Predict Valence Ratings of Words

3

Abstract

- 4 Typing is a ubiquitous daily action for many individuals; yet, research on how these actions
- b have changed our perception of language is limited. One such influence, deemed the
- 6 QWERTY effect, is an increase in valence ratings for words typed more with the right hand
- on a traditional keyboard [@Jasmin2012]. Although this finding is intuitively appealing
- s given both right handed dominance and the smaller number of letters typed with the right
- 9 hand, extension and replication of the right side advantage is warranted. The present paper
- reexamined the QWERTY effect within the embodied cognition framework [@Barsalou1999]
- and found that the right side advantage is replicable to new valence stimuli, along with
- findings supporting embodied cognition. Further, when examining expertise, right side
- advantage interacted with typing speed and typeability (i.e., alternating hand key presses or
- 14 finger switches) portraying that both skill and our procedural actions play a role in judgment
- of valence on words.

Keywords: expertise, embodied cognition, valence, QWERTY

An Extension of the QWERTY Effect: Not Just the Right Hand, Expertise and Typeability
Predict Valence Ratings of Words

From its creation in 1868, to its appearance in our homes today, the QWERTY 19 keyboard has held the interest of psychologists. The process of typing on a keyboard requires 20 many procedures to function in tandem, which creates a wealth of actions to research [15]. 21 Rumelhart and Norman [29]'s computer model of skilled typing is still highly influential. 22 They hypothesize that typing results from the activation of three levels of cognition: the word level, the key press level, and the response level. They believe that after word perception, the word level is activated, causing the key press level to initiate a schema of the letters involved in typing the word. This schema includes the optimal position on the keyboard for that specific hand-finger combination to move to at the appropriate time for individual keystrokes. Concurrently, the response system sends feedback information to initiate a key press motion when the finger is in the appropriate space. Their theory proposes that schemata and motion activations occur simultaneously, constantly pulling or pushing the hands and fingers in the right direction. 31

While many studies have focused on errors in typing to investigate response system

feedback [18], Logan [19] argued for parallel activation of key presses. He examined the

Simon effect to show more than one letter is activated at the same time, and consequently,

the second key press motion is begun before the first key press is done. The Simon effect

occurs when congruent stimuli create faster responses than incongruent stimuli, much like

the Stroop task [31, 32]. For example, if we are asked to type the letter f (a left handed

letter), we type it faster if the f is presented on the left side of the screen. Similarly, Rieger

[28] reported finger-congruency effects by altering a Stroop task: participants were required

to respond to centrally presented letters based on color-key combinations. When the letter

and color were congruent (i.e., a right-handed letter was presented in the designated color for

a right response), the skilled typists' responses were faster than incongruent combinations.

- Further, this effect was present when participants responded to items with their hands
 crossed on the responding device, suggesting the effect was expertise-based rather than
 experiment-response based. These results imply that automatic actions stimulate motor and
 imagery representations concurrently and may be linked together in the brain [14, 20, 28].
- This dual activation of motor and imagined items is the basis for embodied cognition, a rapidly expanding field in psychology [1, 30].

49 Embodied Cognition

While the mind was traditionally considered an abstract symbol processor [22], newer 50 cognitive psychology theories focus on the interaction between the brain's sensorimotor 51 systems and mental representations of events and objects [1, 39]. The interplay between 52 these systems has been found in both neurological [11, 21, 35] and behavioral research [5, 13, 53 41]. Motor representations of tasks are activated even when not specifically asked to perform the task, and if the action is well-learned, the task is perceived as pleasant [3, 26, 38]. For example, Beilock and Holt [3] asked novice and expert typists to pick which one of two letter dyads they preferred, which were either different hand combinations (CJ) or same finger 57 combinations (FV). They found that novices have no preference in selection, while expert typists more reliably picked the combinations that were easier to type. To show that this effect was due to covert motor representation activation, and thus, expanding on findings from van den Bergh, Vrana, and Eelen [37], participants also made preference selections while repeating a key press combination. When expert motor planning was distracted by remembering the pattern presented, no preference for letter dyads was found, indicating that the simultaneous activation of the motor representation was necessary to influence their likability ratings. Similar embodied findings have also been portrayed with emotionally charged sentences and facial movements [12], positive-negative actions, such as head nodding or arm movements [10, 26], and perceptuomotor fluency [24, 38].

68 Body Specificity Hypothesis

Using an embodied framework, Casasanto [7] has proposed that handedness dictates 69 preference because our representations of actions are grounded in our physical interactions 70 with the environment. In several studies, he portrayed that handedness influenced preference 71 for spatial presentation (i.e., left handed individuals associate "good" with left, while right handed individuals associate "good" with right), which in turn influenced judgments of 73 happiness and intelligence and our decision making in hiring job candidates and shopping. In all these studies, participants reliably selected the hand-dominant side more often, which does not match cultural or neurolinguistic representations of positive-is-right and negative-is-left [8]. These findings imply that our handedness is a motor expertise that causes ease of action on the dominant side to positively influence our perceptions of items presented on that side. Further, Casasanto [6] compiled a review of body specific actions and 79 their representation in the brain using fMRIs. Handedness interacted with imagining actions, reading action, and perceiving the meanings of action verbs, such that fMRI patterns were 81 mirrored for left and right handed participants matching their dominant side.

83 The QWERTY Effect

These effects lead Jasmin and Casasanto [16] to propose the idea that typing, an action that often replaces speaking, has the ability to create semantic changes in how we perceive words. The asymmetrical arrangement of letters on the QWERTY keyboard increases fluency of typing letters on the right side because there are fewer keys, and thus, less competition for fingers. That arrangement should then cause us to perceive the letters on the right side as more positive and letters on the left side as more negative. Consequently, words that are composed of more letters from the right side (the right side advantage; RSA) should be rated as more positive than those with more letters on the left. They found this preference for RSA over three languages (English, Spanish, and Dutch), and the effect was even stronger on

words created after the invention of the QWERTY keyboard (i.e., *lol*), as well as evident in pseudowords such as *plook*. However, in contrast to the body specificity hypothesis, left and right handed participants showed the same trend in effects for positive-is-right words.

Current Study

The current study examined the right side advantage's interaction with traditional embodied cognition definitions (expertise, fluency). We analyzed the different implications of the body specificity hypothesis and a more general embodied hypothesis by testing the following:

- 1) Expertise was measured through participant typing speed, and fluency or typeability was measured through finger and hand switches that would occur if the word was typed on a QWERTY keyboard (akin to Beilock and Holt [3]'s different hand preferences). Given that typing involves the procedural action system, we would expect to find that increased hand and finger switches are positively related to ratings of valence because words that are typed on alternating fingers and hands are easier to type; thus, supporting embodied cognition theories. It was unclear if expertise would directly influence overall ratings, as we expected an interaction of the variables (described below). The RSA may still be present when accounting for these variables, as humans are primarily a right side dominant species, and this result would support the body specificity hypothesis.
- 2) The interaction between RSA, hand and fingers switches, and expertise was examined to determine if embodied cognition and body specificity hypotheses can be combined. This analysis allowed us to explore the nuance of skill and typeability on valence ratings and to determine the effects of the RSA at different levels these variables.

116 Method

117 Participants

Participants (N = 606) were recruited from the undergraduate human subject pool at a large Midwest university and received course credit for their time. 72433 rows of data were present for these participants, where 564 participants had complete data (i.e., 120 rows, see below), 39 were missing one data point, and 3 were missing many data points. All possible data points were considered and missing data points were usually computer error (i.e., freezing during the experiment) or participant error (i.e., missed key press).

Rating data were screened for multivariate outliers, and two participant's ratings were found to have extreme Mahalanobis distance scores [34] but were kept in the data set. 11.2 percent of the sample was left-handed, 0.2 percent marked ambidextrous, and 0.3 percent was missing handedness information. The average typing speed was 47.89 words per minute (SD = 13.31), and the average percent accuracy rate for the typing test was 92.69 (SD = 8.36).

9 Materials

The English ANEW [4] norms were used to create the stimuli for this study, in an 130 effort to replicate Jasmin and Casasanto [16] experiments, and 2743 words were selected for 131 this experiment. Pseudowords were selected from Appendix E of the supplementary 132 materials presented from the QWERTY publication. These words were coded as described 133 below for RSA, finger and hand switches, word length, and letter frequency. Average word 134 length was 4.75 (SD = 1.47; range = 3 - 13). All materials, data, and the Rmarkdown 135 document that created this manuscript are available at our Open Science Foundation (OSF) 136 page: https://osf.io/zs2qj/. 137

38 Coding

Each of the words used in this study were coded for control and experimental variables. 139 Control variables included word length and average letter frequency. Average letter frequency 140 was created by averaging the English letter frequency [17] for each letter in a word. Words 141 with high average letter frequencies contain more commonly used letters (e, t, a, o); while words with lower frequencies use more of the less common letters (z, q, x, j). Experimental 143 variables included RSA, number of hand switches, and number of finger switches. Typing manuals were consulted, and letters were coded as left (q, w, e, r, t, a, s, d, f, g, z, x, c, v, b)or right-handed letters (y, u, i, o, p, h, j, k, l, n, m). Left handed letters were coded with -1 146 and right handed letters with +1, which created summed scores indicating the overall right side advantage for a word. Words were coded for the number of hand switches within a word 148 using the left-right coding system described above. Finally, the number of finger switches 149 were coded using traditional typing manuals for each finger. Finger switches was highly 150 correlated with word length, r = .89, and therefore, word length was excluded as a control 151 variable due to focus on typing skill in our hypotheses. 152

153 Procedure

Upon consent to participate in the experiment, participants were given a typing test by 154 using a free typing test website [36]. Each participant typed Aesop's Fables for one minute 155 before the website would reveal their typing speed and accuracy rate, which was recorded by 156 the experimenter. After this test, participants indicated their dominant writing hand. Participants were then given 120 of the possible stimuli to rate for pleasantness (60 real words, 60 pseudowords). This smaller number of stimuli was used to control 159 fatigue/boredom on participants. These stimuli were counterbalanced across participants, 160 and the order of the stimuli was randomized. Participants were told to rate each word for 161 how pleasant it seemed using a 9 point Likert type scale (1 - very unpleasant, 4 - neutral, 9 -162

very pleasant). The same self-assessment manikin from Jasmin and Casasanto [16] was
shown to participants at the top of the computer screen to indicate the points on the Likert
scale. The words appeared in the middle of the screen in 18 point Arial font. Participants
then typed the number of their rating on the computer keyboard. Once they rated all
stimuli, participants were debriefed and allowed to leave.

168 Results

169 Data Analytic Plan

Because each participant constituted multiple data points within the dataset, a 170 multilevel model was used to control for correlated error [9]. Pinheiro et al. [27]'s nlme 171 package in R was used to calculate these analyses. A maximum likelihood multilevel model 172 was used to examine hypotheses of interactions between typing speed, hand/finger switching, 173 and RSA while adjusting for letter frequency when predicting item pleasantness ratings. 174 Pseudowords and real words were examined separately in two multilevel model analyses. 175 Participants were included as a random intercept factor, as comparison to a non-random 176 intercept was significant (see Table 1). Typing speed, finger/hand switches, and RSA were 177 mean centered before analyses to control for multicollinearity. 178

179 Main Effects

After setting participants as a random intercept factor, letter frequency was used as an adjustor variable. As seen in Table 1, this variable was not a significant predictor for pseudowords, b = -0.006, but was a significant predictor for real words, b = 0.056. All predictor statistics are provided in an Excel sheet on the OSF page for each step of the model. Next, the main effects of typing speed, hand switches, finger switches, and RSA were added to the models for pseudowords and real words. In both models, the addition of these

variables overall was significant, p < .001. For pseudowords, typing speed was not a 186 significant predictor of valence ratings, b = 0.003, t(601) = 0.97, p = .332. Similarly, typing 187 speed was not a significant predictor for valence ratings on real words, b = 0.000, t(604) =188 0.04, p = .971. In contrast, the measures of typeability in hand and finger switching were 189 significant for both pseudowords and real words. For pseudowords, increased hand switching, 190 b = -0.026, t(35535) = -2.84, p = .004, and increased finger switching, b = -0.074, t(35535)191 = -5.85, p < .001, decreased the overall valence ratings. However increased hand switching, b 192 = 0.061, t(35681) = 4.71, p < .001, increased valence ratings for real words, while increased 193 finger switching, b = -0.091, t(35681) = -7.82, p < .001, decreased the overall valence ratings. 194 Even adjusting for these typing style variables, the RSA effect replicated for both 195 pseudowords, b = 0.050, t(35535) = 11.50, p < .001, and real words, b = 0.051, t(35681) = 0.051196 8.35, p < .001. In the next section, we explored the interactions of typeability and RSA, to present a more nuanced view of typing's effect on valence ratings.

199 Interactions

Next, the four-way interaction of typing speed, finger switching, hand switching, and 200 RSA was entered into the equation, including all the smaller two- and three-way interactions. 201 We focused on the most complex interaction found, breaking down interaction terms into 202 simple slopes of low (-1SD), average, and high (+1SD) to explore each effect. For example, if 203 the four-way interaction was significant, one variable would be broken into simple slopes, and 204 the next most complex interactions would be examined. This procedure was iterated until the interactions were no longer significant or only main effects were examined. When multiple interactions were present, we choose a common variable to help break down the 207 interactions with the least number of steps. Table 1 portrays that the addition of the 208 interaction components was significant for both pseudoword, p = .003, and real word, p < .003209 .001, models. 210

Pseudoword Simple Slopes. For pseudowords, finger switches by RSA, b = 0.014, 211 t(35524) = 2.66, p < .001, and typing speed by RSA, b = -0.001, <math>t(35524) = -2.00, p = .045212 were the only significant interactions. Low and high simple slopes for RSA were created to 213 examine the effects of typing speed and finger switches at these levels, and these interactions 214 are displayed in Figure 1. For low RSA (words with more left handed letters), speed 215 positively predicted valence, b = 0.005, t(601) = 1.68, p = .094, and finger switching 216 negatively predicted valence, b = -0.095, t(35524) = -5.68, p < .001. For average RSA, speed 217 no longer predicted valence, b = 0.003, t(601) = 1.07, p = .285, while finger switches still 218 negatively predicted valence, albeit to a lesser extent than at low RSA, b = -0.062, t(35524)219 = -4.76, p < .001. Last, at high RSA (more right handed words), speed did not predict 220 valence, b = 0.001, t(601) = 0.32, p = .751, and neither did finger switches, b = -0.029, 221 t(35524) = -1.51, p = .130. In sum, this interaction indicated that expertise may be seen as positively influencing ratings for more left handed words, but was not a predictor of words 223 that were typed more with the right hand. When words were more left handed, there was a 224 negative influence of finger switching, but as we transition to more right handed words the 225 number of switches did not influence valence ratings. These results seemed to indicate that 226 expertise and typeability were influential factors for left handed words, but the RSA washed 227 out these effects when rating right handed pseudowords. 228

Real Word Simple Slopes. For real words, the three-way interactions of finger 229 switch by hand switch by RSA, b = -0.009, t(35670) = -5.00, p < .001, and speed by finger 230 switch by hand switch, b = -0.001, t(35670) = -2.62, p = .009, were the largest significant 231 interaction predictors. Low and high simple slopes for finger switches were created to explore the three-way interaction. For lower finger switches, the hand switching by RSA interaction 233 was significant, b = 0.014, t(35670) = 1.70, p = .090; however, the hand switches by speed 234 interaction was not significant, b = 0.000, t(35670) = 0.29, p = .772. At average finger 235 switching, the hand switches by RSA interaction was not significant, b = -0.002, t(35670) =236 -0.38, p = .705, and neither was the hand switches by speed interaction, b = -0.001, t(35670)237

238 = -1.21, p = .228. At a higher number of finger switches the hand switches by RSA 239 interaction was significant, b = -0.018, t(35670) = -3.36, p = .001, along with the hand 240 switches by speed interaction, b = -0.001, t(35670) = -2.62, p = .009.

For significant two-way effects of hand switch by RSA and hand switch by speed, we 241 then calculated the low and high simple slopes for hand switches, see Figure 2. Therefore, we explored the low and high finger switch effects that were significant with low and high hand 243 switches for RSA and speed main effects. At low finger switches and low hand switches, RSA 244 was a significant predictor of valence, b = 0.035, t(35670) = 3.91, p = .000. Speed was not examined because the two-way interaction was not significant. At low finger switches and average hand switches, RSA was a stronger predictor of valence, b = 0.055, t(35670) = 3.86, p < .001. Last, at low finger switches and high hand switches, RSA increased in strength, b 248 = 0.074, t(35670) = 3.07, p < .001. Therefore, at low numbers of finger switches, as hand 249 switching increased, the strength of the RSA positivity effect also increased. This result 250 implied that as words required switching hands, words with more right handed letters during 251 these switches were more likely to be rated positively in valence. 252

At a high number of finger switches, we found both speed and RSA interactions with 253 hand switching, see Figure 2 top right and bottom left panels. When there were low numbers 254 of hand switches for these words, RSA was a positive significant predictor, b = 0.101, 255 t(35670) = 7.96, p < .001, along with speed, b = 0.010, t(604) = 2.49, p = .013. As hand256 switches increase, the effects of RSA and speed decrease. For high finger switches and 257 average hand switches, RSA was significant, b = 0.074, t(35670) = 8.75, p < .001, while speed was not b = 0.006, t(604) = 1.98, p = .048. With high finger and hand switches, RSA was significant but smaller than low and average, b = 0.048, t(35670) = 4.71, p < .001, and 260 speed was not a significant predictor, b = 0.002, t(604) = 0.72, p = .473. Therefore, at an 261 elevated number of finger switches, and a low number of hand switches, we found that RSA 262 and speed were positive predictors of valence ratings. As hand switching and finger switching 263

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increased, the effects of expertise and RSA decreased. This result implied that the
coordination of controlling for finger and hand switching decreased the positive valence
effects of both RSA and expertise. All interaction statistics are included online in an Excel
sheet on our OSF page.

268 Discussion

These results replicated and extended the QWERTY effect to portray an interactive 269 view of expertise, typeability, and RSA that lead to stronger valence ratings for words. The 270 QWERTY keyboard layout has influenced our perceptions of positivity, as hypothesized by 271 the body specificity hypothesis, but the complexity of typing and action has additionally 272 lead to changing valence ratings for words. This influence was examined in our study by 273 incorporating the work of Beilock and Holt [3], wherein we measured typing speed as a 274 measure of expertise, as well as embodied fluency or action through coding the way words 275 would be typed with finger and hand switches. For pseudowords, we replicated the RSA 276 effect, and additionally, showed that finger and hand switches predicted valence ratings. 277 However, both switch variables were negative predictors, indicating that we dislike words 278 that switch hands and fingers when adjusting for RSA, speed, and letter frequency. One 279 interpretation of this finding may be that pseudowords are, by definition, not traditionally typed, which may have lead participants to rate words that required hand coordination, 281 along with concentration on the physical letters, as less positive. If we imagine typing a captcha (i.e., a set of letters and/or numbers designed to eliminate spam responses), we may 283 find that we would "peck" at the keyboard to hit the correct letter combination. Therefore, 284 words that would require us to use more hands and fingers may be less desirable. 285

For real words, the RSA effect was replicated, and both switch variables predicted valence ratings. In contrast to the pseudowords, we found that hand switching was a positive predictor of valence, while finger switching was a negative predictor of valence. Hand

switching coordination would be easier to manage than finger switches, especially as we 289 consider the flexibility and movement range of the non-index fingers. Therefore, it appeared 290 that we found words on different hands as more positive, replicating Beilock and Holt [3], 291 but when forced to coordinate switching finger movements, we liked these words less. Many 292 of the most frequent letters on the QWERTY keyboard are on the left side, which may 293 frustrate a typist because of the need to coordinate finger press schemata that involve same 294 finger muscle movements [29]. Consequently, the number of switches becomes increasingly 295 important to help decrease interference from the need to continue to use the same hand. The 296 ease of action by switching back and forth is then translated as positive feelings for those 297 fluent actions [24]. The complexity of this coordination's effect on valence was found in the 298 multiway interactions unearthed in this study. Globally, typing speed was not a significant 299 predictor for pseudo or real words. Viewing expertise through an embodied framework, it was unclear if speed would directly affect valence, as speed was more likely to affect our interpretations of typing, rather than positivity. Therefore, we examined the interaction of typeability and speed to explore how expertise might influence valence through ways that 303 words are typed. 304

Pseudowords showed an interaction of typing speed by RSA and finger switching by 305 RSA when predicting valence. In this interaction, we focused on RSA as the common 306 variable between these interactions. When RSA was low, and thus, the words contained 307 more left-handed letters, we find that speed positively influenced valence, while finger 308 switches negatively predicted valence. For words typed completely on the right hand (high 309 RSA), neither variable influence valence. Therefore, it appears when we are required to use the left hand, and thus, lessened the influence of RSA, typeability and expertise play a role 311 in the valence ratings of words. Both Beilock and Holt [3] and van den Bergh, Vrana, and Eelen [37] showed expert preferences for two and three letter combinations that were typed 313 with different fingers. Our results could imply that our embodied actions influence 314 preferences for procedures that are more likely in our environment. While our pseudowords 315

were legal English phoneme combinations, they are extremely unlikely to have been
previously practiced or encountered in our daily tasks. Therefore, switching preference will
not extend to pseudowords (unpracticed actions) because they are not fluent [24].

Further, three-way interactions of finger switches by hand switches by RSA and finger 319 switches by hand switches by speed were found for real word valence ratings. Finger switches 320 were first separated in low, average, and high numbers of switches to see where the two-way 321 interactions were present. At low finger switches (less than two finger switches), only the 322 hand switches by RSA interaction was present. This interaction indicated that increasing hand switches also lead to increasing effects of RSA on valence. Therefore, when finger switching competition was low, increased hand switching also lead to increased RSA effects. This effect indicates that right handed words are still preferred, but additionally, we find words that are typed with opposite hands as more positive. At average finger switching, we 327 found no two-way effects. However, at higher finger switching, we find both a speed and 328 RSA interaction with hand switching. For RSA, increasing levels of hand switching lead to 329 lessening the impact of RSA. Therefore, when finger and hand switching needed to both be 330 coordinated, RSA's impact on valence decreased but was still significant. For speed, we 331 found that increasing levels of hand switching also lead to lessened effects of expertise. This 332 result runs counter to the idea that increased levels of hand and finger switching would 333 require the most coordination, and thus, experts should be better at this task. This result 334 instead implies that the effect of focusing on that coordination may dampen the effects of 335 expertise on valence ratings. 336

These embodied results mirror a clever set of studies by Holt and Beilock [13] wherein
they showed participants sentences that matched or did not match a set of pictures (i.e., the
umbrella is in the air paired with a picture of an open umbrella). Given dual-coding theory
[25], it was not surprising that participants were faster to indicate picture-sentence matches
than non-matches [also see 33, 40]. Further, they showed these results extended to an

expertise match; hockey and football players were much faster for sentence-picture
combinations that matched within their sport than non-matches, while novices showed no
difference in speed for matches or non-matches on sports questions. Even more compelling
are results that these effects extend to fans of a sport and are consistent neurologically [i.e.,
motor cortex activation in experts; 2]. These studies clearly reinforce the idea that expertise
and fluency unconsciously affect our choices, even when it comes to perceived pleasantness of
words.

This extension of the QWERTY effect illuminates the need to examine how skill and 349 action can influence cognitive processes. Additionally, typing style, while not recorded 350 directly in this experiment, could potentially illuminate differences in ratings across 351 left-handed and right-handed words. Hunt-and-peck typists are often slower than the strict 352 typing manual typists, which may eliminate or change the effects of RSA and switches since 353 typists may not follow left or right hand rules and just switch hands back and forth 354 regardless of key position. The middle of a QWERTY layout also poses interesting problems, 355 as many typists admit to "cheating" the middle letters, such as t, and y or not even knowing 356 which finger should actually type the b key. Further work could also investigate these effects 357 on other keyboard layouts, such as Dvorak, which was designed to predominately type by 358 alternating hands to increase speed and efficiency [23]. 359

References

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References References

- Lawrence W. Barsalou. "Perceptual symbol systems". In: Behavioral and Brain
 Sciences 22.4 (Aug. 1999), pp. 577–660. ISSN: 0140-525X. DOI:
 10.1017/S0140525X99002149.
- In: Proceedings of the National Academy of Sciences of the United States of America 105.36 (2008), pp. 13269–13273. ISSN: 1091-6490 (Electronic) 0027-8424 (Linking). DOI: 10.1073/pnas.0803424105. URL:

 http://www.ncbi.nlm.nih.gov/pubmed/18765806.
- [3] Sian L. Beilock and Lauren E. Holt. "Embodied preference judgments". In:

 **Psychological Science 18.1 (Jan. 2007), pp. 51–57. ISSN: 0956-7976. DOI:

 10.1111/j.1467-9280.2007.01848.x.
- Margaret M Bradley and Peter J Lang. Affective Norms for English Words (ANEW):

 Instruction manual and affective ratings. Tech. rep. C-1. The Center for Research in

 Psychophysiology, University of Florida, 1999.
- [5] E. Cartmill, S. Goldin-Meadow, and Sian L. Beilock. "A word in the hand: Human gesture links representations to actions". In: *Philosophical Transactions of the Royal Society B: Biological Sciences* 367 (2012), pp. 129–143.
- Daniel Casasanto. "Different bodies, different minds". In: Current Directions in

 Psychological Science 20.6 (Dec. 2011), pp. 378–383. ISSN: 0963-7214. DOI:

 10.1177/0963721411422058.
- Daniel Casasanto. "Embodiment of abstract concepts: Good and bad in right- and left-handers." In: Journal of Experimental Psychology: General 138.3 (2009), pp. 351–367. ISSN: 1939-2222. DOI: 10.1037/a0015854.

- Richard J. Davidson. "Anterior cerebral asymmetry and the nature of emotion". In:

 Brain and Cognition 20.1 (Sept. 1992), pp. 125–151. ISSN: 02782626. DOI:

 10.1016/0278-2626(92)90065-T.
- ³⁸⁹ [9] A. Gelman. "Multilevel (hierarchical) modeling: What it can and cannot do." In:

 Technometrics 48.3 (2006), pp. 432–435. DOI: 10.1198/004017005000000661.
- [10] Arthur M. Glenberg et al. "Gender, emotion, and the embodiment of language
 comprehension". In: *Emotion Review* 1.2 (Apr. 2009), pp. 151–161. ISSN: 1754-0739.
 DOI: 10.1177/1754073908100440.
- Olaf Hauk, Ingrid Johnsrude, and Friedemann Pulvermüller. "Somatotopic representation of action words in human motor and premotor cortex". In: Neuron 41.2 (Jan. 2004), pp. 301–307. ISSN: 08966273. DOI: 10.1016/S0896-6273(03)00838-9.
- David A. Havas, Arthur M. Glenberg, and Mike Rinck. "Emotion simulation during language comprehension". In: *Psychonomic Bulletin & Review* 14.3 (June 2007), pp. 436–441. ISSN: 1069-9384. DOI: 10.3758/BF03194085.
- Lauren E. Holt and Sian L. Beilock. "Expertise and its embodiment: Examining the impact of sensorimotor skill expertise on the representation of action-related text". In:

 Psychonomic Bulletin & Review 13.4 (Aug. 2006), pp. 694–701. ISSN: 1069-9384. DOI:

 10.3758/BF03193983.
- Bernhard Hommel et al. "The Theory of Event Coding (TEC): A framework for perception and action planning". In: Behavioral and Brain Sciences 24.05 (Oct. 2001), pp. 849–878. ISSN: 0140-525X. DOI: 10.1017/S0140525X01000103.
- Albrecht W. Inhoff and Andrew M. Gordon. "Eye movements and eye-hand coordination during typing". In: Current Directions in Psychological Science 6.6 (Dec. 1997), pp. 153–157. ISSN: 0963-7214. DOI: 10.1111/1467-8721.ep10772929.

- [16] Kyle Jasmin and Daniel Casasanto. "The QWERTY Effect: How typing shapes the
 meanings of words." In: Psychonomic Bulletin & Review 19.3 (June 2012),
 pp. 499–504. ISSN: 1069-9384. DOI: 10.3758/s13423-012-0229-7.
- Robert Lewand. Cryptological mathematics. The Mathematical Association of America, 2000.
- [18] Frank A. Logan. "Errors in copy typewriting". In: Journal of Experimental Psychology:
 Human Perception and Performance 25.6 (1999), pp. 1760–1773. ISSN: 0096-1523. DOI:
 10.1037//0096-1523.25.6.1760.
- in typewriting". In: Journal of Experimental Psychology: Human Perception and
 Performance 29.4 (2003), pp. 741–757. ISSN: 1939-1277. DOI:
 10.1037/0096-1523.29.4.741.
- Gordon D. Logan and N. Jane Zbrodoff. "Stroop-type interference: Congruity effects in color naming with typewritten responses." In: *Journal of Experimental Psychology:*Human Perception and Performance 24.3 (1998), pp. 978–992. ISSN: 1939-1277. DOI:

 10.1037/0096-1523.24.3.978.
- Ian M. Lyons et al. "The role of personal experience in the neural processing of action-related language". In: Brain and Language 112.3 (Mar. 2010), pp. 214–222. ISSN: 0093934X. DOI: 10.1016/j.bandl.2009.05.006.
- 429 [22] Allen Newell and Herbert A. Simon. "Computer science as empirical inquiry: symbols
 430 and search". In: Communications of the ACM 19.3 (Mar. 1976), pp. 113–126. ISSN:
 431 00010782. DOI: 10.1145/360018.360022.
- 432 [23] Jan Noyes. The QWERTY keyboard: a review. Mar. 1983. DOI: 433 10.1016/S0020-7373(83)80010-8. URL:
- http://www.sciencedirect.com/science/article/pii/S0020737383800108.

- [24] Daniel M. Oppenheimer. "The secret life of fluency". In: Trends in Cognitive Sciences
 12.6 (June 2008), pp. 237–241. ISSN: 13646613. DOI: 10.1016/j.tics.2008.02.014.
- ⁴³⁷ [25] Allan Paivio. "Dual coding theory: Retrospect and current status". In: *Canadian*⁴³⁸ *Journal of Psychology* 45 (1991), pp. 255–287.
- [26] Raedy M. Ping, Sonica Dhillon, and Sian L. Beilock. "Reach for what you like: The
 body's role in shaping preferences". In: *Emotion Review* 1.2 (Apr. 2009), pp. 140–150.
 ISSN: 1754-0739. DOI: 10.1177/1754073908100439.
- J Pinheiro et al. nlme: Linear and nonlinear mixed effects models. 2017. URL: https://cran.r-project.org/package=nlme.
- Martina Rieger. "Automatic keypress activation in skilled typing". In: Journal of
 Experimental Psychology: Human Perception and Performance 30.3 (2004),

 pp. 555–565. ISSN: 0096-1523. DOI: 10.1037/0096-1523.30.3.555.
- D Rumelhart and D Norman. "Simulating a skilled typist: a study of skilled cognitive-motor performance". In: Cognitive Science 6.1 (Mar. 1982), pp. 1–36. ISSN: 03640213. DOI: 10.1016/S0364-0213(82)80004-9.
- [30] Timothy A. Salthouse. "Perceptual, cognitive, and motoric aspects of transcription
 typing". In: Psychological Bulletin 99.3 (1986), pp. 303–319. ISSN: 1939-1455. DOI:
 10.1037/0033-2909.99.3.303.
- J. Richard Simon. "The effects of an irrelevant directional cue on human information processing". In: Stimulus-response compatibility: An integrated perspective. Ed. by

 R.W. Proctor and T.G. Reeve. Amsterdam, 1990, pp. 31–86.
- J. Richard Simon and A. M. Small. "Processing auditory information: Interference from an irrelevant cue". In: *Journal of Applied Psychology* 53.5 (1969), pp. 433–435.

 ISSN: 0021-9010. DOI: 10.1037/h0028034.

- Robert A Stanfield and Rolf A Zwaan. "The effect of implied orientation derived from verbal context on picture recognition". In: *Psychological Science* 12.2 (2001), pp. 153–6.

 ISSN: 0956-7976. DOI: 10.1111/1467-9280.00326. URL:
- http://www.ncbi.nlm.nih.gov/pubmed/11340925.
- B. G. Tabachnick and L. S. Fidell. *Using multivariate statistics*. 6th. Boston, MA:
 Pearson, 2012. ISBN: 978-0205849574.
- Marco Tettamanti et al. "Listening to action-related sentences activates fronto-parietal motor circuits". In: *Journal of Cognitive Neuroscience* 17.2 (Feb. 2005), pp. 273–281.

 ISSN: 0898-929X. DOI: 10.1162/0898929053124965.
- ⁴⁶⁸ [36] TypingMaster. TypingTest.com Complete a Typing Test in 60 Seconds! 2013.
- Omer van den Bergh, Scott Vrana, and Paul Eelen. "Letters from the heart: Affective categorization of letter combinations in typists and nontypists." In: Journal of

 Experimental Psychology: Learning, Memory, and Cognition 16.6 (1990),

 pp. 1153–1161. ISSN: 1939-1285. DOI: 10.1037/0278-7393.16.6.1153.
- Shu-Ju Yang, David A. Gallo, and Sian L. Beilock. "Embodied memory judgments: A case of motor fluency." In: Journal of Experimental Psychology: Learning, Memory, and Cognition 35.5 (2009), pp. 1359–1365. ISSN: 1939-1285. DOI: 10.1037/a0016547.
- [39] Rolf A. Zwaan. "Embodied cognition, perceptual symbols, and situation models". In:
 Discourse Processes 28.1 (Jan. 1999), pp. 81–88. ISSN: 0163-853X. DOI:
 10.1080/01638539909545070.
- Rolf A. Zwaan, Robert A. Stanfield, and Richard H. Yaxley. "Language comprehenders mentally represent the shapes of objects". In: *Psychological Science* 13.2 (2002), pp. 168–171. ISSN: 0956-7976. DOI: 10.1111/1467-9280.00430. URL:
- ${\rm http://doi.apa.org/getdoi.cfm?doi=} 10.1037/0096\text{-}3445.135.1.1\%20 http://doi.apa.org/getdoi.cfm?doi=10.1037/0096\text{-}3445.135.1.1\%20 http://doi.apa.org/getdoi.cfm?doi=10.1037/0096\text{-}3445.135.1.1\%20 http://doi.apa.org/getdoi.cfm?doi=10.1037/0096\text{-}3445.135.1.1\%20 http://doi.apa.org/getdoi.cfm?doi=10.1037/0096\text{-}3445.135.1.1\%20 http://doi.apa.org/getdoi.cfm?doi=10.1037/0096\text{-}3445.135.1.1\%20 http://doi.apa.org/getdoi.cfm?doi=10.1037/0096\text{-}3445.135.1.1\%20 http://doi.apa.org/getdoi.cfm?doi=10.1037/0096$
- //journals.sagepub.com/doi/10.1111/1467-9280.00430.

[41] Rolf A. Zwaan and Lawrence J. Taylor. "Seeing, acting, understanding: Motor resonance in language comprehension." In: *Journal of Experimental Psychology:* General 135.1 (2006), pp. 1–11. ISSN: 1939-2222. DOI: 10.1037/0096-3445.135.1.1. URL: http://doi.apa.org/getdoi.cfm?doi=10.1037/0096-3445.135.1.1.

Table 1 $Area\ under\ curve\ model\ statistics$

| Word Type | Model | df | AIC | BIC | χ^2 | $\Delta \chi^2$ | p |
|-----------|-------------------|----|-----------|-----------|-----------|-----------------|--------|
| Pseudo | Intercept Only | 2 | 144345.73 | 144362.72 | -72170.87 | NA | NA |
| Pseudo | Random Intercept | 3 | 134813.09 | 134838.57 | -67403.54 | 9534.65 | < .001 |
| Pseudo | Adjustor Variable | 4 | 134814.22 | 134848.20 | -67403.11 | 0.87 | .351 |
| Pseudo | Main Effects | 8 | 134577.92 | 134645.89 | -67280.96 | 244.29 | < .001 |
| Pseudo | Interactions | 19 | 134577.46 | 134738.87 | -67269.73 | 22.47 | .021 |
| Real | Intercept Only | 2 | 168169.14 | 168186.14 | -84082.57 | NA | NA |
| Real | Random Intercept | 3 | 166459.55 | 166485.05 | -83226.78 | 1711.59 | < .001 |
| Real | Adjustor Variable | 4 | 166424.46 | 166458.46 | -83208.23 | 37.09 | < .001 |
| Real | Main Effects | 8 | 166281.81 | 166349.81 | -83132.91 | 150.65 | < .001 |
| Real | Interactions | 19 | 166253.65 | 166415.14 | -83107.82 | 50.16 | < .001 |

Note. AIC: Aikaike Information Criterion, BIC: Bayesian Information Criterion

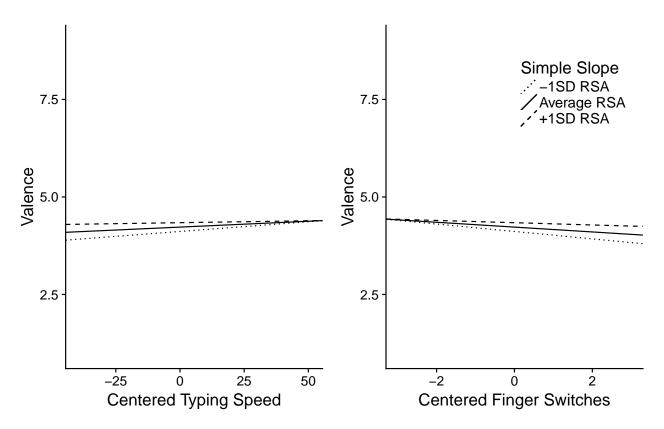


Figure 1. Simple slopes for pseudowords interaction effects. The left plot indicates the speed interaction across simple slopes of RSA, while the right plot indicates the interaction of finger switches and RSA. Speed has positive effects when RSA is low (left handed words), while finger switches have negative effects when RSA is low.

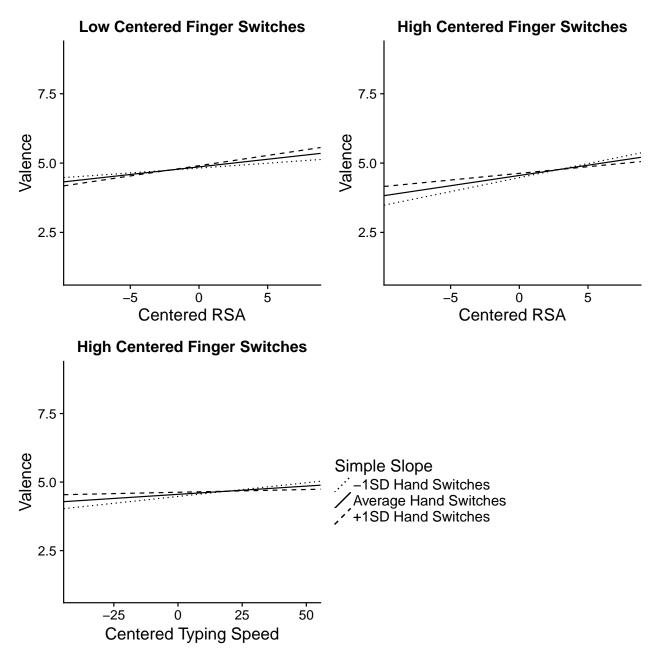


Figure 2. Simple Slopes for real word interactions of finger switchings by RSA by hand switches and finger switches by speed by hand switches. The top left figure indicates the interaction for RSA and hand switches at low finger switches. The average level of finger switches did not show an interaction. The top right panel portrays the interaction of RSA and hand switches at high simple slopes for finger switches. The bottom left figure shows the interaction of typing speed and hand switches at high finger switches. Low and average finger switches did not show this interaction.