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### ENTRAINMENT TO LINGUISTIC REGULARITIES

#### Abstract

Reading is both a visual and a linguistic task, and as such it relies on both general-purpose, visual mechanisms and more abstract, meaning-oriented processes. Disentangling the roles of these resources is of paramount importance in reading research. The present study capitalizes on the coupling of Fast Periodic Visual Stimulation (FPVS; Rossion, 2014) and MEG recordings to address this issue and investigate the role of different kinds of visual and linguistic units in the visual word identification system. We compared strings of pseudo-characters (BACS; C. Vidal & Chetail, 2017); strings of consonants (e.g., *sfcl*); readable, but unattested strings (e.g., amsi); frequent, but non-meaningful chunks (e.g., *idge*); suffixes (e.g., *ment*); and words (e.g., *vibe*); and looked for discrimination responses with a particular focus on the ventral, occipito-temporal regions. The results revealed sensitivity to alphabetic, readable, familiar and lexical stimuli. Interestingly, there was no discrimination between suffixes and equally frequent, but meaningless endings, thus highlighting a lack of sensitivity to semantics. Taken together, the data suggest that the visual word identification system, at least in its early processing stages, is particularly tuned to form-based regularities, most likely reflecting its reliance on general-purpose, statistical learning mechanisms that are a core feature of the visual system as implemented in the ventral stream.

*Keywords:* Neural Entrainment, Reading, Linguistic Units, Visual Word Identification, Statistical Learning 2

# Selective Neural Entrainment Reveals Hierarchical Tuning to Linguistic Regularities in Reading

In today's complex societies, printed words are among the most culturally 1 relevant visual objects processed by the human brain. Visual word recognition is 2 dexterously mastered by skilled readers, who can process written input as swiftly as 3 animals, plants or faces. However, printed words are not natural objects: reading and 4 writing constitute a relatively recent invention (Carr, 1999), making the literate brain a 5 case of an expert system shaped by cultural experience (Dehaene & Cohen, 2011) As 6 such, the neural underpinnings of reading have attracted much attention as a window 7 not only into the computational structure of the brain, but also into learning and 8 plasticity (e.g., Carreiras et al., 2014; Van Paridon et al., 2021). 9

Consistent evidence suggests the literate system relies on cortical resources 10 originally deputed to other functions (e.g., visual object processing) and reorganized (or 11 even recycled, Dehaene & Cohen, 2007) during literacy acquisition (as reviewed in, e.g., 12 Dehaene et al., 2015). As a result, the neural underpinnings of reading would still 13 follow the principles that govern object recognition in the ventral stream (Dehaene 14 et al., 2005). A clear example comes from the hierarchical organization observed in the 15 macaque monkey, with an anterior-to-posterior progression of increasingly larger 16 receptor fields for more complex objects (Booth & Rolls, 1998; Riesenhuber & Poggio, 17 1999; Rolls, 2001). This structure might be ideally suited for language; many theories, 18 particularly of visual word identification, stipulate a hierarchy of progressively larger 19 processing units, from letters, to morphemes, to words (e.g., Crepaldi et al., 2010; 20 Grainger & Beyersmann, 2017; Grainger & Ziegler, 2011; Taft & Nguyen-Hoan, 2010). 21 Evidence for a graded selectivity for increasingly complex linguistic stimuli was 22

observed by Vinckier et al. (2007) in a portion of the ventral occipitotemporal cortex
(vOT), with the asymmetrical left profile that is generally associated with linguistic
processing (Cohen et al., 2002; Dejerine, 1892; Warrington & Shallice, 1980). Vinckier
et al. (2007) exposed skilled readers to a hierarchy of linguistic stimuli, ranging from
strings of pseudo-characters to real words, and including sequences of infrequent letters,

<sup>28</sup> frequent letters but rare bigrams, and frequent bigrams but rare quadrigrams.

BOLD-contrast responses indicated the presence of a hierarchical trajectory, with
progressively selective responses for more complex stimuli. Moreover, this hierarchy
unfolded in a posterior-to-anterior gradient, again in line with a fundamental
organizational principle of the visual identification system more generally (e.g., DiCarlo
et al., 2012).

In addition to unveiling the general organization of the orthographic system in 34 the ventral stream, Vinckier et al. (2007)'s data raise several interesting questions. 35 First, the hierarchy of stimuli that they used is entirely based on visual familiarity (i.e., 36 frequency). Frequency of occurrence is a crucial element in the visual word 37 identification system (e.g., Coltheart et al., 2001; Forster & Chambers, 1973; Norris, 38 2006). However, there are also units that, on top of frequency, have a peculiar linguistic 39 status that would place them somewhat higher in this hierarchy (e.g., graphemes, such 40 as ch in chart, or morphemes, such as er in dealer, might be more relevant for skilled 41 readers compared to frequent, but linguistically unmarked units, e.g., *el* in *chapel*). 42 Indeed, such higher linguistic constructs were repeatedly shown to have a crucial 43 functional role in word identification (e.g., Amenta & Crepaldi, 2012; Grainger et al., 44 1991); what is then the relationship between said units, and the letter chunks 45 considered in Vinckier et al. (2007)? 46

Second, Vinckier et al. (2007) found that real words did not differ from highly 47 frequent, ortho-phonotactically legal quadrigrams (i.e., pseudowords). Albeit in line 48 with previous evidence (Binder et al., 2006; Dehaene et al., 2005; Pammer et al., 2004; 49 Price et al., 1996; Wydell et al., 2003), the lack of a reliable neural distinction between 50 words and pseudowords has been object of a heated debate (as detailed in, e.g., Price, 51 2012; Taylor et al., 2013). Indiscriminate responses to real words (e.g., rent) and 52 well-structured letter strings, previously unseen and meaningless (e.g., tren), suggest 53 that visual word recognition might be entirely supported by abstract orthographic 54 knowledge, consolidated by frequent encounters with regularly co-occurring patterns 55 and beyond any lexical information. In line with this observation, some models of 56

visual word identification (Baaven et al., 2011; Binder et al., 2006; Xu & Taft, 2014) 57 have entirely disposed of an orthographic lexicon – a functional and neural repository 58 that stores word representations –, which has been at the core of neuropsychological 59 models of reading in the 20th century (e.g., Morton, 1969; Patterson et al., 1987; 60 Wernicke, 1874). These sublexical accounts have been challenged on the basis of studies 61 showing selective lexical responses (Glezer et al., 2009; Kronbichler et al., 2007; 62 Kronbichler et al., 2009), and proposing an interactive account of linguistic 63 information, which would provide a source of top-down feedback for the early 64 processing of orthographic input (e.g., Carreiras et al., 2014; Heilbron et al., 2020; 65 Price & Devlin, 2003, 2011). In this breed of theories, both orthographic features and 66 higher-order information (like phonology or semantics), as well as their mutual 67 interaction, are at the core of the neural computations performed in the literate brain. 68 A strict integration of information across the linguistic system has been also pushed by 69 data showing early phonological and semantic effects upon the presentation of written 70 words (e.g., Amenta et al., 2015; Chen et al., 2015; Rastle & Brysbaert, 2006; Sulpizio 71 et al., 2022). Findings are still somewhat inconsistent on this topic, particularly on the 72 neuroimaging side (e.g., Vignali et al. (2023) could not find reliable semantic effects 73 until 320ms after stimulus onset, well after the emergence of orthographic effects). 74 Overall, however, they certainly yield some credibility to the hypothesis that 75 orthographic information might be strongly coupled with phonology and semantics, 76 perhaps to the point that there is no, or very little temporal separation between. 77 Overall, this ongoing debate clearly indicates that while we might have achieved rather 78 refined knowledge of *where* the neural underpinnings of reading reside, we still have 79 many important outstanding questions on *what* such areas code for (see Taylor et al., 80 2013, for the suggestion of an overarching framework). 81

A third important note concerns the distinction between semanticity and lexicality – carrying a meaning vs. being attested as a free-standing word. Naturally, the two aspects tend to coincide in the language; existing words (e.g., *salt*) differ from pseudowords (e.g., *falt*) *both* because words carry meaning *and* they are independent

chunks of letters that serve as functional units in the language. As a result, comparing 86 words and nonwords does not allow to definitely adjudicate between the prevalence of 87 semantic and lexical effects. Teasing the two apart, however, is absolutely critical for a 88 theoretical understanding of reading, and may shed light on the specific function of the 89 mid-fusiform gyrus (referred by many as the 'visual word form area', e.g., Dehaene & 90 Cohen, 2011, a portion of the visual system whose involvement in linguistic processing 91 has long been in the limelight of reading research). If cortical patches in these areas 92 code for meaning, then specific linguistic functions are already performed at these early 93 cortical stages. If, instead, this brain region is sensitive to lexicality, but not to 94 semanticity per se, then the computations performed at this point of the visual 95 hierarchy might be supporting linguistic and other, more general, visual material alike. 96 That is, these areas might not feature language-specificity (e.g., Hillis et al., 2005; 97 Wandell, 2011). 98

In the present work, we tackle these issues by taking advantage of a paradigm 99 that recently became a prominent tool to address selective neural representations, 100 namely Fast Periodic Visual Stimulation (FPVS, Rossion, 2014). By relying on 101 frequency tagging, FPVS allows to isolate the brain's oscillatory response induced by 102 the rapid, periodic presentation of visual items at a fixed rate (Norcia et al., 2015). 103 The elicitation of such oscillatory responses has been recently combined with oddball 104 designs: the regular embedding of items of a given kind (e.g., faces) in a stream of 105 stimuli belonging to a different category (e.g., objects) creates a secondary, slower 106 periodicity that is specific to the stimuli of interest, and that, crucially, can be only 107 captured if the brain is indeed sensitive to the distinction (i.e., the two types of stimuli 108 are supported by distinct neural representations). Critically, neural discrimination 109 responses are elicited within few minutes of stimulation, are clearly quantifiable at the 110 predefined frequency of interest, and yield high signal-to-noise ratios. Importantly, any 111 response is gathered implicitly, in the absence of task-induced confounds, and is 112 selective to the dimension that differentiates the two classes of items presented within 113 the stimulation sequence. 114

This approach allowed Lochy et al. (2015) to obtain selective neural responses 115 for lexical items. Skilled readers were presented with periodic streams of stimuli (e.g., 116 pseudowords, presented with a frequency of 10 Hz) in which word items appeared at 117 regular intervals (every 5 items, hence with a 2Hz frequency). Known words elicited a 118 neural entrainment, as evidenced by a sharp 2 Hz response measured at scalp, 119 reflecting the brain's ability to implicitly and rapidly discriminate lexical items in a 120 stream of readable, ortho-phonotactically legal, but non-existing pseudowords. A series 121 of studies adopting linguistic material (e.g., Lochy et al., 2018; Lochy et al., 2015; 122 Lochy et al., 2016) corroborated the role of FPVS as a powerful window into the neural 123 basis of visual word processing. Carefully controlled FPVS sequences could not only 124 address the existence of lexical representations, but also probe the specific 125 contributions of all the features that characterize linguistic information. Written input 126 is indeed composed of a series of nested levels, with phonological, orthographic and 127 semantic factors permeating different units of processing. In the eyes of a skilled 128 reader, known words are highly familiar, complex visual objects, which become 129 perceptually salient after a lifetime exposure (a mechanism akin to perceptual learning, 130 Fahle et al., 2002; Gilbert et al., 2001; Goldstone, 1998; Nazir et al., 2004; Nazir & 131 Huckauf, 2007). Structurally, visual words are combinations of known symbols (e.g., 132 letters) that reflect the statistical co-occurrence regularities of the written language 133 (Araújo et al., 2015; Lin et al., 2011; Rudell & Hu, 2000). Words have also consistent 134 phonological (Aparicio et al., 2007; Braun et al., 2015; Dietz et al., 2005), 135 morphological (Leminen et al., 2016; Leminen et al., 2013; Leminen et al., 2019; 136 Vigliocco et al., 2006) and semantic associations (Devereux et al., 2013; Mirman & 137 Magnuson, 2009; Price et al., 2006). 138

The present study aimed at investigating the contribution of each of these features by coupling MEG recordings with FPVS sequences, in a tightly controlled hierarchy of contrasts. The use of MEG is an important novelty as compared to most of the previous FPVS literature (but see, e.g., Pescuma et al., 2022); in fact, this technique allows a reasonable spatial resolution, while maintaining the fine temporal

resolution that is required to study neural entrainment. By projecting the relevant 144 FPVS response at source level, not only is possible to probe much more refined 145 linguistic and visual representations, but also to appreciate their spatial arrangement in 146 the ventral stream and, more generally, within the language processing network. Each 147 contrast under study tackled a specific linguistic feature, seeking evidence for its 148 relevance in skilled reading. Specifically, we assessed the presence of an Alphabetic 149 response, by contrasting strings of consonants (e.g., sfcl) with sequences of items 150 composed of artificial characters matching Roman letters on low-level visual features 151 (BACS-2 characters, C. Vidal & Chetail, 2017). The same strings of consonants were 152 then pitted against readable, but non-existing strings (e.g., *amsi*), to test the relevance 153 of Readability. Readable items were subsequently compared to meaningless word 154 endings that are highly frequent in the written language (e.g., enso), to investigate the 155 impact of Familiarity. Such frequent units were then set against suffixes, which are 156 frequent and meaningful sublexical items (e.g., eria), so that we could isolate 157 sensitivity to meaning. The final comparison involved suffixes on one hand, and words 158 (e.g., *idea*) on the other: a successful discrimination, here, would represent a purely 159 lexical response, in that both classes of items are frequently attested in the written 160 environment and consistently associated with meaning, and are exclusively 161 differentiated on the basis of their lexical status. 162

163

#### Materials and Methods

#### 164 Participants

Twenty-one volunteers (10 females; age: M=27.2, SD=5.35) took part in the experiment after giving written informed consent. All participants were right-handed native Italian speakers with normal or corrected-to-normal vision and no history of linguistic or neurological impairment. The experiment was conducted in accordance with the Declaration of Helsinki and was approved by the local ethical committee of the University of Trento (Prot. 2017-020).

#### 171 Materials

Stimuli (illustrated in 1) comprised six categories of 32 items, all three-to-four 172 elements long (M=3.53, SD=0.507). Words (W, e.g., idea) were Italian nouns, and 173 Suffixes (Suff. e.g., *eria*, in English *ery*) were derivational morphemes. Frequent 174 Endings (HFE, e.g., enso, akin to the English kle) were highly frequent, meaningless 175 word endings attested in Italian. Pseudoendings (PE, e.g., amsi) were pronounceable 176 letter strings with a regular CV-structure (i.e., fourteen items: CCV, seventeen items: 177 VCCV, one item: VVV) that could potentially constitute ortho-phonotactically legal 178 word endings in Italian, but are not attested in the language. Nonword stimuli (NW, 179 e.g., sfcl) comprised random consonant strings and were thus unpronounceable. Finally, 180 Pseudofont (PF) strings were obtained by rendering random combinations of characters 181 from the BACS-2 serif artificial script (C. Vidal & Chetail, 2017), and resulted in 182 strings of symbols closely matching the visual characteristics of Latin characters (i.e., 183 number of strokes, junctions, terminations, and serifs). 184

Among the linguistic items, Words, Suffixes and Frequent Endings had a high and comparable written token frequency, measured by taking into account the cluster position within the word (W: M=4.507, SD=0.580; Suff: M=4.983, SD=0.533; HFE: M=4.229; SD=0.925), while Pseudoendings and Nonwords had a zero frequency, as per their definition. Frequency metrics are computed on SUBTLEX-IT (Crepaldi et al., 2013), which is based on a sample of 128 million words from movie subtitles (number of types=517,564).

Given the strict constraints on the stimuli (e.g., the set of 32 suffixes we 192 employed here is very close to the complete set of 3- and 4-letter Italian suffixes), the 193 final selection includes some sub-optimal items. Specifically, seven suffixes were 194 homographic to words (e.g., *-ione*, with the Italian word for *ion*). We minimized the 195 potential impact of these items by fully randomizing the item order for each 196 participant; given the small number of the word-homographic suffixes, this drastically 197 reduced (eliminated, effectively) the possibility that they might yield extra frequencies 198 of resonance, or hamper the entrainment to the relevant frequencies by design. 199

#### 200 Procedure

Stimuli were presented via sinusoidal contrast modulation at a frequency of 6 Hz 201 for 26.7 seconds, with each stimulus cycle lasting a total of 166.66 ms. Two types of 202 stimulation sequences were presented for each condition. In experimental trials, the 203 stimulation alternated between stimuli that belonged to two different categories (i.e., 204 XYXYXY), such that stimuli from each category were presented every 333.33 ms (i.e., 205 at a frequency rate of 6 Hz/2=3 Hz). In baseline trials, a sequence comprised stimuli 206 that belonged only to one category (i.e., xxxxx). This design ensured that in each 207 experimental condition a differential signal (i.e., difference between alternating and 208 baseline sequences) at the stimulation frequency of 3 Hz reflected a neural response 209 that was selective to the property that distinguished the two categories of stimuli. It is 210 important to appreciate that this paradigm is intrinsically non-directional: a difference 211 between the experimental condition with suffixes and words and the baseline condition 212 with words only implies that the brain is sensitive to lexicality – not that it is 213 specifically sensitive to words per se, or to suffixes per se. Stated differently, the choice 214 of baseline (Word-Word, or Suffix-Suffix) does not affect the Word-Suffix condition. For 215 a schematic illustration of the experimental design and examples of stimulation 216 sequences, see Figure 1. 217

Five experimental conditions were used to isolate neural responses to stimuli 218 that are alphabetic (Nonwords vs. Pseudofonts; baseline: Nonwords), readable 219 (Pseudoendings vs. Nonwords; baseline: Pseudoendings), sublexical orthographic units 220 (Frequent Endings vs. Pseudoendings; baseline: Frequent Endings), sublexical 221 meaningful units (Suffixes vs. Frequent Endings; baseline: Suffixes), and lexical units 222 (Words vs. Suffixes; baseline: Words). There were 6 trials per experimental condition 223 and type of sequence, yielding a total stimulation time of 45 minutes: 26.7 s (trial 224 duration) X 5 experimental conditions X 2 types of sequences (alternating, baseline) X 225 6 trials. Trials consisted of unique sequences of 160 stimuli, each of which was 226 presented exactly five times in a pseudo-randomized fashion to avoid close repetitions; 227 additionally, the order of specific items was randomized for each participant, to avoid 228

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potential list effects. The order of trial presentation was also pseudo-randomized to
avoid close repetitions of specific classes of items during the course of the experimental
session. Trial presentations were separated by 15-second breaks.

Participants were seated at approximately 1 meter from a PROPixx DLP 232 projector (VPixx Technologies, Canada). The screen had a 1440x1080 pixels resolution 233 and a refresh rate of 120 Hz. Stimulus display was administered by PsychToolbox-3 234 (Brainard, 1997) on MATLAB R2015a (The MathWorks) in a Windows environment. 235 All stimuli were presented at the center of the screen. All alphabetic stimuli (i.e., 236 Words, Suffixes, Frequent Endings, Pseudoendings and Nonwords) were presented in 237 lowercase characters, using the fixed-width Courier New font, whereas Pseudofonts were 238 presented in BACS-2 serif font. Both fonts were emboldened by 70% from their original 239 character weight to improve visibility. Each stimulus subtended horizontal and vertical 240 visual angles of 2.58 and 0.64 degrees. 241

To ensure participants maintained a constant level of attention, they were 242 instructed to monitor the color change of a cross presented continuously at the center 243 of the screen. The change, from blue to red and vice versa, occurred three times in 244 each trial, independently of the experimental manipulation. Overall, participants' 245 performance in the color-change detection task was close to ceiling in accuracy 246 (M=97.8%, SD=14), and featured fast reaction times, (M=465 ms, SD=177). 247 Moreover, it was comparable across experimental trials (NW in PF=97%, SD=16, 248 reaction time: M=460 ms, SD=157; PE in NW=97.3%, SD=16, reaction time: M=469249 ms, SD=188; HFE in PE=98.4%, SD=12, reaction time: M=468 ms, SD=175; Suff in 250 HFE=97.8%, SD=14, reaction time: M=476 ms, SD=202; W in Suff=98.6%, SD=11, 251 reaction time: M=452, SD=145) as well as baseline trials (NW in NW=97.3%, SD=16, 252 reaction time: M=466 ms, SD=189; PE in PE=98.1%, SD=13, reaction time: M=455253 ms, SD=149; HFE in HFE=97.8%, SD=14, reaction time: M=477 ms, SD=216; Suff 254 in Suff=97.6%, SD=15, reaction time: M=461 ms, SD=160; W in W=98.4%, SD=12, 255 reaction time: M=462 ms, SD=173). A one-way ANOVA revealed no statistically 256 significant differences across conditions (accuracy: F(9, 1230)=0.522, p=0.859; reaction 257

258 time: F(9, 1230) = 0.894, p = 0.53).

# 259

### <sup>9</sup> MEG acquisition, Preprocessing and Frequency analysis

MEG data were recorded using a whole-head 306 sensor (204 planar 260 gradiometers; 102 magneto-meters) Vector-view system (Elekta Neuromag, Helsinki, 261 Finland). Participants' head position was continuously determined with respect to the 262 MEG helmet through five head position indicator coils (HPIs). MEG signals were 263 recorded at a sampling rate of 1000 Hz and online band-pass filtered between 0.1 and 264 300 Hz. At the beginning of each experimental session, fiducial points of the head (the 265 nasion and the left and right pre-auricular points) and a minimum of 300 other 266 head-shape samples were digitized using a Polhemus FASTRAK 3D 519 digitizer 267 (Fastrak Polhemus, Inc., Colchester, VA, USA). Raw data were processed through 268 MaxFilter 2.0 (Elekta Neuromag). For each participant, bad channels were identified 269 via visual inspection, and interpolated. Head displacements were inspected and 270 corrected through realignment to a single reference. After applying movement 271 compensation, external sources of noise were separated and removed by applying the 272 temporal extension of signal space separation (tSSS; Medvedovsky et al., 2009; Taulu 273 and Hari, 2009; Taulu and Simola, 2006). 274

Preprocessing and analysis were performed in MATLAB (MathWorks, Inc) with 275 a combination of Fieldtrip (Oostenveld et al., 2011), Brainstorm (Tadel et al., 2011) 276 and custom scripts. Continuous recordings from each participant were band-pass 277 filtered (0.1 - 100 Hz), downsampled (250 Hz) and epoched into 26.7-seconds trials, 278 which were realigned to the onset of the first stimulus (via a photodiode). Segments 279 contaminated by artifacts were identified through visual inspection and manually 280 removed (1.11%). To remove eye movements and heartbeat related artifacts from the 281 MEG signal we performed an Independent Component Analysis (ICA, Jutten & 282 Herault, 1991), separately for magnetometers and planar gradiometers. Eye movement 283 and pulse-related components were captured by correlating the independent component 284 (IC) time series with that of EOG and ECG channels. 285

For each participant, trials within each condition were averaged, and submitted

to a Fast Fourier Transformation. Given the length of the epochs, the frequency 287 resolution was 1/26.7=0.0374 Hz. The spectra were then baseline-corrected by 288 subtracting from each frequency bin the mean of the surrounding 20 bins (10 from each 289 side, excluding local minima, maxima and immediately adjacent bins, as in e.g., 290 Dzhelyova and Rossion, 2014); the response of interest was then defined as the 291 baseline-corrected amplitude at 3 Hz. A significant discrimination response, indexing 292 neural entrainments elicited by items belonging to different categories, was assessed by 293 comparing the 3Hz response in each experimental condition (e.g., Words in Suffixes) 294 with the corresponding baseline (i.e., Words in Words). 295

Sensor Space Analysis. Sensor level analyses were run at whole-brain level through a non-parametric cluster permutation test (Maris & Oostenveld, 2007). Differences at 3 Hz between the experimental and the baseline conditions were assessed separately for magnetometers and combined planar gradiometers, by considering a minimum neighborhood distance of 6 millimeters between sensors. Statistical significance was assessed through a one-tail, dependent sample t-test with Monte-Carlo estimates over 5000 permutations (significance level: p < 0.05).

Source Space Analysis. Distributed minimum-norm source estimation (MNE, 303 Hämäläinen and Ilmoniemi, 1994) was applied following the standard procedure in 304 Brainstorm (Tadel et al., 2011). For twenty participants, anatomical T1-weighted MRI 305 images were acquired during a separate session in a Prisma 3T scanner (Siemens, 306 Erlangen, Germany) using a 3D MPRAGE sequence, 1-mm3 resolution, TR=2140 ms, 307 TI=900ms, TE=2.9ms, flip angle 12°, and segmented in Freesurfer (Fischl, 2012). 308 Co-registration of MEG sensor configuration and the reconstructed scalp surfaces was 309 based on around 300 scalp surface locations. As one participant did not undergo MRI 310 acquisition, we warped the default anatomy to match the shape defined by the digitized 311 points. Individual noise covariance matrices were computed from 1 s pre-stimulus 312 interval in all the available trials for each participant. The forward model was obtained 313 using the overlapping spheres method (Huang et al., 1999) as implemented in 314 Brainstorm. Fourier-transformed regression coefficients were then projected onto a 315

<sup>316</sup> 15000 vertices boundary element using a dynamic statistical parametric mapping
<sup>a17</sup> approach (dSPM; Dale et al., 2000), assuming dipole sources to be perpendicular to the
<sup>s18</sup> cortical surface. Individual results were spatially smoothed (3mm FWHM) and
<sup>s19</sup> projected to a default template (ICBM152).

Differences at 3 Hz between experimental and baseline conditions were then 320 assessed at source level in the vertices of predefined regions of interest, obtained from 321 the Desikan-Killiany cortical atlas (Desikan et al., 2006). The ROIs selected for the 322 source-level analysis corresponded to some of the most prominent cortices involved in 323 reading, such as fusiform (e.g., Dehaene et al., 2002), lingual (e.g., Raschle et al., 2011), 324 inferior parietal (e.g., Sliwinska et al., 2015), inferior temporal (e.g., Dien et al., 2013), 325 lateral occipital (e.g., Borowsky et al., 2007) and middle temporal (e.g., Turkeltaub 326 et al., 2003). On each ROI, significant responses were assessed via nonparametric 327 cluster permutation test (N=5000, p < 0.05; Maris & Oostenveld, 2007). Non-significant 328 effects were here explored through JZS Bayes Factor analysis ( $BF_{10}$ , scale factor 329 r=0.707; Rouder et al., 2009), which provides quantifiable evidence in support of H1 or 330 H0, thus allowing to support the null hypothesis itself (Leppink et al., 2017). 331

#### 332

### Results

Sensor Space. The profile of the neural responses gauged at the frequencies of 333 interest (3 and 6 Hz) for both experimental and control trials is depicted in Figure 2 334 As shown in Figure 3, a clear discrimination response indicated sensitivity to the 335 alphabetic nature of the items (NW-PF vs. NW-NW), emerging in a diffused area for 336 both planar gradiometers  $(t_{(20)}=311.13, p=0.0002, q=0.83 [0.53, 1.13])$  and 337 magnetometers  $(t_{(20)}=274.17, p=0.0002, q=0.81 [0.49, 1.12])$ . Lexical items embedded 338 in suffixes (W-Suff vs. W-W) also elicited a marked discrimination response, with 339 left-lateralized topography for both planar gradiometers ( $t_{(20)}=80.30$ , p=0.0004, g=0.65340 [0.12, 1.16]) and magnetometers  $(t_{(20)}=74.28, p=0.0002, g=0.71 [0.18, 1.22]).$ 341

No discrimination response emerged as statistically significant for the other contrasts. Readability (PE-NW vs. PE-PE) resulted in a cluster that did not reach significance in planar gradiometers ( $t_{(20)}=9.39$ , p=0.13, g=0.61 [-0.91, 2.01]) and no cluster for magnetometers. Familiarity (HFE-PE vs. HFE-HFE) produced a non-significant cluster for magnetometers ( $t_{(20)}=8.81$ , p=0.233, g=1.03) and no cluster for gradiometers. No significant cluster emerged for meaningful sublexical units (Suff-HFE vs. Suff-Suff).

Source Space. Significant discrimination responses in the predefined ROIs are displayed in Figure 4. At source level, a 3Hz discrimination response for the alphabetic nature of the stimuli (NW-PF vs. NW-NW) emerged bilaterally in all the areas of interest (as summarized in Table 1).

A discrimination between readable stimuli and strings of consonants (PE-NW vs. PE-PE) yielded a right-lateralized profile, involving fusiform ( $t_{(20)}=161.31$ , p=0.0216, g=1.23 [0.82, 1.63]), inferotemporal ( $t_{(20)}=134.31$ , p=0.0206, g=1.30 [0.86, 1.72]), lateral occipital ( $t_{(20)}=204.39$ , p=0.024, g=1.16 [0.82, 1.49]) and middle temporal cortices ( $t_{(20)}=105.35$ , p=0.0332, g=0.92 [0.48, 1.34]).

Familiarity (HFE-PE vs. HFE-HFE) elicited significant responses only in the right inferior temporal area ( $t_{(20)}=220.03$ , p=0.0178, g=1.14 [0.81, 1.47]).

Consistently with the results observed in sensor space, suffixes embedded in frequent endings yielded no significant response in the predefined ROIs. This null result was further explored through a JZS Bayes Factor analysis across ROIs, which, where conclusive, provided moderate evidence in favor of the null hypothesis (as described in Table 2).

<sup>365</sup> Differences between words and suffixes (W-Suff vs. W-W) were traced in

<sup>366</sup> bilateral fusiform (left:  $t_{(20)}=227.12$ , p=0.0174, g=1.11 [0.77, 1.44]; right: :

 $t_{(20)}=283.35, p=0.004, g=0.94 [0.65, 1.22])$ , together with two significant clusters in left inferior temporal (first:  $t_{(20)}=230.97, p=0.0206, g=1.01 [0.68, 1.33]$ ; second:

 $t_{(20)} = 186.03, p = 0.029, g = 0.93 [0.55, 1.29]), left lateral occipital (<math>t_{(20)} = 580.00, t_{(20)} = 580.00, t_{(20)}$ 

p=0.0008, g=0.77 [0.57, 0.97] and left lingual  $(t_{(20)}=436.91, p=0.004, g=1.23 [0.98, p=0.004, g=1.23 [0.98, g=0.77])$ 

371 1.48]).

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#### **General Discussion**

The present study investigated the neural underpinnings of visual word 373 identification, by asking which linguistic features might be rapidly and automatically 374 discriminated by the reading brain. With this aim, we paired MEG recordings with 375 Fast Periodic Visual Stimulation sequences (FPVS, Rossion, 2014) constructed 376 specifically to isolate some of the fundamental features of written text, in a carefully 377 controlled hierarchy of nested contrasts. In this design, observing neural entertainment 378 at the frequency with which classes of items were presented implicitly indexes a 379 selective discrimination for the feature that differentiates the two groups of items. 380 Interleaving words (e.g., *idea*) and suffixes (e.g., *eria*) revealed a strong Lexicality 381 response, already detectable at sensor level. Similarly, the alternation of 382 pseudo-characters and letter strings (e.g., sfcl) revealed a strong sensitivity to the 383 alphabetic nature of the stimuli, also observable at both sensor and source levels. More 384 subtle contrasts, addressing the role of Readability (with strings of consonants, e.g., sfcl 385 vs. pseudoendings, e.g., *ampi*) and Familiarity of letter strings (with high frequency 386 endings, e.g., enso vs. pseudoendings, e.g., ampi), were captured only at source level. 387 Notably, our results did not reveal a Meaningfulness response, as assessed by 388 contrasting suffixes (e.g., *eria*) with equally frequent, but meaningless word endings 389 (i.e., *enso*). 390

One way to interpret these findings is that the reading system is automatically 391 responsive to lexicality. Such a response is characterized by a predominantly 392 left-lateralized profile, arising in areas typically associated with word identification and 393 processing, such as left lateral occipital, lingual and inferotemporal cortices (Binder & 394 Price, 2001; Borowsky et al., 2007), as well as the bilateral fusiform gyrus (Cohen 395 et al., 2002; Dehaene et al., 2002; Fiez & Petersen, 1998; Puce et al., 1996). This 396 selective neural discrimination for lexicality lends some support to the existence of an 397 orthographic lexicon, consistently with more recent neural models of reading (Taylor 398 et al., 2013). Nevertheless, the spatial resolution of non-invasive human neuroimaging 399 in general, and of MEG in particular, requires a word of caution in interpreting these 400

results, especially at a cognitive level. Specifically, our findings cannot pinpoint
whether this Lexical response originates from a set of individual neurons specifically
selective to words per se, or rather from a coordinated, large ensemble of neurons with
a less granular preference. Therefore, the present study cannot arbitrate between
localist and distributed accounts of lexical neural codes at a mechanistic level (Bowers,
2009, 2017; Quian Quiroga & Kreiman, 2010; Roy, 2012; Vankov & Bowers, 2017).

Neuroimaging evidence has been fairly elusive as to whether the reading brain 407 responds specifically to existing words (as opposed to well formed strings of letters, 408 e.g., Binder et al., 2006; Dehaene et al., 2005; Pammer et al., 2004; Price et al., 1996; 409 Wydell et al., 2003). The adoption of neural adaptation techniques has provided a 410 decisive methodological boost in this direction, by allowing the tapping into selective 411 neuronal tunings to stimulus features (Grill-Spector et al., 2006; Norcia et al., 2015). 412 Importantly however, while previous studies succeeded in capturing selective 413 adaptation to lexical forms (e.g., Glezer et al., 2009; Lochy et al., 2015), they generally 414 did so by pitting words against pseudowords, thus adopting two classes of items that 415 differ in more than one relevant dimension. Written words are indeed meaningful 416 linguistic objects, with a known phonological and orthographic form, while 417 well-structured pseudowords are, albeit pronounceable (Taylor et al., 2013), unknown 418 strings of letters. Contrariwise, the Lexical response obtained in the present study 419 stems from an unprecedentedly tight comparison, realized by contrasting fully-fledged, 420 real words with suffixes. Morphemes like *-ness* or *-er* are attested in the language with 421 high frequency, and due to their derivational properties, they alter the meaning of 422 stems they are combined with in a highly predictable and consistent manner (e.g., 423 kindness, highness, singer, dancer) – thus, they have a specific meaning (Bloomfield, 424 1933; Bybee, 1988). Naturally, the nature of this meaning is often different from words; 425 for example, suffixes might be seen as carrying functional information, which modifies 426 the core lexical message carried by the stem (e.g., X-ness as the state of being X; 427 Marelli & Baroni, 2015<sup>1</sup>. Similar to words, however, suffixes forge strong and 428

<sup>&</sup>lt;sup>1</sup>Note, however, this does not have implications of strength, or relative importance; for example,

consistent associations between their orthographic form and a semantic concept (e.g.,
the suffix -er conveys agency), and they mostly differ from words in their sublexical,
rather than lexical, status, in that they cannot appear in isolation as independent
linguistic units. Therefore, the adoption of morphemes allows to uniquely overcome the
rather coarse characterization of the lexical discrimination obtained with pseudowords,
and supports the presence of a neural response that is specifically lexical, not related to
meaning, frequency of occurrence or readability alone.

Indubitably, sublexical morphemes such as suffixes play a fundamental function 436 in visual word identification. Behavioral evidence has extensively supported the role of 437 morphemes in the recognition of complex words (e.g., Amenta & Crepaldi, 2012; 438 Bonandrini et al., 2023; Giraudo & Voga, 2014; Rastle & Davis, 2008), including 439 experiments where, similar to the present study, suffixes where presented in isolation 440 and under tight visual conditions (masked priming; e.g., Andoni Dunabeitia et al., 441 2008). This was further corroborated by several neuroimaging studies (e.g., 442 Beyersmann et al., 2021; Davis et al., 2004; Devlin et al., 2004; Gold and Rastle, 2007; 443 Lavric et al., 2012; Lehtonen et al., 2011; Lewis et al., 2011; Pescuma et al., 2022; for a 444 recent review, see Leminen et al., 2019). Nevertheless, the vast majority of the 445 available studies investigated the role of morphemes by embedding them in a lexical 446 context (i.e., morphologically complex words, e.g., kind-ness, or pseudowords, e.g., 447 table-ness), and thus leaves their specific neural characterization somewhat 448 underspecified. The present study provides novel insight by indicating that, when 449 presented in isolation, suffixes are not reliably distinguished from frequent word 450 endings. Such a finding nicely reckons with recent experimental evidence obtained in 451 artificial lexicon studies showing that skilled readers can carve affix-like units on the 452 sole basis of their frequency of occurrence, and even in the absence of phonological or 453 semantic information (e.g., Chetail, 2017; Lelonkiewicz et al., 2020, 2023). Collectively, 454 this body of evidence does not abide by cognitive models of morphological processing 455 that assume dedicated representations for meaningful, sublexical units (e.g., Crepaldi 456

suffixes are generally assumed to be the morphological head of derived words.

et al., 2010; Taft, 2004; Taft & Nguyen-Hoan, 2010), and is better aligned with 457 accounts emphasizing perceptual and orthographic mechanisms for the decomposition 458 of complex words (e.g., Grainger & Beversmann, 2017). Particularly, Grainger and 459 Beyersmann (2017) theorize that while the recognition of sublexical units is achieved on 460 the basis of orthographic factors, their semantic activation is primarily driven by the 461 lexical context in which they appear (e.g., the meaning of -er would be activated when 462 the suffix is presented in an adequate context, like *sing-er*). Coherently, and in spite of 463 their morphological status, isolated suffixes would be no more perceptually salient than 464 other highly frequent word endings. 465

Taken together, our results seem to reflect the sensitivity of the reading system 466 to form-based regularities, by tapping into the bottom-up processing of visuo-linguistic 467 material. Words stood out as independent units even if compared with another set of 468 meaning-bearing items, consistently with theories of perceptual learning (Fahle et al., 469 2002; Gilbert et al., 2001; Goldstone, 1998). The lexical knowledge available to skilled 470 readers is indeed not only reliant on linguistic information, but also on the visual 471 familiarity that results from an extensive experience with written text, where frequent 472 and repeated encounters with printed words would consolidate their representation as 473 complex but unitary shapes, rather than combination of features (Gilbert et al., 2001; 474 Kennedy et al., 2000; Nazir & Huckauf, 2007). Consequently, individual words would 475 become privileged units of processing that "pop-out" (Nazir et al., 2004) to the eyes of 476 a skilled reader, particularly if displayed in their most prototypical form (as, for 477 instance, in a horizontal orientation, Nazir & Huckauf, 2007; Wimmer et al., 2016). 478 Critically, word tokens are generally surrounded by empty spaces, which provide 479 privileged anchor points to infer letter information and, subsequently, word identity 480 (Fischer-Baum et al., 2011; Grainger & Beyersmann, 2017; Jacobs et al., 2013). Such 481 perceptual salience might not be comparably bestowed upon suffixes, which, although 482 frequent and meaningful, are bound to appear within complex words and are never 483 encountered independently. Coherently, bound morphemes like suffixes were not 484 significantly discriminated from highly frequent, but meaningless word endings; both 485

classes of items are comparably familiar in their form arguably and are equally 486 supported by the perceptual experience of skilled readers. These considerations raise an 487 interesting point about the contribution of more linguistic and more perceptual factors 488 to our reading experience – and, more importantly, how they shape the cognitive and 489 neural architecture underlying reading. Of course, lexicality is a very rich linguistic 490 construct, which has important ramifications in virtually all aspects of our linguistic 491 experience (e.g., phonology, syntax). Yet, we always see words surrounded by blanks, 492 so it is not so unlikely that this becomes a fundamental piece of information that our 493 lexical system captures. We conceive these perceptual and linguistic factors as integral 494 parts of our visual word identification system; as allied, not competitors, in determining 495 the way in which the brain processes letters and words. Certainly, the present study 496 cannot really tease these perceptual and linguistic factors apart; this was not the goal 497 of the present work. Future studies, perhaps capitalizing upon orthographic systems 498 that do not build upon inter-word spacing (e.g., Mandarin Chinese), might shed some 499 light on the respective contributions of visual (e.g., boundedness) and linguistic (i.e., 500 meaning) factors in reading. 501

Additionally, the role of context in morpheme processing extends beyond 502 perceptual factors, as attested for instance by studies focusing on inflectional affixes. 503 Word and phrase contexts are critical for affix interpretation in languages with rich 504 inflectional systems (Franzon & Zanini, 2023; Pescuma et al., 2021), as well as for 505 disambiguating homographs (Franzon et al., 2021; Franzon & Zanini, 2023). Moreover, 506 the presence of semantic content in inflectional morphemes can even extend as far as to 507 affect word processing and recognition (Arcara et al., 2019; Zanini et al., 2020), 508 suggesting that the presence of a minimal context plays a fundamental role in allowing 509 readers to access the meaning of sublexical units. 510

Admittedly, this might depend, at least in part, on the specific paradigm adopted. FPVS enhances the visual, fast, automatic and implicit processing of letters and strings; therefore, it certainly taps into what can be thought as the perceptual front-end of the reading system. This might reconcile the highly relevant role that <sup>515</sup> morphemes play in visual word identification (e.g., Amenta & Crepaldi, 2012;
<sup>516</sup> Bonandrini et al., 2023) with the lack of a suffix-specific response observed in the
<sup>517</sup> present work. Nevertheless, the present data indicates that words and suffixes have
<sup>518</sup> different statuses in the visual word identification system, a conclusion that speaks
<sup>519</sup> against what many cognitive models postulate (e.g., Crepaldi et al., 2010; Grainger &
<sup>520</sup> Ziegler, 2011; Taft & Nguyen-Hoan, 2010).

With respect to the lack of semantic effects, it is interesting to note that some 521 FPVS study was able to elicit meaning-based responses (Stothart et al., 2017). 522 However, these effects emerged with images, not words, and using slower oddball 523 cycles; these methodological differences might be critical for tackling higher-level 524 processing. There is also neuroimaging evidence suggesting very early semantic 525 activation for written words (e.g., Chen et al., 2015; Sulpizio et al., 2022). However, 526 this literature did not use FPVS, and the specific timing of meaning activation in the 527 brain after the presentation of written words is still quite inconsistent across studies 528 (e.g., Vignali et al., 2023). 529

The selective neural responses for Alphabetic stimuli, as well as for Readability 530 and Familiarity, also sit well with a bottom-up account of the present results. Strings 531 of consonants embedded in pseudo-characters elicited a strong and diffused response, 532 involving all the predefined regions of interest considered. Such a pervasive Alphabetic 533 response suggests that, despite pseudo-characters being carefully matched onto letters' 534 low-level visual features (C. Vidal & Chetail, 2017), letter-based configurations were 535 markedly more familiar to skilled readers (Lochy et al., 2018; Lochy et al., 2015; Lochy 536 et al., 2016; Thesen et al., 2012; van de Walle de Ghelcke et al., 2020; Vinckier et al., 537 2007; Wang et al., 2021). When contrasted with strings of consonants, readable but 538 non-attested sequences of letters (e.g., *ampi*) elicited a right-lateralized response 539 encompassing fusiform, lateral occipital and both middle and inferior temporal ROIs, 540 areas reportedly involved in vowel processing, as opposed to consonants (Carreiras & 541 Price, 2008; Carreiras et al., 2009) and non-speech (Obleser et al., 2006; Uppenkamp 542 et al., 2006). Critically, ortho-phonotactically legal items are not only readable, but 543

also more word-like (as opposed to consonant strings), a feature considered to be at the 544 core of the neural underpinnings of reading (e.g., Binder et al., 2006; Vinckier et al., 545 2007), and consistent with a form-based regularity account of the present findings. In a 546 transparent orthography like Italian, orthographic units are unambiguously associated 547 with a phonological pattern, thus hampering a clear-cut distinction between the effects 548 of familiarity and readability per se. Nevertheless, recent neuroimaging evidence 549 obtained in Hebrew (Weiss et al., 2015) appears to support a privileged role for 550 familiarity over orthographic transparency. By exposing skilled readers to words with 551 vowel sounds rendered either through vowels alone, or with the adoption of diacritic 552 markers, Weiss et al. (2015) observed that the more familiar format (i.e., without 553 diacritics) provided a major processing advantage. This advantage overrode the 554 increased transparency ensured by the presence of diacritics, hence pinpointing visual 555 familiarity as a key feature in the neural processing of readable stimuli (see, e.g., 556 Chetail & Boursain, 2019; Kinoshita et al., 2021; Marcet et al., 2020; Perea et al., 2020; 557 Perea et al., 2022, for recent behavioral investigations on the topic). Critically, Italian 558 has a much more transparent orthography than Hebrew, and this might affect readers 559 in their propensity to rely on visual familiarity; further studies relying on direct 560 cross-linguistic comparisons are required to better describe the roles of familiarity and 561 orthographic depth in reading performance. 562

Finally, the contrast between readable but non-existing word endings (e.g., 563 ampi) and highly frequent word endings (e.g., enso) resulted in a selective neural 564 entrainment sourced in an anterior portion of the right inferotemporal ROI. Behavioral 565 research on reading pullulates with effects of written frequency, which have been often 566 considered proxies of learned representations (Baayen et al., 2007; Burani and 567 Thornton, 2003; Colé et al., 1989; Monsell et al., 1989; Preston, 1935; Taft, 1979, 2004; 568 see, e.g., Brysbaert et al., 2018; Ellis, 2002 for reviews). Neuroimaging studies indicate 569 that frequency effects can be traced throughout several visual word identification 570 processes (Barber & Kutas, 2007), and that frequency-modulated activations might be 571 housed in occipitotemporal regions (e.g., Frost et al., 2005; Keller et al., 2001; Kuo 572

et al., 2003; Montani et al., 2019; Vinckier et al., 2007; but see, e.g., Fiebach et al., 573 2002; Fiez et al., 1999; Ischebeck et al., 2004 for diverging patterns of results). Notably, 574 written frequency effects are reminiscent of a more general recognition mechanism of 575 extraction and storage of recurring patterns, including words, faces and other salient 576 visual objects (Kronbichler et al., 2004; Y. Vidal et al., 2021). In keeping with this 577 conjecture, the selective neural entrainment elicited by high-frequency clusters in the 578 present study stems from a portion of the inferior temporal cortex, which constitutes a 579 cornerstone of visual object encoding (DiCarlo et al., 2012). Particularly, this area has 580 been attested to support the processing of orthographic items in primates 581 (Rajalingham et al., 2020), and qualifies as a powerful visual processing resource to be 582 recycled (Dehaene & Cohen, 2007) by the more phylogenetically recent reading system. 583

The absence of a discrimination response for meaningfulness (i.e., between 584 high-frequency endings and suffixes) and the presence of effects that predominantly 585 relate to visual familiarity (e.g., frequent word endings vs. unattested letter strings) 586 seem to suggest that the present data are mostly driven by bottom-up processes. This 587 conclusion is also supported by a series of methodological considerations. The FPVS 588 technique allows to detect automatic and implicit neural discrimination responses 589 within a few minutes of stimulation, by capitalizing on a rapid presentation rate and 590 absence of explicit engagement with the experimental material (Liu-Shuang et al., 2014; 591 Norcia et al., 2015; Rossion, 2014). Critically, stimuli are presented via sinusoidal 592 contrast modulation (from white background to full contrast and back) with a 593 frequency of 6 Hz, thus each item remains on screen for about 167 ms, reaching full 594 contrast at 83 seconds, and with an actual visibility duration of around 140 ms 595 (considering that stimuli can be recognized at low contrast levels, such as 20%, Lochy 596 et al., 2015; Lochy et al., 2016). Such a brief presentation is complemented with the 597 perceptual masking induced by sequential stimulus presentation, which unfolds without 598 any inter-stimulus interval (in line with RSVP paradigms; see Retter et al., 2018, for a 599 related discussion). As a result, the present FPVS design is likely to tap into rather 600 early stages of processing, which are probably informed more by bottom-up, visual and 601

orthographic information rather than by top-down, higher level information (such assemantics).

Remarkably, the demanding nature of the stimulation stream is also consistent 604 with the spatial profile of the more subtle responses obtained along the hierarchy of 605 contrasts. Indeed, while linguistic processes are generally associated with activity in the 606 left hemisphere (Dehaene et al., 2001; Pinel & Dehaene, 2010), the right hemisphere is 607 reportedly more resilient to fast and degraded visual presentations of alphanumeric 608 stimuli (e.g., Asanowicz et al., 2017; Hellige & Michimata, 1989; Jonsson & Hellige, 609 1986; Michimata & Hellige, 1987; Sergent & Hellige, 1986; Verleger et al., 2013; 610 Verleger et al., 2011). Coherently, while a selective Lexical response resulted in a 611 prototypical left-lateralized profile, more subtle, sublexical units could enjoy weaker 612 support from pre-existent linguistic representations, which allowed the right-lateralized, 613 perceptual response to be more easily captured. Future research is needed to address 614 the impact of different experimental parameters, by systematically tuning the 615 stimulation frequency to the feature of interest, and assessing whether different 616 presentation rates could further qualify the neural entrainment hereby observed (for a 617 related discussion, see Alonso-Prieto et al., 2013; Rossion, 2014). 618

Overall, the present results contribute to our understanding of the general 619 architecture of the visual word identification system, and contribute to addressing some 620 critical open issues, such as the relationship between letter statistics and linguistic 621 units, as well as the role of lexicality and its relationship with meaning. When 622 semantics are decoupled from existence as an independent lexical unit – that is, from 623 being a recurrent string of letters flanked by blanks – the cognitive system does not 624 show much sensitivity to the former, and quite a lot for the latter (at least as far as 625 assessed in a FPVS setting). One hypothesis we can advance in this regard is that 626 FPVS might reduce the importance of the usual feedback signal that the fusiform gyrus 627 receives from higher-level language circuitry (Ben-Shachar et al., 2007; Devlin et al., 628 2006; Wandell, 2011), boosting visual effects and hampering the semantic factors. In 629 such case, the widespread lexicality effect observed could be interpreted as mostly 630

reliant on the bottom-up process of perceiving a unitary visual object: the word. The 631 FPVS lexicality signal attested here extends well beyond the posterior fusiform, and 632 includes the right anterior fusiform gyrus, the lateral occipital gyrus and the inferior 633 temporal gyrus on the left. These data would then suggest that the sensitivity of visual 634 string processing to chunks of letters that co-occur with specific statistical patterns 635 climbs up the visual identification system much more than what might have been 636 previously thought. Not only the posterior fusiform would be more about letter 637 co-occurrence statistics than meaning and 'proper' linguistic content (e.g., Dehaene & 638 Cohen, 2011; Hillis & Caramazza, 1991; Nobre et al., 1994), but the statistics and, 639 more generally, the more perceptual aspects of visual word identification would play a 640 relevant role upstream. This would be in line with data (e.g., Y. Vidal et al., 2021) and 641 theories (e.g., Dehaene & Cohen, 2007) suggesting that the computational structure of 642 the visual word identification system might be strongly determined by the pre-existing, 643 biologically-constrained processing mechanisms that reside in these areas. 644

In conclusion, the present study capitalized on FPVS and MEG recordings to shed some new light on which linguistic features underpin reading. Implicit discrimination responses emerged in a tightly controlled hierarchy of contrasts, whose extremes revealed a strong sensitivity to letters and lexical items. Sensitivity to the intermediate layers – the mere association with meaning, familiarity and readability – was generally weaker, if present at all. Taken together, these results provide novel insight into the brain's sensitivity to form-based regularities, and highlight the relevance of perceptual familiarity at the early stages of visual word identification.

# Declarations

# Code and Data Availability Statement

Data and materials for the experiment reported in this study are available at

https://osf.io/u58w7/.

#### References

- Alonso-Prieto, E., Van Belle, G., Liu-Shuang, J., Norcia, A. M., & Rossion, B. (2013). The 6 hz fundamental stimulation frequency rate for individual face discrimination in the right occipito-temporal cortex. *Neuropsychologia*, 51(13), 2863–2875.
- Amenta, S., & Crepaldi, D. (2012). Morphological processing as we know it: An analytical review of morphological effects in visual word identification. Frontiers in psychology, 3, 232.
- Amenta, S., Marelli, M., & Crepaldi, D. (2015). The fruitless effort of growing a fruitless tree: Early morpho-orthographic and morpho-semantic effects in sentence reading. *Journal of Experimental Psychology: Learning, Memory and Cognition*, 41(5), 1587–1596.
- Andoni Dunabeitia, J., Perea, M., & Carreiras, M. (2008). Does darkness lead to happiness? masked suffix priming effects. Language and Cognitive Processes, 23(7-8), 1002–1020.
- Aparicio, M., Gounot, D., Demont, E., & Metz-Lutz, M.-N. (2007). Phonological processing in relation to reading: An fmri study in deaf readers. *Neuroimage*, 35(3), 1303–1316.
- Araújo, S., Faisca, L., Bramão, I., Reis, A., & Petersson, K. M. (2015). Lexical and sublexical orthographic processing: An erp study with skilled and dyslexic adult readers. *Brain and Language*, 141, 16–27.
- Arcara, G., Franzon, F., Gastaldon, S., Brotto, S., Semenza, C., Peressotti, F., & Zanini, C. (2019). One can be some but some cannot be one: Erp correlates of numerosity incongruence are different for singular and plural. *Cortex*, 116, 104–121.
- Asanowicz, D., Verleger, R., Kruse, L., Beier, K., & Śmigasiewicz, K. (2017). A right hemisphere advantage at early cortical stages of processing alphanumeric stimuli. evidence from electrophysiology. *Brain and cognition*, 113, 40–55.

- Baayen, R. H., Milin, P., Đurđević, D. F., Hendrix, P., & Marelli, M. (2011). An amorphous model for morphological processing in visual comprehension based on naive discriminative learning. *Psychological review*, 118(3), 438.
- Baayen, R. H., Wurm, L. H., & Aycock, J. (2007). Lexical dynamics for low-frequency complex words: A regression study across tasks and modalities. *The mental lexicon*, 2(3), 419–463.
- Barber, H. A., & Kutas, M. (2007). Interplay between computational models and cognitive electrophysiology in visual word recognition. *Brain research reviews*, 53(1), 98–123.
- Ben-Shachar, M., Dougherty, R. F., Deutsch, G. K., & Wandell, B. A. (2007). Differential sensitivity to words and shapes in ventral occipito-temporal cortex. *Cerebral Cortex*, 17(7), 1604–1611.
- Beyersmann, E., Montani, V., Ziegler, J. C., Grainger, J., & Stoianov, I. P. (2021). The dynamics of reading complex words: Evidence from steady-state visual evoked potentials. *Scientific Reports*, 11(1), 1–14.
- Binder, J. R., Medler, D. A., Westbury, C. F., Liebenthal, E., & Buchanan, L. (2006). Tuning of the human left fusiform gyrus to sublexical orthographic structure. *Neuroimage*, 33(2), 739–748.
- Binder, J. R., & Price, C. J. (2001). Functional neuroimaging of language. Handbook of functional neuroimaging of cognition, 187–251.
- Bloomfield, L. (1933). Language. New York, NY: Henry Holt.
- Bonandrini, R., Amenta, S., Sulpizio, S., Tettamanti, M., Mazzucchelli, A., & Marelli, M. (2023). Form to meaning mapping and the impact of explicit morpheme combination in novel word processing. *Cognitive Psychology*, 101594.
- Booth, M., & Rolls, E. T. (1998). View-invariant representations of familiar objects by neurons in the inferior temporal visual cortex. *Cerebral cortex (New York, NY:* 1991), 8(6), 510–523.

- Borowsky, R., Esopenko, C., Cummine, J., & Sarty, G. E. (2007). Neural representations of visual words and objects: A functional mri study on the modularity of reading and object processing. *Brain topography*, 20(2), 89–96.
- Bowers, J. S. (2009). On the biological plausibility of grandmother cells: Implications for neural network theories in psychology and neuroscience. *Psychological review*, 116(1), 220.
- Bowers, J. S. (2017). Parallel distributed processing theory in the age of deep networks. Trends in cognitive sciences, 21(12), 950–961.
- Brainard, D. H. (1997). The psychophysics toolbox. Spatial vision, 10(4), 433–436.
- Braun, M., Hutzler, F., Münte, T. F., Rotte, M., Dambacher, M., Richlan, F., & Jacobs, A. M. (2015). The neural bases of the pseudohomophone effect: Phonological constraints on lexico-semantic access in reading. *Neuroscience*, 295, 151–163.
- Brysbaert, M., Mandera, P., & Keuleers, E. (2018). The word frequency effect in word processing: An updated review. Current Directions in Psychological Science, 27(1), 45–50.
- Burani, C., & Thornton, A. M. (2003). The interplay of root, suffix and whole-word frequency in processing derived words. *Trends in Linguistics Studies and Monographs*, 151, 157–208.
- Bybee, J. L. (1988). Morphology as lexical organization. *Theoretical morphology*, 119141.
- Carr, T. H. (1999). Trying to understand reading and dyslexia: Mental chronometry, individual differences, cognitive neuroscience, and the impact of instruction as converging sources of evidence. *Converging methods for understanding reading* and dyslexia, 459–491.
- Carreiras, M., Armstrong, B. C., Perea, M., & Frost, R. (2014). The what, when, where, and how of visual word recognition. *Trends in cognitive sciences*, 18(2), 90–98.

- Carreiras, M., & Price, C. J. (2008). Brain activation for consonants and vowels. Cerebral Cortex, 18(7), 1727–1735.
- Carreiras, M., Vergara, M., & Perea, M. (2009). Erp correlates of transposed-letter priming effects: The role of vowels versus consonants. *Psychophysiology*, 46(1), 34–42.
- Chen, Y., Davis, M. H., Pulvermüller, F., & Hauk, O. (2015). Early visual word processing is flexible: Evidence from spatiotemporal brain dynamics. *Journal of Cognitive Neuroscience*, 27(9), 1738–1751.
- Chetail, F. (2017). What do we do with what we learn? Statistical learning of orthographic regularities impacts written word processing. *Cognition*, 163, 103–120.
- Chetail, F., & Boursain, E. (2019). Shared or separated representations for letters with diacritics? *Psychonomic bulletin & review*, 26(1), 347–352.
- Cohen, L., Lehéricy, S., Chochon, F., Lemer, C., Rivaud, S., & Dehaene, S. (2002). Language-specific tuning of visual cortex? functional properties of the visual word form area. *Brain*, 125(5), 1054–1069.
- Colé, P., Beauvillain, C., & Segui, J. (1989). On the representation and processing of prefixed and suffixed derived words: A differential frequency effect. *Journal of Memory and language*, 28(1), 1–13.
- Coltheart, M., Rastle, K., Perry, C., Langdon, R., & Ziegler, J. (2001). Drc: A dual route cascaded model of visual word recognition and reading aloud. *Psychological review*, 108(1), 204.

Crepaldi, D., Keuleers, E., Mandera, P., & Brysbaert, M. (2013). Subtlex-it.

- Crepaldi, D., Rastle, K., & Davis, C. J. (2010). Morphemes in their place: Evidence for position-specific identification of suffixes. *Memory & cognition*, 38(3), 312–321.
- Dale, A. M., Liu, A. K., Fischl, B. R., Buckner, R. L., Belliveau, J. W., Lewine, J. D., & Halgren, E. (2000). Dynamic statistical parametric mapping: Combining fmri and meg for high-resolution imaging of cortical activity. *neuron*, 26(1), 55–67.

- Davis, M. H., Meunier, F., & Marslen-Wilson, W. D. (2004). Neural responses to morphological, syntactic, and semantic properties of single words: An fmri study. *Brain and language*, 89(3), 439–449.
- Dehaene, S., & Cohen, L. (2007). Cultural recycling of cortical maps. *Neuron*, 56(2), 384–398.
- Dehaene, S., & Cohen, L. (2011). The unique role of the visual word form area in reading. Trends in cognitive sciences, 15(6), 254–262.
- Dehaene, S., Cohen, L., Morais, J., & Kolinsky, R. (2015). Illiterate to literate: Behavioural and cerebral changes induced by reading acquisition. Nature Reviews Neuroscience, 16(4), 234–244.
- Dehaene, S., Cohen, L., Sigman, M., & Vinckier, F. (2005). The neural code for written words: A proposal. Trends in cognitive sciences, 9(7), 335–341.
- Dehaene, S., Le Clec'H, G., Poline, J.-B., Le Bihan, D., & Cohen, L. (2002). The visual word form area: A prelexical representation of visual words in the fusiform gyrus. *Neuroreport*, 13(3), 321–325.
- Dehaene, S., Naccache, L., Cohen, L., Le Bihan, D., Mangin, J.-F., Poline, J.-B., & Rivière, D. (2001). Cerebral mechanisms of word masking and unconscious repetition priming. *Nature neuroscience*, 4(7), 752–758.
- Dejerine, J. (1892). Contribution à l'étude anatomopathologique et clinique des différents variétés de cécité verbale. *Mémoires de la Société de Biologie*, 4, 61–90.
- Desikan, R. S., Ségonne, F., Fischl, B., Quinn, B. T., Dickerson, B. C., Blacker, D., Buckner, R. L., Dale, A. M., Maguire, R. P., Hyman, B. T., et al. (2006). An automated labeling system for subdividing the human cerebral cortex on mri scans into gyral based regions of interest. *Neuroimage*, 31(3), 968–980.
- Devereux, B. J., Clarke, A., Marouchos, A., & Tyler, L. K. (2013). Representational similarity analysis reveals commonalities and differences in the semantic processing of words and objects. *Journal of Neuroscience*, 33(48), 18906–18916.

- Devlin, J. T., Jamison, H. L., Gonnerman, L. M., & Matthews, P. M. (2006). The role of the posterior fusiform gyrus in reading. *Journal of cognitive neuroscience*, 18(6), 911–922.
- Devlin, J. T., Jamison, H. L., Matthews, P. M., & Gonnerman, L. M. (2004). Morphology and the internal structure of words. *Proceedings of the National Academy of Sciences*, 101(41), 14984–14988.
- DiCarlo, J. J., Zoccolan, D., & Rust, N. C. (2012). How does the brain solve visual object recognition? *Neuron*, 73(3), 415–434.
- Dien, J., Brian, E. S., Molfese, D. L., & Gold, B. T. (2013). Combined erp/fmri evidence for early word recognition effects in the posterior inferior temporal gyrus. *Cortex*, 49(9), 2307–2321.
- Dietz, N. A., Jones, K. M., Gareau, L., Zeffiro, T. A., & Eden, G. F. (2005). Phonological decoding involves left posterior fusiform gyrus. *Human brain mapping*, 26(2), 81–93.
- Dzhelyova, M., & Rossion, B. (2014). Supra-additive contribution of shape and surface information to individual face discrimination as revealed by fast periodic visual stimulation. Journal of Vision, 14(14), 15–15.
- Ellis, N. C. (2002). Reflections on frequency effects in language processing. Studies in second language acquisition, 297–339.
- Fahle, M., Poggio, T., Poggio, T. A., et al. (2002). Perceptual learning. MIT Press.
- Fiebach, C. J., Friederici, A. D., Müller, K., & Von Cramon, D. Y. (2002). Fmri evidence for dual routes to the mental lexicon in visual word recognition. *Journal of cognitive neuroscience*, 14(1), 11–23.
- Fiez, J. A., Balota, D. A., Raichle, M. E., & Petersen, S. E. (1999). Effects of lexicality, frequency, and spelling-to-sound consistency on the functional anatomy of reading. *Neuron*, 24(1), 205–218.
- Fiez, J. A., & Petersen, S. E. (1998). Neuroimaging studies of word reading. Proceedings of the National Academy of Sciences, 95(3), 914–921.

- Fischer-Baum, S., Charny, J., & McCloskey, M. (2011). Both-edges representation of letter position in reading. *Psychonomic Bulletin & Review*, 18(6), 1083–1089.
- Fischl, B. (2012). Freesurfer. *Neuroimage*, 62(2), 774–781.
- Forster, K. I., & Chambers, S. M. (1973). Lexical access and naming time. Journal of verbal learning and verbal behavior, 12(6), 627–635.
- Franzon, F., Arcara, G., Zanini, C., Kiss, T., Pelletier, F. J., & Husić, H. (2021). 14 the role of context and cognition in countability: A psycholinguistic account of lexical distributions. *Things and Stuff: The Semantics of the Count-Mass* Distinction, 321.
- Franzon, F., & Zanini, C. (2023). The entropy of morphological systems in natural languages is modulated by functional and semantic properties. *Journal of Quantitative Linguistics*, 30(1), 42–66.
- Frost, S. J., Mencl, W. E., Sandak, R., Moore, D. L., Rueckl, J. G., Katz, L., Fulbright, R. K., & Pugh, K. R. (2005). A functional magnetic resonance imaging study of the tradeoff between semantics and phonology in reading aloud. *Neuroreport*, 16(6), 621–624.
- Gilbert, C. D., Sigman, M., & Crist, R. E. (2001). The neural basis of perceptual learning. Neuron, 31(5), 681–697.
- Giraudo, H., & Voga, M. (2014). Measuring morphology: The tip of the iceberg? a retrospective on 10 years of morphological processing.
- Glezer, L. S., Jiang, X., & Riesenhuber, M. (2009). Evidence for highly selective neuronal tuning to whole words in the "visual word form area". Neuron, 62(2), 199–204.
- Gold, B. T., & Rastle, K. (2007). Neural correlates of morphological decomposition during visual word recognition. Journal of Cognitive Neuroscience, 19(12), 1983–1993.
- Goldstone, R. L. (1998). Perceptual learning. Annual review of psychology, 49(1), 585–612.

- Grainger, J., & Beyersmann, E. (2017). Edge-aligned embedded word activation initiates morpho-orthographic segmentation. In *Psychology of learning and motivation* (pp. 285–317). Elsevier.
- Grainger, J., Colé, P., & Segui, J. (1991). Masked morphological priming in visual word recognition. Journal of memory and language, 30(3), 370–384.
- Grainger, J., & Ziegler, J. (2011). A dual-route approach to orthographic processing. Frontiers in psychology, 2, 54.
- Grill-Spector, K., Henson, R., & Martin, A. (2006). Repetition and the brain: Neural models of stimulus-specific effects. *Trends in cognitive sciences*, 10(1), 14–23.
- Hämäläinen, M. S., & Ilmoniemi, R. J. (1994). Interpreting magnetic fields of the brain: Minimum norm estimates. Medical & biological engineering & computing, 32(1), 35–42.
- Heilbron, M., Richter, D., Ekman, M., Hagoort, P., & De Lange, F. P. (2020). Word contexts enhance the neural representation of individual letters in early visual cortex. *Nature communications*, 11(1), 1–11.
- Hellige, J. B., & Michimata, C. (1989). Visual laterality for letter comparison: Effects of stimulus factors, response factors, and metacontrol. Bulletin of the Psychonomic Society, 27(5), 441–444.
- Hillis, A. E., & Caramazza, A. (1991). Category-specific naming and comprehension impairment: A double dissociation. *Brain*, 114(5), 2081–2094.
- Hillis, A. E., Newhart, M., Heidler, J., Barker, P., Herskovits, E., & Degaonkar, M. (2005). The roles of the "visual word form area" in reading. *Neuroimage*, 24(2), 548–559.
- Huang, M., Mosher, J. C., & Leahy, R. (1999). A sensor-weighted overlapping-sphere head model and exhaustive head model comparison for meg. *Physics in Medicine & Biology*, 44(2), 423.
- Ischebeck, A., Indefrey, P., Usui, N., Nose, I., Hellwig, F., & Taira, M. (2004). Reading in a regular orthography: An fmri study investigating the role of visual familiarity. *Journal of Cognitive Neuroscience*, 16(5), 727–741.

- Jacobs, A. M., Rey, A., Ziegler, J. C., & Grainger, J. (2013). Mrom-p: An interactive activation, multiple readout model of orthographic and phonological processes in visual word recognition. In *Localist connectionist approaches to human cognition* (pp. 157–198). Psychology Press.
- Jonsson, J. E., & Hellige, J. B. (1986). Lateralized effects of blurring: A test of the visual spatial frequency model of cerebral hemisphere asymmetry. *Neuropsychologia*, 24 (3), 351–362.
- Jutten, C., & Herault, J. (1991). Blind separation of sources, part i: An adaptive algorithm based on neuromimetic architecture. *Signal processing*, 24(1), 1–10.
- Keller, T. A., Carpenter, P. A., & Just, M. A. (2001). The neural bases of sentence comprehension: A fmri examination of syntactic and lexical processing. *Cerebral cortex*, 11(3), 223–237.
- Kennedy, A., Heller, D., Pynte, J., & Radach, R. (2000). Traces of print along the visual pathway. In *Reading as a perceptual process* (pp. 39–56). Elsevier.
- Kinoshita, S., Yu, L., Verdonschot, R. G., & Norris, D. (2021). Letter identity and visual similarity in the processing of diacritic letters. *Memory & Cognition*, 49(4), 815–825.
- Kronbichler, M., Bergmann, J., Hutzler, F., Staffen, W., Mair, A., Ladurner, G., & Wimmer, H. (2007). Taxi vs. taksi: On orthographic word recognition in the left ventral occipitotemporal cortex. *Journal of cognitive neuroscience*, 19(10), 1584–1594.
- Kronbichler, M., Hutzler, F., Wimmer, H., Mair, A., Staffen, W., & Ladurner, G. (2004). The visual word form area and the frequency with which words are encountered: Evidence from a parametric fmri study. *Neuroimage*, 21(3), 946–953.
- Kronbichler, M., Klackl, J., Richlan, F., Schurz, M., Staffen, W., Ladurner, G., & Wimmer, H. (2009). On the functional neuroanatomy of visual word processing: Effects of case and letter deviance. *Journal of Cognitive Neuroscience*, 21(2), 222–229.

- Kuo, W.-J., Yeh, T.-C., Lee, C.-Y., Wu, Y.-T., Chou, C.-C., Ho, L.-T., Hung, D. L., Tzeng, O. J., & Hsieh, J.-C. (2003). Frequency effects of chinese character processing in the brain: An event-related fmri study. *Neuroimage*, 18(3), 720–730.
- Lavric, A., Elchlepp, H., & Rastle, K. (2012). Tracking hierarchical processing in morphological decomposition with brain potentials. *Journal of Experimental Psychology: Human Perception and Performance*, 38(4), 811.
- Lehtonen, M., Monahan, P. J., & Poeppel, D. (2011). Evidence for early morphological decomposition: Combining masked priming with magnetoencephalography. *Journal of cognitive neuroscience*, 23(11), 3366–3379.
- Lelonkiewicz, J. R., Ktori, M., & Crepaldi, D. (2020). Morphemes as letter chunks: Discovering affixes through visual regularities. Journal of Memory and language, 115, 104152.
- Lelonkiewicz, J. R., Ktori, M., & Crepaldi, D. (2023). Morphemes as letter chunks: Linguistic information enhances the learning of visual regularities. Journal of Memory and Language, 130, 104411.
- Leminen, A., Jakonen, S., Leminen, M., Mäkelä, J. P., & Lehtonen, M. (2016). Neural mechanisms underlying word-and phrase-level morphological parsing. *Journal of Neurolinguistics*, 38, 26–41.
- Leminen, A., Leminen, M., Kujala, T., & Shtyrov, Y. (2013). Neural dynamics of inflectional and derivational morphology processing in the human brain. *Cortex*, 49(10), 2758–2771.
- Leminen, A., Smolka, E., Dunabeitia, J. A., & Pliatsikas, C. (2019). Morphological processing in the brain: The good (inflection), the bad (derivation) and the ugly (compounding). cortex, 116, 4–44.
- Leppink, J., O'sullivan, P., & Winston, K. (2017). Evidence against vs. in favour of a null hypothesis. *Perspectives on medical education*, 6(2), 115.
- Lewis, G., Solomyak, O., & Marantz, A. (2011). The neural basis of obligatory decomposition of suffixed words. *Brain and language*, 118(3), 118–127.

- Lin, S.-E., Chen, H.-C., Zhao, J., Li, S., He, S., & Weng, X.-C. (2011). Left-lateralized n170 response to unpronounceable pseudo but not false chinese characters—the key role of orthography. *Neuroscience*, 190, 200–206.
- Liu-Shuang, J., Norcia, A. M., & Rossion, B. (2014). An objective index of individual face discrimination in the right occipito-temporal cortex by means of fast periodic oddball stimulation. *Neuropsychologia*, 52, 57–72.
- Lochy, A., Jacques, C., Maillard, L., Colnat-Coulbois, S., Rossion, B., & Jonas, J. (2018). Selective visual representation of letters and words in the left ventral occipito-temporal cortex with intracerebral recordings. *Proceedings of the National Academy of Sciences*, 115(32), E7595–E7604.
- Lochy, A., Van Belle, G., & Rossion, B. (2015). A robust index of lexical representation in the left occipito-temporal cortex as evidenced by eeg responses to fast periodic visual stimulation. *Neuropsychologia*, 66, 18–31.
- Lochy, A., Van Reybroeck, M., & Rossion, B. (2016). Left cortical specialization for visual letter strings predicts rudimentary knowledge of letter-sound association in preschoolers. *Proceedings of the National Academy of Sciences*, 113(30), 8544–8549.
- Marcet, A., Ghukasyan, H., Fernández-López, M., & Perea, M. (2020). Jalapeno or jalapeño: Do diacritics in consonant letters modulate visual similarity effects during word recognition? *Applied Psycholinguistics*, 41(3), 579–593.
- Marelli, M., & Baroni, M. (2015). Affixation in semantic space: Modeling morpheme meanings with compositional distributional semantics. *Psychological review*, 122(3), 485.
- Maris, E., & Oostenveld, R. (2007). Nonparametric statistical testing of eeg-and meg-data. Journal of neuroscience methods, 164(1), 177–190.
- Medvedovsky, M., Taulu, S., Bikmullina, R., Ahonen, A., & Paetau, R. (2009). Fine tuning the correlation limit of spatio-temporal signal space separation for magnetoencephalography. *Journal of neuroscience methods*, 177(1), 203–211.

- Michimata, C., & Hellige, J. B. (1987). Effects of blurring and stimulus size on the lateralized processing of nonverbal stimuli. *Neuropsychologia*, 25(2), 397–407.
- Mirman, D., & Magnuson, J. S. (2009). Dynamics of activation of semantically similar concepts during spoken word recognition. *Memory & cognition*, 37(7), 1026–1039.
- Monsell, S., Doyle, M. C., & Haggard, P. N. (1989). Effects of frequency on visual word recognition tasks: Where are they? *Journal of Experimental Psychology: General*, 118(1), 43.
- Montani, V., Chanoine, V., Stoianov, I. P., Grainger, J., & Ziegler, J. C. (2019). Steady state visual evoked potentials in reading aloud: Effects of lexicality, frequency and orthographic familiarity. *Brain and Language*, 192, 1–14.
- Morton, J. (1969). Interaction of information in word recognition. *Psychological review*, 76(2), 165.
- Nazir, T. A., Ben-Boutayab, N., Decoppet, N., Deutsch, A., & Frost, R. (2004). Reading habits, perceptual learning, and recognition of printed words. *Brain and language*, 88(3), 294–311.
- Nazir, T. A., & Huckauf, A. (2007). The visual skill "reading". In Single-word reading (pp. 39–56). Psychology Press.
- Nobre, A. C., Allison, T., & McCarthy, G. (1994). Word recognition in the human inferior temporal lobe. *Nature*, 372(6503), 260–263.
- Norcia, A. M., Appelbaum, L. G., Ales, J. M., Cottereau, B. R., & Rossion, B. (2015). The steady-state visual evoked potential in vision research: A review. *Journal of vision*, 15(6), 4–4.
- Norris, D. (2006). The bayesian reader: Explaining word recognition as an optimal bayesian decision process. *Psychological review*, 113(2), 327.
- Obleser, J., Boecker, H., Drzezga, A., Haslinger, B., Hennenlotter, A., Roettinger, M., Eulitz, C., & Rauschecker, J. P. (2006). Vowel sound extraction in anterior superior temporal cortex. *Human brain mapping*, 27(7), 562–571.

- Oostenveld, R., Fries, P., Maris, E., & Schoffelen, J.-M. (2011). Fieldtrip: Open source software for advanced analysis of meg, eeg, and invasive electrophysiological data. *Computational intelligence and neuroscience*, 2011.
- Pammer, K., Hansen, P. C., Kringelbach, M. L., Holliday, I., Barnes, G., Hillebrand, A., Singh, K. D., & Cornelissen, P. L. (2004). Visual word recognition: The first half second. *Neuroimage*, 22(4), 1819–1825.
- Patterson, K., Shewell, C., Coltheart, M., Sartori, G., & Job, R. (1987). Speak and spell: Dissociations and word-class effects. *The Cognitive Neuropsychology of Language. Lawrence Erlbaum Associates, Inc*, 273–294.
- Perea, M., Fernández-López, M., & Marcet, A. (2020). What is the letter é? Scientific Studies of Reading, 24(5), 434–443.
- Perea, M., Gomez, P., & Baciero, A. (2022). Do diacritics entail an early processing cost in the absence of abstract representations? evidence from masked priming in english.
- Pescuma, V. N., Ktori, M., Beyersmann, E., Sowman, P. F., Castles, A., & Crepaldi, D. (2022). Automatic morpheme identification across development:
  Magnetoencephalography (meg) evidence from fast periodic visual stimulation.
  Frontiers in Psychology, 13, 932952.
- Pescuma, V. N., Zanini, C., Crepaldi, D., & Franzon, F. (2021). Form and function: A study on the distribution of the inflectional endings in italian nouns and adjectives. *Frontiers in Psychology*, 12, 4422.
- Pinel, P., & Dehaene, S. (2010). Beyond hemispheric dominance: Brain regions underlying the joint lateralization of language and arithmetic to the left hemisphere. Journal of Cognitive Neuroscience, 22(1), 48–66.
- Preston, K. A. (1935). The speed of word perception and its relation to reading ability. The Journal of General Psychology, 13(1), 199–203.
- Price, C. J. (2012). A review and synthesis of the first 20 years of pet and fmri studies of heard speech, spoken language and reading. *Neuroimage*, 62(2), 816–847.

- Price, C. J., & Devlin, J. T. (2003). The myth of the visual word form area. Neuroimage, 19(3), 473–481.
- Price, C. J., & Devlin, J. T. (2011). The interactive account of ventral occipitotemporal contributions to reading. *Trends in cognitive sciences*, 15(6), 246–253.
- Price, C. J., McCrory, E., Noppeney, U., Mechelli, A., Moore, C., Biggio, N., & Devlin, J. T. (2006). How reading differs from object naming at the neuronal level. *Neuroimage*, 29(2), 643–648.
- Price, C. J., Wise, R., & Frackowiak, R. (1996). Demonstrating the implicit processing of visually presented words and pseudowords. *Cerebral cortex*, 6(1), 62–70.
- Puce, A., Allison, T., Asgari, M., Gore, J. C., & McCarthy, G. (1996). Differential sensitivity of human visual cortex to faces, letterstrings, and textures: A functional magnetic resonance imaging study. *Journal of neuroscience*, 16(16), 5205–5215.
- Quian Quiroga, R., & Kreiman, G. (2010). Measuring sparseness in the brain: Comment on bowers (2009).
- Rajalingham, R., Kar, K., Sanghavi, S., Dehaene, S., & DiCarlo, J. J. (2020). The inferior temporal cortex is a potential cortical precursor of orthographic processing in untrained monkeys. *Nature communications*, 11(1), 1–13.
- Raschle, N. M., Chang, M., & Gaab, N. (2011). Structural brain alterations associated with dyslexia predate reading onset. *Neuroimage*, 57(3), 742–749.
- Rastle, K., & Davis, M. H. (2008). Morphological decomposition based on the analysis of orthography. Language and Cognitive Processes, 23(7-8), 942–971.
- Rastle, K., & Brysbaert, M. (2006). Masked phonological priming effects in english: Are they real? do they matter? *Cognitive Psychology*, 53(2), 97–145.
- Retter, T. L., Jiang, F., Webster, M. A., & Rossion, B. (2018). Dissociable effects of inter-stimulus interval and presentation duration on rapid face categorization. *Vision research*, 145, 11–20.
- Riesenhuber, M., & Poggio, T. (1999). Hierarchical models of object recognition in cortex. Nature neuroscience, 2(11), 1019–1025.

- Rolls, E. T. (2001). Functions of the primate temporal lobe cortical visual areas in invariant visual object and face recognition. Vision: The Approach of Biophysics and Neurosciences, 366–395.
- Rossion, B. (2014). Understanding individual face discrimination by means of fast periodic visual stimulation. *Experimental Brain Research*, 232(6), 1599–1621.
- Rouder, J. N., Speckman, P. L., Sun, D., Morey, R. D., & Iverson, G. (2009). Bayesian t tests for accepting and rejecting the null hypothesis. *Psychonomic bulletin & review*, 16(2), 225–237.
- Roy, A. (2012). A theory of the brain: Localist representation is used widely in the brain. Frontiers in psychology, 3, 551.
- Rudell, A. P., & Hu, B. (2000). Behavioral and brain wave evidence for automatic processing of orthographically regular letter strings. *Brain and language*, 75(2), 137–152.
- Sergent, J., & Hellige, J. B. (1986). Role of input factors in visual-field asymmetries. Brain and Cognition, 5(2), 174–199.
- Sliwinska, M. W., James, A., & Devlin, J. T. (2015). Inferior parietal lobule contributions to visual word recognition. *Journal of Cognitive Neuroscience*, 27(3), 593–604.
- Stothart, G., Quadflieg, S., & Milton, A. (2017). A fast and implicit measure of semantic categorisation using steady state visual evoked potentials. *Neuropsychologia*, 102, 11–18.
- Sulpizio, S., Arcara, G., Lago, S., Marelli, M., & Amenta, S. (2022). Very early and late form-to-meaning computations during visual word recognition as revealed by electrophysiology. *Cortex*, 157, 167–193.
- Tadel, F., Baillet, S., Mosher, J. C., Pantazis, D., & Leahy, R. M. (2011). Brainstorm: A user-friendly application for meg/eeg analysis. *Computational intelligence and neuroscience*, 2011.
- Taft, M. (1979). Recognition of affixed words and the word frequency effect. Memory & Cognition, 7(4), 263–272.

- Taft, M. (2004). Morphological decomposition and the reverse base frequency effect. The Quarterly Journal of Experimental Psychology Section A, 57(4), 745–765.
- Taft, M., & Nguyen-Hoan, M. (2010). A sticky stick? the locus of morphological representation in the lexicon. Language and Cognitive Processes, 25(2), 277–296.
- Taulu, S., & Hari, R. (2009). Removal of magnetoencephalographic artifacts with temporal signal-space separation: Demonstration with single-trial auditory-evoked responses. *Human brain mapping*, 30(5), 1524–1534.
- Taulu, S., & Simola, J. (2006). Spatiotemporal signal space separation method for rejecting nearby interference in meg measurements. *Physics in Medicine & Biology*, 51(7), 1759.
- Taylor, J., Rastle, K., & Davis, M. H. (2013). Can cognitive models explain brain activation during word and pseudoword reading? a meta-analysis of 36 neuroimaging studies. *Psychological bulletin*, 139(4), 766.
- Thesen, T., McDonald, C. R., Carlson, C., Doyle, W., Cash, S., Sherfey, J., Felsovalyi, O., Girard, H., Barr, W., Devinsky, O., et al. (2012). Sequential then interactive processing of letters and words in the left fusiform gyrus. *Nature communications*, 3(1), 1–8.
- Turkeltaub, P. E., Gareau, L., Flowers, D. L., Zeffiro, T. A., & Eden, G. F. (2003). Development of neural mechanisms for reading. *Nature neuroscience*, 6(7), 767–773.
- Uppenkamp, S., Johnsrude, I. S., Norris, D., Marslen-Wilson, W., & Patterson, R. D. (2006). Locating the initial stages of speech–sound processing in human temporal cortex. *Neuroimage*, 31(3), 1284–1296.
- van de Walle de Ghelcke, A., Rossion, B., Schiltz, C., & Lochy, A. (2020). Impact of learning to read in a mixed approach on neural tuning to words in beginning readers. *Frontiers in psychology*, 10, 3043.
- Van Paridon, J., Ostarek, M., Arunkumar, M., & Huettig, F. (2021). Does neuronal recycling result in destructive competition? the influence of learning to read on the recognition of faces. *Psychological Science*, 32(3), 459–465.

- Vankov, I. I., & Bowers, J. S. (2017). Do arbitrary input–output mappings in parallel distributed processing networks require localist coding? Language, Cognition and Neuroscience, 32(3), 392–399.
- Verleger, R., Dittmer, M., & Śmigasiewicz, K. (2013). Cooperation or competition of the two hemispheres in processing characters presented at vertical midline. *PloS* one, 8(2), e57421.
- Verleger, R., Śmigasiewicz, K., & Möller, F. (2011). Mechanisms underlying the left visual-field advantage in the dual stream rsvp task: Evidence from n2pc, p3, and distractor-evoked veps. *Psychophysiology*, 48(8), 1096–1106.
- Vidal, C., & Chetail, F. (2017). Bacs: The brussels artificial character sets for studies in cognitive psychology and neuroscience. *Behavior Research Methods*, 49(6), 2093–2112.
- Vidal, Y., Viviani, E., Zoccolan, D., & Crepaldi, D. (2021). A general-purpose mechanism of visual feature association in visual word identification and beyond. *Current Biology*, 31(6), 1261–1267.
- Vigliocco, G., Warren, J., Siri, S., Arciuli, J., Scott, S., & Wise, R. (2006). The role of semantics and grammatical class in the neural representation of words. *Cerebral Cortex*, 16(12), 1790–1796.
- Vignali, L., Xu, Y., Turini, J., Collignon, O., Crepaldi, D., & Bottini, R. (2023). Spatiotemporal dynamics of abstract and concrete semantic representations. *Brain and Language*, 243, 105298.
- Vinckier, F., Dehaene, S., Jobert, A., Dubus, J. P., Sigman, M., & Cohen, L. (2007). Hierarchical coding of letter strings in the ventral stream: Dissecting the inner organization of the visual word-form system. *Neuron*, 55(1), 143–156.
- Wandell, B. A. (2011). The neurobiological basis of seeing words. Annals of the New York Academy of Sciences, 1224(1), 63–80.
- Wang, F., Kaneshiro, B., Strauber, C. B., Hasak, L., Nguyen, Q. T. H., Yakovleva, A., Vildavski, V. Y., Norcia, A. M., & McCandliss, B. D. (2021). Distinct neural

sources underlying visual word form processing as revealed by steady state visual evoked potentials (ssvep). *Scientific reports*, 11(1), 1–15.

- Warrington, E. K., & Shallice, T. (1980). Word-form dyslexia. Brain: a journal of neurology, 103(1), 99–112.
- Weiss, Y., Katzir, T., & Bitan, T. (2015). Many ways to read your vowels—neural processing of diacritics and vowel letters in hebrew. *NeuroImage*, 121, 10–19.
- Wernicke, C. (1874). Der aphasische symptomencomplex: Eine psychologische studie auf anatomischer basis. Cohn & Weigert.
- Wimmer, H., Ludersdorfer, P., Richlan, F., & Kronbichler, M. (2016). Visual experience shapes orthographic representations in the visual word form area. *Psychological Science*, 27(9), 1240–1248.
- Wydell, T. N., Vuorinen, T., Helenius, P., & Salmelin, R. (2003). Neural correlates of letter-string length and lexicality during reading in a regular orthography. *Journal of Cognitive Neuroscience*, 15(7), 1052–1062.
- Xu, J., & Taft, M. (2014). Solely soles: Inter-lemma competition in inflected word recognition. Journal of Memory and Language, 76, 127–140.
- Zanini, C., Rugani, R., Giomo, D., Peressotti, F., & Franzon, F. (2020). Effects of animacy on the processing of morphological number: A cognitive inheritance? Word Structure, 13(1), 22–44.

# ENTRAINMENT TO LINGUISTIC REGULARITIES

ROI	t value	Effect size $g$	$\Pr(>\mid t\mid)$	
Left Fusiform	1059.21	1.57 [1.36, 1.77]	< 0.001	***
Right Fusiform	956.08	$1.91 \ [1.69, \ 2.12]$	< 0.001	***
Left Inferiorparietal	1060.81	$1.35 \ [1.18, \ 1.52]$	< 0.001	***
Right Inferiorparietal	1315.81	$1.37 \ [1.22, \ 1.52]$	< 0.001	***
Left Inferotemporal	903.83	$1.29 \ [1.10, \ 1.48]$	< 0.001	***
Right Inferotemporal	1052.57	$1.57 \ [1.38, \ 1.75]$	< 0.001	***
Left Lateral Occipital	1609.02	$1.48 \ [1.32,  1.65]$	< 0.001	***
Right Lateral Occipital	1313.58	$1.62 \ [1.45, \ 1.79]$	< 0.001	***
Left Lingual	921.25	$1.59 \ [1.37,  1.80]$	< 0.001	***
Right Lingual	729.36	$1.70 \ [1.47, \ 1.92]$	< 0.001	***
Left Middle temporal	603.84	$1.03 \ [0.82, \ 1.25]$	< 0.001	***
Right Middle temporal	1141.24	$1.38 \ [1.20, \ 1.55]$	< 0.001	***

### Table 1

Alphabetic Response (PF-NW vs. NW-NW), Source Level Results

# ENTRAINMENT TO LINGUISTIC REGULARITIES

ROI	Number of Vertices	$\mathrm{BF_{10}{<}1/3}$	$BF_{10}{>}3$
Left Fusiform	268	156~(58%)	0
Right Fusiform	255	186 (72%)	0
Left Inferior parietal	351	70 (19%)	39~(11%)
Right Inferiorparietal	421	219~(52%)	20 (5%)
Left Inferotemporal	307	155~(50%)	0
Right Inferotemporal	316	213~(67%)	9~(3%)
Left Lateral Occipital	371	207~(55%)	4 (1%)
Right Lateral Occipital	367	251~(68%)	0
Left Lingual	246	154~(62%)	0
Right Lingual	227	186 (82%)	0
Left Middle temporal	277	191 (69%)	9~(3%)
Right Middle temporal	324	205~(63%)	19~(6%)

### Table 2

Suff-HFE vs. Suff-Suff contrast, Source Level Bayes Factor Analysis. For each ROI, the table reports the total number of vertices, the ones providing moderate evidence in favor of the Null hypothesis (i.e., with  $BF_{10} < 1/3$ ) and those moderately supporting the alternative (i.e., with  $BF_{10} > 3$ ).



#### Figure 1

Experimental Paradigm. All stimuli were presented by sinusoidal contrast modulation; the figure displays four cycles of 166.66 ms. In the experimental trials (panel A) stimuli from two classes were alternated, to isolate neural responses selective to discriminative properties (e.g., letter strings and pseudo-characters differ solely on the basis of their alphabetic nature). Examples are given for the five different properties of interest: alphabetic (Nonwords, NW, vs. Pseudofonts, PF), readability (Pseudoendings, PE, vs. Nonwords, NW), familiarity (High frequency endings, HFE, vs. Pseudoendings, PE), meaningfulness (High frequency endings, HFE, vs. Suffixes, Suff), and lexicality (Words, W, vs. Suffixes, Suff). The control trials (panel B) comprised items belonging to the same category (e.g., a single stream of letter strings), and served as a baseline condition for the discriminative nature of the neural responses yielded by the experimental trials. Particularly, the difference between the 3Hz response in experimental and baseline trials would represent a genuine discrimination between items belonging to two different experimental categories, thus reflecting the feature under study.





Grand-averaged, whole-brain baseline-corrected amplitude (V) spectra for the different conditions across sensor types. Critically, the profiles indicate that the response is confined to the frequencies of interest (3 and 6 Hz).



### Figure 3

Sensor level results. One significant, largely diffused cluster indicated the discrimination of alphabetic stimuli, while a left-lateralized significant cluster was associated with lexical discrimination. The topography of the effects is comparable across planar gradiometers (panel A) and magnetometers (panel B) for both discrimination responses.





Source level results. Significant discrimination responses (p<0.05) for the five linguistic properties under study (from the top: (A) Alphabetic, (B) Readability, (C) Familiarity, (D) Meaningfulness, (E) Lexicality), displayed (from left to right) with left, right, ventral and posterior views.