Psychonomic Bulletin & Review*, 29(2), 635–647.

Fuhrmeister, P., Madec, S., Lorenz, A., Elbuy, S., & Bürki, A. (2022). Behavioral and EEG evidence for inter-individual variability in late encoding stages of word production. *Language, Cognition, and Neuroscience*.

Harrison, T. L., Shipstead, Z., Hicks, K. L., Hambrick, D. Z., Redick, T. S., & Engle, R. W. (2013). Working memory training may increase working memory capacity but not fluid intelligence. *Psychological Science*, 24(12), 2409–2419.

Hedge, C., Powell, G., & Sumner, P. (2018). The reliability paradox: Why robust cognitive tasks do not produce reliable individual differences. *Behavior Research Methods*, 50(3), 1166–1186.

Heister, J., Würzner, K.-M., Bubenzer, J., Pohl, E., Hanneforth, T., Geyken, A., & Kliegl, R. (2011). dlexDB—eine lexikalische datenbank für die psychologische und linguistische forschung. *Psychologische Rundschau*, 62(1), 10.

Hommel, B. (1997). Interactions between stimulus-stimulus congruence and stimulus-response compatibility. *Psychological Research*, 59(4), 248–260.

Jongman, S. R. (2017). Sustained attention ability affects simple picture naming. *Collabra: Psychology*, 3(1).

- Jongman, S. R., Meyer, A. S., & Roelofs, A. (2015). The role of sustained attention in the production of conjoined noun phrases: An individual differences study. *PloS One*, *10*(9), e0137557.
- Jongman, S. R., Roelofs, A., & Meyer, A. S. (2015). Sustained attention in language production: An individual differences investigation. *Quarterly Journal of Experimental Psychology*, *68*(4), 710–730.
- Klaus, J., & Schriefers, H. (2018). An investigation of the role of working memory capacity and naming speed in phonological advance planning in language production. *The Mental Lexicon*, *13*(2), 159–185.
- Kornblum, S. (1994). The way irrelevant dimensions are processed depends on what they overlap with: The case of stroop-and simon-like stimuli. *Psychological Research*, *56*(3), 130–135.
- Kubose, T. T., Bock, K., Dell, G. S., Garnsey, S. M., Kramer, A. F., & Mayhugh, J. (2006). The effects of speech production and speech comprehension on simulated driving performance. *Applied Cognitive Psychology: The Official Journal of the Society for Applied Research in Memory and Cognition*, *20*(1), 43–63.
- Laganaro, M., Valente, A., & Perret, C. (2012). Time course of word production in fast and slow speakers: A high density ERP topographic study. *NeuroImage*, *59*(4), 3881–3888.
- Lehrl, S. (1975). *Mehrfachwahl-wortschatztest MWT-b erlangen*. perimed Verlag.
- Logan, G. D., & Cowan, W. B. (1984). On the ability to inhibit thought and action: A theory of an act of control. *Psychological Review*, *91*(3), 295.
- Lorenz, A., Zwitserlood, P., Regel, S., & Abdel Rahman, R. (2019). Age-related effects in compound production: Evidence from a double-object picture naming task. *Quarterly Journal of Experimental Psychology*, *72*(7), 1667–1681.
- Massidda, D., & Massidda, M. D. (2013). *Package “retimes”*.
- Mathôt, S., Schreij, D., & Theeuwes, J. (2012). OpenSesame: An open-source, graphical experiment builder for the social sciences. *Behavior Research Methods*, *44*(2), 314–324.

- Matzke, D., Verbruggen, F., & Logan, G. (2018). The stop-signal paradigm. *Stevens' Handbook of Experimental Psychology and Cognitive Neuroscience*, 5, 383–427.
- O'Connell, R. G., Dockree, P. M., Robertson, I. H., Bellgrove, M. A., Foxe, J. J., & Kelly, S. P. (2009). Uncovering the neural signature of lapsing attention: Electrophysiological signals predict errors up to 20 s before they occur. *Journal of Neuroscience*, 29(26), 8604–8611.
- Paap, K. R., & Sawi, O. (2014). Bilingual advantages in executive functioning: Problems in convergent validity, discriminant validity, and the identification of the theoretical constructs. *Frontiers in Psychology*, 5, 962.
- Piai, V., & Roelofs, A. (2013). Working memory capacity and dual-task interference in picture naming. *Acta Psychologica*, 142(3), 332–342.
- R Core Team. (2021). *R: A language and environment for statistical computing*. Vienna, Austria: R Foundation for Statistical Computing. Retrieved from <https://www.R-project.org/>
- Rey-Mermet, A., & Gade, M. (2018). Inhibition in aging: What is preserved? What declines? A meta-analysis. *Psychonomic Bulletin & Review*, 25(5), 1695–1716.
- Ridderinkhof, K. R., Scheres, A., Oosterlaan, J., & Sergeant, J. A. (2005). Delta plots in the study of individual differences: New tools reveal response inhibition deficits in AD/hd that are eliminated by methylphenidate treatment. *Journal of Abnormal Psychology*, 114(2), 197.
- Ridderinkhof, K. R., Wildenberg, W. P. van den, Wijnen, J., Burle, B., et al. (2004). Response inhibition in conflict tasks is revealed in delta plots. *Cognitive Neuroscience of Attention*, 369, 377.
- Rouder, J. N., & Haaf, J. M. (2019). A psychometrics of individual differences in experimental tasks. *Psychonomic Bulletin & Review*, 26(2), 452–467.
- Sarter, M., Givens, B., & Bruno, J. P. (2001). The cognitive neuroscience of sustained attention: Where top-down meets bottom-up. *Brain Research Reviews*, 35(2), 146–160.

- Scerrati, E., Lugli, L., Nicoletti, R., & Umiltà, C. (2017). Comparing stroop-like and simon effects on perceptual features. *Scientific Reports*, 7(1), 1–11.
- Shalev, L., Ben-Simon, A., Mevorach, C., Cohen, Y., & Tsal, Y. (2011). Conjunctive continuous performance task (CCPT)—a pure measure of sustained attention. *Neuropsychologia*, 49(9), 2584–2591.
- Shao, Z., Meyer, A. S., & Roelofs, A. (2013). Selective and nonselective inhibition of competitors in picture naming. *Memory & Cognition*, 41(8), 1200–1211.
- Shao, Z., Roelofs, A., Acheson, D. J., & Meyer, A. S. (2014). Electrophysiological evidence that inhibition supports lexical selection in picture naming. *Brain Research*, 1586, 130–142.
- Shao, Z., Roelofs, A., Martin, R. C., & Meyer, A. S. (2015). Selective inhibition and naming performance in semantic blocking, picture-word interference, and color-word stroop tasks. *Journal of Experimental Psychology: Learning, Memory, and Cognition*, 41(6), 1806.
- Shao, Z., Roelofs, A., & Meyer, A. S. (2012). Sources of individual differences in the speed of naming objects and actions: The contribution of executive control. *Quarterly Journal of Experimental Psychology*, 65(10), 1927–1944.
- Shipstead, Z., Redick, T. S., & Engle, R. W. (2012). Is working memory training effective? *Psychological Bulletin*, 138(4), 628.
- Sikora, K., Roelofs, A., Hermans, D., & Knoors, H. (2016). Executive control in spoken noun-phrase production: Contributions of updating, inhibiting, and shifting. *Quarterly Journal of Experimental Psychology*, 69(9), 1719–1740.
- Strayer, D. L., & Johnston, W. A. (2001). Driven to distraction: Dual-task studies of simulated driving and conversing on a cellular telephone. *Psychological Science*, 12(6), 462–466.
- Tse, C.-S., Balota, D. A., Yap, M. J., Duchek, J. M., & McCabe, D. P. (2010). Effects of healthy aging and early stage dementia of the alzheimer’s type on components of

621 response time distributions in three attention tasks. *Neuropsychology*, 24(3), 300.

622 Unsworth, N., Heitz, R. P., Schrock, J. C., & Engle, R. W. (2005). An automated version  
623 of the operation span task. *Behavior Research Methods*, 37(3), 498–505.

624 Unsworth, N., Redick, T. S., Heitz, R. P., Broadway, J. M., & Engle, R. W. (2009).

625 Complex working memory span tasks and higher-order cognition: A latent-variable  
626 analysis of the relationship between processing and storage. *Memory*, 17(6), 635–654.

627 Valente, A., Bürki, A., & Laganaro, M. (2014). ERP correlates of word production  
628 predictors in picture naming: A trial by trial multiple regression analysis from stimulus  
629 onset to response. *Frontiers in Neuroscience*, 8, 390.

630 Wechsler, D. (1987). Wechsler memory scale-revised. *Psychological Corporation*.

631 Wechsler, D. (2008). Wechsler adult intelligence scale–fourth edition (WAIS–IV). *San*  
632 *Antonio, TX: NCS Pearson*, 22(498), 1.

633 Wöstmann, N. M., Aichert, D. S., Costa, A., Rubia, K., Möller, H.-J., & Ettinger, U.

634 (2013). Reliability and plasticity of response inhibition and interference control. *Brain*  
635 *and Cognition*, 81(1), 82–94.