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Abstract 1

Keywords: Dyslexia, Executive functions, Visual attention, Intervention, fMRI, 23 Functional Connectivity. 24

Introduction 1

Dyslexia: definition and explanatory theories 2

Developmental dyslexia (henceforth, dyslexia) is classified as one type of 3 specific learning disorder, with different studies reporting a prevalence 4 between 5 and 20% (Schulte-Körne 2010, Norton, Black et al. 2014, Wagner, 5 Zirps et al. 2020). This disability is a heritable, life-long condition with early 6 onset (Snowling, Hulme et al. 2020). Dyslexia is described as a difficulty in $\overline{7}$ accurate and fluent word recognition and spelling (Peterson and Pennington as 2012) that cannot be explained by sensorial deficits, insufficient literature 9 exposure, delayed development of cognitive abilities or low intelligence 10 (Schulte-Körne 2010). 11

For the last several decades, the scientific consensus regards dyslexia as a 12 language disorder in which, for alphabetic-based written language, the 13 proximate cause is a phonological processing deficit (Peterson and 14 Pennington, 2012, p. 3). A close relationship exists between children's 15 phonological skills (i.e. phonological awareness) and the mastering of word 16 reading (Melby-Lervag, Lyster et al. 2012). According to the mentioned 17 theory, children with reading difficulties manifest a neural processing deficit in 18 the representation of the sounds in language. More recently, the role of 19 Executive Functions (EFs) in dyslexia has been highlighted (Horowitz-Kraus 20 2012, Varvara, Varuzza et al. 2014). EFs are a set of higher-order cognitive 21 abilities (inhibition, switching, updating, see (Miyake 2000)) that allow 22 individuals to adapt and overcome different challenging environmental 23 conditions (Welsh, Pennington et al. 1991, Diamond 2020). Recent studies 24

have highlighted the critical role EFs have in intact and impaired reading as 1 supporting all three components of the Simple View of Reading model (SVR): 2 word decoding (Kieffer and Christodoulou 2020, Nguyen, Del Tufo et al. 3 2020), comprehension (Washburn 2022) and critically, reading fluency – 4 defined as fast and accurate reading (Silverman, Speece et al. 2013). The 5 three main EFs (inhibition, switching, updating (Miyake 2012)) seem to have a 66 direct effect on reading fluency (Kieffer and Christodoulou 2020, Nguyen, Del 7 Tufo et al. 2020). 8

Children with dyslexia show dysfunctions in both verbal and visuo-spatial 9 working memory, switching, and in the inhibition of irrelevant information 10 (Booth, Boyle et al. 2010, Horowitz-Kraus 2012, Varvara, Varuzza et al. 2014, 11 Barbosa, Rodrigues et al. 2019). Furthermore, children with dyslexia display 12 below-average performance in speed of processing (Booth, Boyle et al. 2010), 13 which raised a theory regarding a slow speed of processing and a lack of 14 synchronization between visual and auditory sensory modalities in these 15 readers (Breznitz 2003, Breznitz 2006). Lastly, visuo-spatial attention 16 difficulties were also reported (Franceschini, Gori et al. 2012, Varvara, 17 Varuzza et al. 2014). These different theories aiming to explain the source of 18 reading difficulties in dyslexia emphasize the complexity of the reading 19 process, as outlined in the SVR (Hoover and Gough 1990) and its refined 20 extensions (Catts 2018, Spencer, Richmond et al. 2020). 21

Dyslexia presents thus, a multifaceted nature with tight ontogenetic relation 22 between the underlying neural systems (Dehaene 2009), and variabilility 23 related to the different types of orthographies (Siok, Jia et al. 2020). 24

cognitive networks comprising the attention system are affected in dyslexia: 20 the cingulo-opercular (CO), fronto-parietal (FP), ventral and dorsal attention 21 networks (VAN, and DAN respectively) (Corbetta and Shulman 2002, 22 Freedman, Zivan et al. 2020, Farah, Ionta et al. 2021, Taran, Farah et al. 23 2021). The FP network seems to predispose to switching and goal–directed 24 behavior, while the CO is related to error monitoring and feedback control 25

(Dosenbach, Fair et al. 2007, Gratton, Sun et al. 2018). The VAN and DAN 1 are mainly involved in visuo-spatial attention, in both bottom-up and top-down 2 processes (see Figure 1) (Corbetta and Shulman 2002, Szczepanski and 3 Kastner 2013, Liu, Bengson et al. 2016). We have previously suggested that 4 artificially accelerated reading vs reading at a natural reading speed in 5 English-speaking 8-12 years old children with dyslexia is associated with 6 increased synchronization between the CO-FP networks and visual-auditory $\overline{7}$ networks (Horowitz-Kraus 2022). These results echoed findings from Hebrew-
8 speaking adults showing that during natural reading speed, there is a reduced 9 synchronization between ERPs associated with visual and auditory 10 processing, which was also associated with reduced speed of processing 11 during word reading, supporting the asynchronization theory (Breznitz 2003, 12 Breznitz 2006). These findings support the neural noise hypothesis in children 13 with dyslexia as an explanation for their slow reading speed (Hancock 2017), 14 but also open up possibilities for reading improvements, especially in the 15 fluency domain, to reduce this "noise". The matrix of the same state of the sta

Crucially, the VWFA displays specific patterns of connectivity with the angular 17 gyrus and the IFG, making it a candidate to be one of the links between 18 linguistic (temporal language network) and attentional circuitry (FP) (Stevens, 19 Kravitz et al. 2017, Chen, Wassermann et al. 2019, López-Barroso, Thiebaut 20 de Schotten et al. 2020). This region is functionally connected to the DAN and 21 is highly involved in general visual processing (Vogel, Miezin et al. 2011). 22 Furthermore, the angular gyrus and the IFG seem to play a role in language 23 processing and reading as integrative, multimodal hubs, i.e., recruiting and 24 synchronizing large-scale whole-brain networks (Rosselli, Ardila et al. 2015, 25

De Losa et al. 2019, Stein 2019, Vidyasagar 2019). Furthermore, novel 1 perspectives on reading instruction and remediation highlight the importance 2 of improving sublexical skills and general aspects of language and knowledge 3 in combination with phonological training (Fletcher, Savage et al. 2021). 4

In the past years, several studies have demonstrated the effect of an EFs- 5 based reading intervention targeting working memory, inhibition, visuo-spatial 6 attention, and speed of processing while exposed to written materials (i.e. $\frac{1}{7}$ sentences) (Breznitz, Shaul et al. 2013, Horowitz-Kraus 2013, Horowitz-Kraus 8 2014, Horowitz-Kraus 2014, Horowitz-Kraus and Breznitz 2014, Horowitz- 9 Kraus 2015, Horowitz-Kraus, DiFrancesco et al. 2015, Horowitz-Kraus 2015b, 10 Horowitz-Kraus 2015c, Cecil, Brunst et al. 2021) on reading, EFs, and brain 11 structure and function. This training program forces the reader to visually 12 follow the letters (engaging visual attention) as they are erased from the 13 screen (reliance on working memory) and replaced by asterisks at a gradually 14 increasing speed (speed of processing) without the ability to regress to the 15 beginning of the sentence (inhibition) (Breznitz 1992, Cecil, Brunst et al. 16 2021). This training was found to improve reading rate, accuracy and reading 17 comprehension (Horowitz-Kraus, Vannest et al. 2014, Peters, De Losa et al. 18 2019), as well as working memory, switching, shifting, visual attention, and 19 speed of processing (Horowitz-Kraus 2014, Horowitz-Kraus, Cicchino et al. 20 2014, Horowitz-Kraus, Hershey et al. 2019, Peters, De Losa et al. 2019). On 21 the neurobiological level, this training was found to increase the connectivity 22 strength between EFs, attention and sensory networks (visual processing and 23 auditory networks) during word reading tasks (Horowitz-Kraus, DiFrancesco 24 et al. 2015, Horowitz-Kraus and Holland 2015, Horowitz-Kraus, Hershey et al. 25

2019), increase the within-network connectivity of the CO network during rest 1 (Horowitz-Kraus, Toro-Serey et al. 2015), increase the magnitude of error- 2 detection ERPs during word reading errors (Horowitz-Kraus 2016), and was 3 associated with lower GLX/Glu concentration in the anterior cingulate cortex 4 (Cecil, Brunst et al. 2021). It was suggested that the speeded deletion of 5 letters from the screen (artificially inducing fluent reading), engages EFs and 6 attention neural-circuits and hence reduces the asynchrony/neural noise in 7 the visual-auditory circuits (Cecil, Brunst et al. 2021). However, the effect of 8 this EFs-based reading intervention both behaviorally and neurobiologically 9 compared to active control training, is yet to be resolved. More specifically, 10 the effect of this EFs-based reading training on brain network connectivity 11 during a reading fluency task against an active control group remains 12 unknown. 13

Aims and hypotheses 14

The goal of the present study was to determine the neurobiological systems 15 underlying the reading improvement following EFs-based reading intervention 16 while performing a contextual reading fluency task. In the same vein, we 17 aimed to measure the effects of the hypothesized neuroplastic changes on 18 specific cognitive domains. To this end, functional MRI was acquired while 19 children with dyslexia and typically reading children performed a contextual 20 reading fluency task before and after the intervention. The experimental 21 design included an active control group that trained using the math program. 22 Children with and without dyslexia were included in the experiment, given that 23 the goal of the study was to explore the behavioral and neurobiological effect 24

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of the EFs-based reading training on both TR and children with dyslexia. 1 Specifically, it was hypothesized that children with dyslexia would benefit 2 more from the intervention both in terms of behavioral measures (visual 3 attention, EFs, reading) and neurobiological changes, ultimately leading to a 4 reduction in cognititve and functional connectivity disparities between the two 5 groups. 6

We expected both TRs and children with dyslexia who underwent the EFs- 7 based reading intervention to improve their contextual reading fluency, EFs, \qquad 8 and attention abilities compared to those undergoing the control intervention. 9 Neurobiologically, we hypothesized that higher functional connectivity in both 10 typical readers (TR) and children with dyslexia would be found between EFs 11 networks (FP, CO), attention networks (VAN, DAN), and sensory networks 12 (visual, auditory) after the EFs-based reading intervention, relative to the 13 improvement with math training. Additionally, children with dyslexia when 14 compared with typical readers were expected to display greater changes both 15 in functional connectivity (stronger connections) and behavioral performance 16 (higher scores). 17

Methods 18

Study Procedure 19

The studies were conducted at Cincinnati Children's Hospital Medical Center, 20 Ohio, USA. The experimental procedure was designed in accordance with the 21 Declaration of Helsinki, it was reviewed and approved by the institutional 22 review board. Participants' parents signed informed consent before enrolling 23 to the study. Children were compensated for their participation in the study 24

Reading abilities 3

Reading abilities in both TR and children with dyslexia were evaluated using a 4 battery of normative English tests: orthographic processing: Test of Word 5 Reading Efficiency (TOWRE-Sight Word Efficiency) (Torgesen, Wagner et al. 6 1999), phonological processing: Comprehensive Test of Phonological 7 Processing (CTOPP) (Wagner, Torgesen et al. 2013), reading accuracy 8 (number of correctly read words), reading rate (reading speed) and 9 comprehension -Gray Oral Reading Test (GORT) for reading rate, accuracy, 10 and comprehension (Wiederholt and Bryant 2012) and Test of Silent Reading 11 Efficiency and Comprehension (TOSREC) for reading comprehension 12 (Schrank, Mather et al. 2014). Orthographic and phonological processing 13 were measured using isolated word/non-word reading. Reading accuracy, 14 rate were measured in contextual reading. The state of the

Executive functions and attention abilities 16

Executive functions were assessed using several tasks designed to address 17 the three main EFs: 1) Working memory was assessed using both forward 18 and backward digit recall as implemented in the Digits span subtest of the 19 Wechsler Intelligence Scale for Children (WISC-IV) (Wechsler 2011); 2) 20 switching: using the letter-number sequencing subtest from the Trail Making 21 Test from the Delis – Kaplan Executive Function System (DKEFS) (Delis 22 2011); and 3) inhibition: using the Color-word subtest (condition 3) of the 23

compatible audiovisual system (Avotec, SS3150/SS7100). 24

Neuroimaging task 1

The written stories were between 200 and 250 characters in length. The fMRI 17 experiment was divided into 15 blocks (5 Still stories, 5 Deleted stories and 5 18 control blocks). The length of each block was 52 seconds: 44 seconds for the 19 story, 6 seconds for reading and answering the question and a 2 second-long 20 Inter Stimulus Interval (ISI) during which a fixation cross was presented in the 21 center of the screen. The control condition consisted in a fixation cross 22 presented in the center of the screen for 52 seconds. There were two different 23 sets of stories, one for the pre-intervention fMRI session and another one for 24 the post-intervention fMRI session. The text passages presented in the pre- 25

participant finished reading the sentences, they were instructed to push the 1 space bar which prompted a multiple-choice comprehension question. Automated calculation of reading speed was performed by dividing the 3 reading time of each text passage by the number of characters in that specific 4 fragment of text. It is important to note that only the passages for which 5 participants answered the reading comprehension questions correctly were $\qquad 6$ included in this calculation. Once the reading pace was established, the $\frac{7}{10}$ training phase started with a series of text passages that were being erased 8 from the screen at that individual's reading speed. The training phase 9 consisted in reading short sentences (~100 characters) and answering a 10 multiple-choice reading comprehension question presented immediately after 11 each sentence. The characters within the sentence were being deleted from 12 the screen and replaced by asterisks starting from the first letter at a gradually 13 increasing pace; the erasure rate would increase only when the participant's 14 answer to the reading comprehension question was correct on 10 consecutive 15 trials (Cecil, Brunst et al. 2021). 16

Math training (control group) 17

Math training was administered using an online math tool customized for each 18 participant's grade level. The training encompassed various topics for third to 19 sixth-grade participants, including number properties, operations, and more. 20 Third-grade training covered number sense, addition, subtraction, 21 multiplication, division, properties, mixed operations, fractions, geometry, 22 data, and measurement. Fourth-grade training incorporated all of the previous 23 topics, along with decimals and operations on fractions. Fifth-grade training 24 included all previous topics, as well as exponents, powers of 10, data, 25

hemodynamic response functions (HRFs) were generated to align with the 20 distinct blocks comprising the experimental design. These functions were 21 incorporated in the denoising and first-level analysis stages as implemented in 22 CONN version 20b (Whitfield-Gabrieli and Nieto-Castanon 2012) for the 23 calculation of task-residual functional connectivity between the chosen seed 24 regions and the rest of voxels in the brain (Tran, McGregor et al. 2018). A 25

The validity of the relations between neurobiological variables and behavioral 17 traits drawn by brain-wide association studies (BWAS) has been questioned 18 in a recent benchmarking paper (Marek, Tervo-Clemmens et al. 2022). Even 19 though the present paper cannot be considered a BWAS, it does report of 20 univariate brain-behavior associations, the reliability of which seems to be 21 lower than was initially thought (Marek, Tervo-Clemmens et al. 2022). Here, a 22 control permutation analysis was performed to increase the validity of the 23 reported results: the sample (79 pre-post fMRI datasets) was randomly 24 divided into four sub-groups (resembling the four experimental groups in the 25

original 2 x 2 –group x condition– design) before seed-to-voxel analysis using 1 the DAN as a seed. The 79 participants were divided into four groups using 2 the *rand* MATLAB command. Marek and colleagues (2022), conclude that a 3 random division of the subjects into different subgroups could induce spurious 4 results that can contradict the actual obtained results. Here, null results were 5 expected when comparing the randomized groups. $\frac{1}{2}$ 6

Correlation between neuroimaging and behavioral data 7

In order to evaluate the strength of the linear relationship between cognitive 8 test results and functional connectivity values, correlative analyses were 9 conducted. Functional connectivity values between different brain regions in 10 which increases in connectivity strength were dected were tested as 11 predictors of cognitive performance. This was calculated: first, for the group in 12 which the increase was detected and second, for the whole sample. Linear 13 correlation was examined using Pearson's *r* correlation coefficient. Spurious 14 significance resulting from multiple comparisons was controlled using 15 Bonferroni's correction. 16

Structural equation modelling-based moderation analyses were conducted as 17 well. Specifically, the areas showing enhanced synchronization after the 18 reading training in the neuroimaging analysis were tested as moderators of 19 the improvement in reading performance.

Results 22

Reading and verbal abilities 24

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Baseline behavioral measures (pre-test) 23

The effect of the intervention on behavioral measures (pre-test vs post-test) 2

Reading abilities 3

Whole group analysis: ANOVA analysis of the pre-test and post-test scores 4 showed a significant main effect of Time for contextual reading rate 5 $(F(1, 78)=5.64, p<.05, \eta_{p}^{2}=.07$, see Table 2), suggesting overall improvement 6 in reading rate between the pre-test and post-test for all participants. No 7 significant main effect of training was observed. Furthermore, the analysis 8 revealed a significant Time x Training interaction for all participants 9 $(F(1, 78)=4.88, p<.05, \eta_p^2=06)$. This result suggests that children undergoing 10

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undergoing math training, as revealed by a significant ANOVA interaction 24

intervention group that the belonged to (as revelaed by a significant ANOVA 1 main effect of Time, see Table 2). 2

ANOVA analysis of visual attention scores revealed that the interaction term 3 (Time \times Training) was significant for children with dyslexia (F(1,34)=5.127, 4 p <.05, η_p^2 =.14), suggesting larger improvements in visual attention scores 5 after the EFs-based reading intervention when compared to the active control 6 math intervention. The observed effect size for children with dyslexia was 7 large (partial eta squared equaled .14, Cohen's *d* was equal to .46). 8 Typical readers: The subgroup of children without a diagnosis of dyslexia 9 displayed significant increases in working memory performance, as revealed 10 by a significant ANOVA main effect of Time $(F(1,40)=5.72, p<.05, \eta_{p}^{2}=.13$. 11 Noteworthy, all participants displayed this improvement, regardless of the 12 received treatment. Improvements in inhibition and speed of processing were 13 apparent as well, as revealed by significant main effects of Time $(F(1,41)=9.3, 14)$ *p*<.01, η_p²= 18 and F(1,41)=10.64, *p*<.01, η_p²= 21, respectively). 15

Table 2. The effect of the intervention on reading and cognitive abilities. Cohen's f 16 measure of effect size is reported for the significant Time x Training interactions 17

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Fluency fMRI task 1

Baseline (pre-test) 2

Accuracy: TR outperformed children with dyslexia in both Still and Deleted 3 conditions (see Table 3). The number of correct responses was statistically 4 lower in children with dyslexia when compared to TR in both conditions. There 5 were no significant differences between the children who later underwent 6 EFs-based reading training and those in the math group (p>.05). 7

Reaction time: TR showed shorter response times when compared to children 9 with dyslexia in both conditions (see Table 3). No significant differences were 10 found between the intervention groups (EFs-based reading intervention vs 11 math intervention) in the baseline reaction time (p>.05). 12

Table 3. Baseline performance in the fluency task; significant differences between 13 children with dyslexia and TR. 14

		Children with dyslexia	Typical Readers	Student's <i>t</i> (p-value) Cohen's d		
Still	Correct	3.710 ± 1.29	4.27 ± 1.11	$2.06, .02*$ Cohen's $d = 0.47$		
	Response Time	4136 ± 1020	3580 ± 961	$2.47, .008*$ Cohen's $d = 56$		
Deleted	Correct	$4.05 \pm .97$	$4.79 \pm .67$	$3.93, < .001***$ Cohen's $d = 89$		
	Response Time	4107 ± 856	3422 ± 859	$3.5, < .001***$ Cohen's $d = 79$		

Independent samples *t*-tests indicate significant differences between TR and children 16 with dyslexia in the task. *p<.05, **p<.01, ***p<.001. Cohen's *d* measure of effect 17 size is reported. The same state of the state of the

Pre-intervention vs post-intervention 20

Accuracy: No significant differences in accuracy were found in any of the four 21

subgroups. Two by two (2 x 2) repeated measures ANOVA – Time (pre- 22

Table 4. Pre-post differences in Fluency task performance. 22

Typical readers	EFs-based reading intervention	$3553 \pm$ 1097 (A)	4.09 \pm 1.37	3330 ± 1014	$4.7 \pm .9$	$4147 +$ 1012(B)	$3.95 \pm$ 1.09	$3236 \pm$ 845	$4.7 \pm$.47	B>A	$3.15***$ Cohen's $d = 71$
	Math intervention	$3606 \pm$ 836 (C)	4.45 \pm .8	$3510 +$ 693	$4.86 \pm$.35	4055 ± 693 (D)	$3.95 \pm$ 1.14	$3296 \pm$ 981	$4.6 \pm$.94	D > C	$2.5*$ Cohen's $d = 55$
Children with dyslexia	EFs-based reading intervention	$4267 \pm$ 1019(E)	$3.47 \pm$ 1.42	$4204 +$ 721	$4.1 \pm .9$	$4833 \pm$ 965 (F)	3 ± 1	3936 ± 953	$4.6 \pm$.91	F > E	$2.47*$ Cohen's $d = .63$
	Math intervention	$3980 \pm$ 1032	4 ± 1.1	$3703 \pm$ 971	$4 \pm .96$	$4423 +$ 1239	$3.33 \pm$ 1.15	$3703 \pm$ 971	$4.58 \pm$.9		

Paired *t*-tests indicate higher response times in the fluency task after the EFs-based 2 reading intervention. *p<.05, **p<.01, ***p<.001. Cohen's *d* measure of effect size is 3 reported. And the contract of the contract of

No significant results were found when analyzing the FP network, neither in 1 the Still nor the Deleted conditions.

Table 5. Seed-to-voxel results. 4

Statistical threshold; cluster-level p-FDR corrected <.05, voxel-level uncorrected 7 *p*<.001. Significant increases in functional connectivity were found in the CO and the 8 DAN after the EFs-based reading intervention, but not the math intervention (active 9 control group). 10

[Insert Figure 4 here] 12

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When exploring the behavioral correlates of the increased functional 10 connectivity between the CO, the right cuneus, and the right lingual gyrus 11 during the Deleted condition in children with dyslexia, a positive correlation 12 was found with two cognitive variables: speed of processing ($r = .27$, R²=.073, 13 p <0.05), and visual attention (r =.31, R²=.095, p <0.05, Figure 8). The increase 14 in functional connectivity between the CO and the mentioned occipital regions 15 was not a statistical predictor of the change in reading fluency in children with 16 dyslexia (beta = .156, se=.13, t(3)=1.3, p=.21). No significant correlations 17 were found between the CO-right occipital cortex functional connectivity and 18 behavioral measures in the TR group. The state of the TR group. [Insert Figure 6 here] 20 **Figure 6. Correlation between the neuroimaging and behavioral results** 21 **in Typical Readers.** Higher synchronization between the DAN and the left 22 IFG was related to increased performance in working memory and speed of 23 processing. 24

[Insert Figure 7 here] 25

Discussion 11

Here, the specific effect of an EFs-based reading intervention vs a control 12 math training were examined on the behavioral level and the neural correlates 13 associated with EFs, visual attention, and reading in 8-12 years old children 14 with dyslexia and TR. In line with our hypotheses, we found significant 15 improvements after the EFs-based reading intervention in reading rate and 16 visual attention. However, we could not find a specific effect of the EFs-based 17 reading intervention on relevant EFs (working memory, switching, inhibition), 18 when comparing it to math training. On the neurobiological level, we found 19 two different mechanisms related to the EFs-based reading intervention; in 20 TR, higher connectivity was observed between the DAN and the left IFG. 21 Children with dyslexia displayed an increase in integration between a 22 cognitive control network (CO) and visual processing related-areas. In both 23

Improvements in reading and visual attention after the EFs-based reading 4 *intervention* 5

At the baseline, children with dyslexia displayed deficits in visual attention, 6 executive functions, phonological processing, word reading, and contextual $\frac{7}{10}$ reading when compared to TR. These impairments were not explained by 8 reduced scores in standardized intelligence tests. The standard scores in standard and standard standard stand

After the EFs-based reading intervention (compared to math intervention), 10 improvements in children with dyslexia were apparent in both contextual 11 reading rate and visual attention. Higher scores were observed as well in the 12 TR group after the EFs-based reading intervention, but only in contextual 13 reading rate (when compared to those undergoing math training). These 14 results suggest that the EFs-based reading intervention effectively improves 15 the reading skills and visual attention abilities of children with dyslexia. 16 However, it was not possible to find a specific effect of the EFs-based reading 17 intervention on EFs when comparing it to math intervention. Mathematical 18 training, and arguably any kind of complex cognitive training, may involve one 19 or more EFs given that these skills are the very basic psychological abilities 20 underlying complex behavioral tasks –those that result from the combination 21 of more basic mental processes (American Psychiatric Association 2007). 22 Mathematical reasoning, long-term planning, writing, or reading are some 23 examples of these complex behavioral tasks that rely on the harmonic 24

functioning of fundamental cognitive processes, many of which fall within the 1 umbrella term *Executive Functions*. 2

The improvement in visual attention abilities after the EFs-based reading 3 intervention in children with dyslexia confirms two of our assumptions. First, $\frac{4}{4}$ the EFs-based reading intervention triggers not only EFs but also basic 5 features of visual processing (Horowitz-Kraus, Vannest et al. 2014). Second, 6 the training of visual attention abilities may be of high relevance in children $\frac{7}{10}$ with dyslexia and could lead to improvements in reading (Vidyasagar 2019). $\qquad 8$

This manuscript presents evidence of improvements in visual attention and 9 reading rate following an EFs-based reading intervention. Visual attention 10 and EFs were found to be correlated with the intervention-related change in 11 functional connectivity (in children with dyslexia). However, no causal 12 relations were found between improvements in visual attention or EFs and 13 improvements in reading ability. As aforementioned, the math intervention 14 may have also targeted basic cognitive abilities within the EFs and visual 15 attention domains as well as the EFs-based reading intervention, which could 16 be the reason that prevented determining more specific effects of the EFs- 17 based intervention. Another limitation was the use of a single visual attention 18 measure (visual search or selective visual attention). The utilization of 19 different visual attention tasks with a closer relation to decoding may result in 20 the determination of better associations between improvement in visual 21 attention and reading performance. Future intervention studies, including a 22 waiting list (passive) control group might be able to draw robust links 23 between the training of EFs and visual attention and improvements in 24

reading. Alternatively, the investigation of non-linguistic cognitive training 1 aimed at improving EFs and/or visual attention can shed light on this issue. 2 Participants with dyslexia showed a significant improvement in reading 3 accuracy after the EFs-based reading intervention (compared to the control 4 training), but not in reading fluency or reading comprehension. This might be 5 due to the control training utilized here (math) and the well-established 6 importance of EFs in math performance (Bull and Lee 2014, Cragg and 7 Gilmore 2014). It is possible that Math training improved EFs, which, per the 8 current study's hypothesis, had an effect on reading abilities. Future studies, 9 including active and passive control groups may be able to test the effect of 10 EFs-based reading training and visual training for dyslexia. Experimental 11 studies investigating interventions for dyslexia with variable loads of EFs and 12 visual attention (perhaps adopting a parametric approach with different 13 subjects receiving different weights for each component) might enhance our 14 understanding of the importance of each one of these factors in the treatment 15 of dyslexia. 16

Longer response times in the Fluency task after the intervention 17

Significant increases in response time were observed in the Still condition in 19 all participants who underwent EFs-based reading intervention. Furthermore, 20 only TR (not children with dyslexia) displayed longer response times in the 21 post-test compared to the pre-test after the math intervention. It has been 22 previously suggested that in tasks involving EFs, longer response times are 23 typically associated with superior performance (Partchev, De Boeck et al. 24 2013, Goldhammer, Naumann et al. 2014, Su and Davison 2019). On the 25

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contrary, longer response times in tasks that involve lower-level processing 1 indicate lower ability (Partchev, De Boeck et al. 2013). These studies imply 2 that increased response times during reading tasks can reflect a deliberate $\frac{3}{3}$ effort by participants to perform adequately (greater involvement of EFs). The 4 present results confirmed this hypothesis, given the significant association 5 between longer response times (when comparing the pre-test and the post- 6 test) and enhanced performance in the post-test. Here, a significant 7 correlation was found between pre-post changes in inhibition and pre-post 8 changes in response time to the still condition in all participants. That is, the 9 participants showing larger score improvements in inhibition after the 10 intervention displayed longer response times after the intervention, which is in 11 line with the presented explanation. In this vein, longer response times after 12 the intervention may be related to increases in cognitive inhibition, which is 13 involved in response monitoring (Kilian, Bröckel et al. 2020). In the present 14 study, all groups who were expected to demonstrate reading improvement in 15 response to the EFs-based reading intervention, including both typically 16 developing readers and those with dyslexia, exhibited longer response times. 17 In contrast, the group of children with dyslexia who received the Math 18 intervention did not improve, which is consistent with the presented post-hoc 19 explanation. 20

Notably, this effect was not observed in the Deleted condition, where no 21 significant differences in response time nor accuracy were found for any 22 group. It is plausible that participants dedicated more time to ensure accuracy 23 in the Still condition due to a reduced sense of urgency to respond rapidly, 24

Greater synchronization between EFs networks and visual processing regions 3 *after the EFs-based reading intervention* 4

Stronger functional connectivity was found in children with dyslexia between 5 the CO, the right lingual gyrus, and the right cuneus after the EFs-based 6 reading training. The cuneus and lingual gyrus comprise the medial occipital $\frac{7}{10}$ lobe and have a role in basic and higher-level visual processing (Allison, 8 Begleiter et al. 1993, Mai and Paxinos 2012, Palejwala, Dadario et al. 2021). 9 More specifically, the cuneus and lingual gyrus seem to have special 10 relevance in visual memory, linguistic processing (written words), direction 11 discrimination, and motion perception (Palejwala, Dadario et al. 2021). Taking 12 into account the role of these areas in word decoding and movement-related 13 features of visual processing, it seems reasonable to assume that the fast- 14 paced deleted letters characterizing the EFs-based reading intervention 15 triggered a higher synchronization between the mentioned visual processing 16 regions and a higher-order cognitive control network in order to achieve better 17 performance at the task. This increase in functional connectivity is interpreted 18 as an indicator of higher integration of the basic (and not-so-basic) cognitive 19 processes underlying fluent reading, i.e., visual attention, working memory, 20 speed of processing, and more (Dehaene 2009, Sporns 2012). Here, a 21 positive correlation was found between these regions' connectivity and the 22 scores in visual attention and speed of processing. 23

Despite the major role of the left fusiform gyrus (or VWFA) in word decoding, 1 we did not find an association between this region and the EFs-based 2 intervention-related cognitive gain. Here, children with dyslexia displayed an 3 increase in connectivity strength between the CO and occipital areas involved 4 in visual processing, but not the the VWFA. The lingual gyrus and the right 5 cuneus possess certain processing features that allow them to engage in the 6 primary processing of visual information, further feeding into the 7 (hierarchichally superior) occipito-temporal VWFA. The present results 8 suggest that the decoding deficit in dyslexia may arise in early stages of visual 9 processing, which is not in synchrony with higher-order cognitive control 10 networks. This benefitial pattern of connectivity was reinforced after the EFs- 11 based reading training. How are the interactions between the VWFA and the 12 rest of the brain affected in dyslexia and how can a treatment address this 13 connections is a matter of further research. 14

Recent studies suggest that one of the mechanisms of brain maturation along 15 development is a higher synchronization between whole-brain networks and 16 versatile neural hubs such as the IFG (Wierenga, van den Heuvel et al. 2016, 17 Hermosillo 2022). The medial occipital lobe, and specifically the bilateral 18 lingual gyri, seem to adopt a major role as an association hub along 19 development (Chen, Liu et al. 2013, Oldham and Fornito 2019). By boosting 20 the synchrony between the CO and the medial occipital lobe, the EFs-based 21 reading intervention might be enforcing a pattern of brain maturation in 22 children with dyslexia (Hermosillo 2022), which might help them overcome the 23 asynchronization reported earlier (Breznitz 2003) and reduce neural noise in 24 their sensory systems (Hancock 2017). 25

Greater engagement of attention and linguistic/multimodal regions in TR after 1 *the EFs-based reading intervention* 2

A different neuroplasticity mechanism was found in TR children who 3 underwent the EFs-based reading intervention. In this subgroup, higher 4 functional connectivity was detected between the DAN and the left IFG while \qquad 5 reading deleted text. The left IFG is associated with phonological and 6 semantic functions (Klaus and Hartwigsen 2019). The role of this region in 7 word comprehension and production is undisputed (Costafreda, Fu et al. 8 2006, Klaus and Hartwigsen 2019). Furthermore, it is now well established 9 that the left IFG is a neuronal hub playing a role in multiple interrelated lower-
10 and higher-order cognitive operations such as multisensory integration 11 (Pulvermüller 2013, Li, Seger et al. 2020), verbal working memory 12 (Costafreda, Fu et al. 2006, Emch, von Bastian et al. 2019), creativity (Khalil, 13 Karim et al. 2020), and inhibitory control (Swick, Ashley et al. 2008, 14 Tomiyama, Murayama et al. 2022). In the same vein, the bilateral inferior 15 frontal gyri participate in distinct large-scale networks such as the language 16 network (Pulvermüller 2013, Tomasello, Garagnani et al. 2017, Gao, Guo et 17 al. 2020), the VAN (Corbetta and Shulman 2002, Bernard, Lemee et al. 2020), 18 and the limbic network (Cha, DeDora et al. 2016, Rolls, Cheng et al. 2020), 19 with broad connections to the temporal and parietal cortices (Nakae, 20 Matsumoto et al. 2020). The increase in strength of functional connectivity 21 between the DAN and the left IFG found after the EFs-based reading 22 intervention suggests that our training paradigm enforced in TR a maturation 23 in brain network interactions typical of the late childhood period (Sporns 2011, 24 Oldham and Fornito 2019). 25

Higher synchrony between the DAN and the left IFG was related to higher 1 scores in verbal working memory, which is a cognitive ability that heavily 2 relies on the frontal lobe and the *language network*, including the left IFG 3 (Dehaene 2009, Emch, von Bastian et al. 2019). The involvement of the DAN 4 in visuo-attentional processing (Szczepanski and Kastner 2013, Zhao, Wang 5 et al. 2022) makes it a major candidate to contribute to the reading process, $\qquad 6$ and several studies have indeed highlighted the role of (especially posterior) $\frac{7}{10}$ DAN areas in reading (Cohen, Dehaene et al. 2008, Qian, Bi et al. 2016). 8 However, the specific role of the different areas comprising the dorsal 9 attention system in the processing of printed words is not yet completely clear. 10 Our results suggest that higher synchrony between the DAN and the left IFG 11 is related to higher cognitive performance in speed of processing, working 12 memory and reading in TR, and that the EFs-based reading intervention is 13 capable of inducing increases in functional connectivity between these areas. 14

No significant differences when randomly dividing the sample 15

Here, we included an additional analysis in which random groups were 16 created and the seed-to-voxel analysis was repeated in order to check for the 17 validity of our results. One pre-post test contrast reached significance in one 18 of the subgroups. An increase in connectivity after the training in both TR and 19 participants with dyslexia undergoing either intervention could be representing 20 a mechanism common to both interventions. Alternatively, it could be a 21 neurobiological change related to normative development. In any case, it 22 remains unanswered why this change in connectivity is visible in one of the 23 subgroups only and this result is arguably an indicator of the spurious effects 24 that can be found performing fMRI analyses when running undirected 25

Limitations 4

Recent benchmarking papers have criticized the poor reliability of BWAS 5 (Baykara, Könen et al. 2021, Marek, Tervo-Clemmens et al. 2022). Here, we 6 did not explicitly conduct a BWAS but we did include univariate prediction $\frac{7}{10}$ models for brain-behavioral phenotypes. Even though we tried addressing this 8 limitation by performing an extra control analysis (group permutation), the 9 need for larger sample sizes in order to increase the reliability and 10 generalizability of the associations in the field of cognitive neuroscience is an 11 unavoidable reality. Furthermore, current recommendations highlight the need 12 to move towards individualized treatment approaches when addressing 13 cognitive traits in clinical populations (Baykara, Könen et al. 2021). The 14 utilization of different active as well as passive (waiting list) control groups 15 might produce better outcomes when studying the neuropsychological effect 16 of an intervention program; we were not able here to isolate the effect of the 17 EFs-reading intervention on executive functions themselves because of the 18 recruitment of EFs in mathematical thinking. In summary, individualized 19 programs combining features of the EFs-based reading intervention (and 20 other phonological and visual trainings), might be the most fruitful research 21 direction for the development of treatment plans for dyslexia in upcoming 22 years. 23

Deleted text reading

Still text reading

EF-based reading training engages the cingulo-opercular and dorsal attention networks

Nikolay Taran, Rola Farah, Carmel Gashri, Ester Gitman, Keri Rosch, Bradley L. Schlaggar, and Tzipi Horowitz-Kraus

Author summary

The aim of the study was to determine the behavioral and neural effects of a computerized executive functions (EFs)-based reading intervention. A total of 79 participants (8-12-year-olds, English-speaking) with and without dyslexia trained either on an EFs-based reading training or a math training.

After the EFs-based reading intervention, children with dyslexia improved their scores in reading rate and visual attention. Intervention-related increases in fMRI functional connectivity were observed between the cingulo-opercular network and occipital regions. Higher indices of connectivity were related to better speed of processing and visual attention. The reading improvement involved neuroplastic connectivity changes in brain areas related to EFs and primary visual processing. The importance of training the cognitive abilities supporting reading in dyslexia (e.g., EFs and visual attention) is highlighted.