## Predictors of developmental dyslexia in European orthographies with varying complexity

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**Abstract** 

**Background:** The relationship between phoneme awareness, rapid automatized naming

(RAN), verbal short-term/working memory (ST/WM) and diagnostic category is investigated in

control and dyslexic children, and the extent to which this depends on orthographic complexity.

Methods: General cognitive, phonological and literacy skills were tested in 1138 control and

1114 dyslexic children speaking 6 different languages spanning a large range of orthographic

complexity (Finnish, Hungarian, German, Dutch, French, English).

**Results:** Phoneme deletion and RAN were strong concurrent predictors of developmental

dyslexia, while verbal ST/WM and general verbal abilities played a comparatively minor role.

In logistic regression models, more participants were classified correctly when orthography was

more complex. The impact of phoneme deletion and RAN-digits was stronger in complex than

in less complex orthographies.

**Conclusions:** Findings are largely consistent with the literature on predictors of dyslexia and

literacy skills, while uniquely demonstrating how orthographic complexity exacerbates some

symptoms of dyslexia.

Keywords: dyslexia, phonology, orthography, cross-linguistic

## Introduction

Developmental dyslexia, i.e. a specific deficit in reading that cannot be accounted for by low IQ, poor educational opportunities, or obvious sensory or neurological damage (World Health Organization, 2008), affects about 3-7% of the population (Lindgren, De Renzi, & Richman, 1985). Research has made tremendous progress in specifying biological and environmental factors associated with this disorder. A central environmental factor that has been identified to influence reading acquisition and dyslexia is the particular orthography that the child is acquiring. All orthographies depict the sound structure of the language they represent, but there is considerable variability in how transparent this relationship is for the learner and how consistently orthographic symbols represent the sounds of a particular language. Both theoretical conceptions (Katz & Frost, 1992; Ziegler & Goswami, 2005) and empirical evidence suggest that transparent orthographies with high symbol-sound consistency are acquired more easily than complex and opaque orthographies with a high proportion of inconsistent and irregular spellings. The most impressive evidence for the impact of orthographic complexity on reading development came from a large European network involving 13 different alphabetic orthographies (Seymour, Aro, & Erskine, 2003). At the end of first grade, reading accuracy was close to ceiling in consistent orthographies (Italian, Icelandic, Norwegian, Spanish, German, Dutch, Finnish), while children acquiring more complex orthographies (English, Danish, French) were still struggling. Complex and opaque mapping systems such as English orthography cause particular problems not only to the young learner, but also to dyslexic individuals (Landerl, Wimmer, & Frith, 1997; Ziegler, Perry, Ma-Wyatt, Ladner, & Schulte-Körne, 2003).

An important research question that arises from the well-documented orthographic differences in early and deficient written language processing is to what extent the cognitive

mechanisms underlying reading acquisition and dyslexia might vary as well. English-based research has identified verbal-phonological processing as the central cognitive predictor of typical as well as dyslexic reading development (Vellutino, Fletcher, Snowling, & Scanlon, 2004), but there have been claims that focusing on the complex English orthography may have led to an overestimation of the relevance of phonological processing (Share, 2008). In transparent orthographies, even children who start reading acquisition with deficient phonological skills may be able to understand the mappings between spoken and written language if they are simple enough. Moreover, a simple and transparent representation of the phonological structure may help children to overcome early deficits, even more so if formal reading instruction is strongly phonics-based as is the case in many consistent orthographies.

Recently, a number of large-scale cross-linguistic studies on typical reading acquisition in different orthographies addressed this question. This approach can certainly not eliminate all methodological problems that are inherent in comparisons across different educational, cultural, and language backgrounds, but findings are still easier to interpret within such designs than between studies that are carried out in different orthographic systems independently. Ziegler et al. (2010) investigated 1263 2<sup>nd</sup> graders in five orthographies with increasing degrees of complexity (Finnish, Hungarian, Dutch, Portuguese, French) and indeed found support for the hypothesis that phonology may be less relevant in consistent orthographies as the impact of phonological awareness (PA) was weaker. Nevertheless, PA was significantly associated with reading accuracy and speed in all orthographies and was the strongest concurrent predictor in all orthographies except in the highly transparent Finnish writing system, where vocabulary was the strongest predictor of word reading speed and predicted reading accuracy equally strongly as phoneme deletion. Another well-established predictor of reading, rapid automatized naming (RAN, see Kirby, Georgiou, Martinussen, & Parrila, 2010 for a recent review) did not show marked differences across orthographies and overall showed surprisingly moderate associations with reading. Two reasons may explain this atypically low RAN-reading

relationship. First, Ziegler et al. (2010) used sequential naming of pictured objects and there is evidence that alphanumeric RAN tasks (letters, digits) show a stronger relationship with reading than such non-alphanumeric versions (e.g., Bowey, McGuigan, & Ruschena, 2005).

Second, the strength of the RAN-reading association may be relatively weak among Ziegler et al. 's sample of young readers and may increase later in reading development. This is suggested by another recent cross-language study by Vaessen et al., (2010) which focused on the concurrent prediction of reading fluency in three orthographies with increasing complexity (Hungarian, Dutch, Portuguese). Findings indicated a shift of cognitive mechanisms underlying reading fluency during development. In Grades 1 and 2, the association of PA and RAN (objects, letters, and digits combined) with reading fluency was largely comparable, while in Grades 3 and 4 RAN was more strongly associated with reading fluency than PA. Importantly, Vaessen et al. (2010) confirmed that cognitive mechanisms underlying reading were similar across the three alphabetic orthographies, but again, the association of reading with PA, but not with RAN or verbal short term memory was modulated by orthographic complexity.

Landerl et al. (submitted)<sup>1</sup> examined whether the cross-linguistic findings resulting from these large-scale European studies could be extended to English, which is assumed to be the most inconsistent alphabetic orthography (Share, 2008). Altogether 1062 elementary school children learning to read in English, French, German, Hungarian, or Finnish participated.

Phonological skills (awareness and short-term memory) accounted for significant variance in reading accuracy and spelling in all orthographies while RAN was the best concurrent predictor of reading fluency. No major language differences were found between patterns of concurrent prediction. However, overall the regression models accounted for more variance in English than in the other orthographies. Interestingly, it was RAN rather than PA that showed a stronger association to literacy measures in English than in the other orthographies. However, a marked outlier-position of English orthography could not be confirmed.

Identifying the cognitive mechanisms underlying reading is of particular relevance in the context of dyslexia. How accurately can the predictor measures that have been identified for typical development differentiate between typical and dyslexic readers? Is the quality of prediction similar across orthographies or are there orthography-dependent differences? These questions were addressed in the context of NEURODYS, an EU-FP6 network focusing on the neurobiological and neurocognitive foundations of dyslexia in different alphabetic orthographies covering a broad range of consistency (English, French, Dutch, German, Hungarian, Finnish).

#### **Methods**

#### Rationale

Large-scale cross-linguistic comparisons are faced with critical methodological problems concerning (1) selection of adequate tasks to measure the relevant cognitive constructs (2) lack of a common metric adequately describing linguistic and orthographic differences and (3) possible differences in the diagnosis of dyslexia between countries. There are enormous differences in how dyslexia is diagnosed in the various national school and health care systems and also in the kind of support systems that are available to dyslexic individuals (Ise et al., 2010). A major advantage of NEURODYS is that within the project the same ICD-10 (World Health Organisation, 2008) based criteria were applied: Children with more general learning, attentional, or neurological problems and children whose first language was not the instructional language were not admitted to the study. Reading was assessed by language-specific standardized word reading tests. Dyslexic readers had to perform more than 1.25 SDs below grade level which is a pragmatic compromise between the standard criteria of -1 and -1.5 SDs that are widely applied in research and clinical practice.

The lack of a common metric to describe orthographic and linguistic differences is a general problem for cross-linguistic studies. Although there is notable agreement on where to place particular writing systems on a continuum of orthographic complexity (e.g., Borgwaldt et al., 2005; Caravolas, 2005; Seymour et al. 2003), the adequate levels of description are still under discussion and their quantification is a future enterprise for psycholinguistic research. For the present analysis, we classified the six participating orthographies into three categories of orthographic complexity that are based on feedforward and feedback consistency of graphemephoneme and phoneme-grapheme correspondences. The three groups are largely inspired by the classification provided by Seymour et al. (2003) (see Table S1 in the online supplement), and are consistent with the data on word recognition in that study. English and French comprised the highest level of orthographic complexity with inconsistencies in grapheme-phoneme as well as phoneme-grapheme correspondences (low feedforward and feedback consistency). Dutch and German represented a medium complexity level as these two Germanic languages have comparable orthographic structures with highly consistent grapheme-phoneme correspondences (high feedforward consistency), but less consistent phoneme-grapheme correspondences (low feedback consistency). Finnish displayed the lowest level of orthographic complexity as it has non-ambiguous 1:1 relationships between letters and sounds with equally high feedforward and feedback consistency. Hungarian was not included in the study of Seymour et al., but its linguistic and orthographic properties are similar to Finnish.

The three levels of orthographic complexity are also consistent with the analysis of word-initial letter-to-phoneme mappings provided by Borgwaldt et al. (2005) (see Table S1). Although that study did not include Finnish, this language falls clearly at the lower end of the complexity continuum with no more than 21 letter-to-phoneme mappings. However, we do not feel that the numbers in Table S1 represent a sufficiently valid measure of orthographic complexity to use them directly as a quantitative variable. For instance, Borgwaldt's entropy measure is based only on word onsets and is missing most of the irregularities in many

languages, and therefore vastly underestimates some language differences. We therefore decided to use a simpler and more conservative categorical factor with three values, by grouping languages in pairs of similar orthographic complexity.

In order to identify similarities and differences in the concurrent prediction of dyslexia in orthographies with low, medium, and high complexity, standard tasks measuring PA, verbal STM/WM and RAN were administered with all participants. Similarity across languages was relatively easy to achieve for verbal STM/WM as standardized versions of WISC digit span were available in each language. For the sake of similarity across languages, naming speed was measured by language specific digit RAN tasks requiring children to sequentially name as quickly as possible lists of digits. A second RAN condition required sequential naming of pictured objects representing short high-frequency words in each language. With respect to PA we decided to follow the example of earlier cross-linguistic studies (Caravolas, Volin, & Hulme, 2005; Vaessen et al., 2010; Ziegler et al., 2010) and administered phoneme deletion, thus ensuring reasonable comparability of findings across studies. Phoneme deletion is a standard paradigm and is included in standardized test batteries of dyslexia (e.g., Wagner, Torgesen, & Rashotte, 1999). Due to the large variability of languages involved, devising one and the same paradigm for all participants was not feasible. Specifying the linguistic structure of presented items across languages might have induced higher typicality in some languages than others (e.g., consonant clusters are atypical in Finnish, polysyllabic words are less typical in English). Thus, it was decided to leave the language-specific characteristics to individual partners who were advised to select words or nonwords with typical linguistic structure and to ask children to delete a specified phoneme.

In summary, two major methodological improvements could be made compared to earlier studies on dyslexia in different orthographies: First, due to extensive recruitment efforts, sample sizes for dyslexic and control groups in each language are clearly larger than in earlier

studies. Second, the parallel structure of recruitment and components assessed resulted in comparable datasets across orthographies.

#### **Participants**

Participants<sup>2</sup> came from varying social backgrounds and were either identified in school or were specifically requesting clinical assessment of their reading problems. The same inclusion and exclusion criteria were applied in all partner countries. The following criteria were applied:

- Age between 8 and 12;11 years.
- At least one and a half years of formal reading instruction in order to differentiate serious problems in reading acquisition from early delays that are not always persistent.
- An age-appropriate scaled score of at least 7 on WISC Block Design, and 6 on WISC Similarities.
- An attention score within the 95<sup>th</sup> percentile of the age-appropriate norm, from either the Child Behavior Check-List (Achenbach, 2001) or the Conners questionnaire (Conners, 1973), filled by parents.
- A parental questionnaire further asked a number of simple questions, on which basis we applied the following exclusion criteria:
  - Hearing loss
  - Uncorrected sight problems
  - o Test language not spoken by at least one parent since birth.
  - o Child not schooled in test language.
  - o Child missed school for any period of 3 months or more.
  - o Formal diagnosis of ADHD.

o Child on medication for epilepsy or behavioural problems.

Inclusion criterion for dyslexic children:

More than 1.25 SDs below grade level on a standardized test of word reading.
 Inclusion criterion for control children:

 Less than 0.85 SDs below grade level on the same standardized word reading test.

Participant numbers per grade level are presented for each participating country in Table S2 in the online supplement. There were 1138 control and 1114 dyslexic children in total, based in eight different countries and speaking six different languages. In the control group there were 598 boys and 540 girls, while in the dyslexic group there were 705 boys and 408 girls, which is consistent with the typical gender-ratio of dyslexia.

#### Measures

IQ was estimated based on one verbal and one nonverbal WISC subtest: Similarities and Block Design (Wechsler, 1992, 2003). Scaled scores (M = 10, SD = 3) were calculated based on agespecific norms.

Reading was assessed using language-appropriate standardized tests of word reading.

All tests are listed in Appendix SA in the online supplement. In all languages but English, word lists were presented under a speeded instruction ("Read as quickly as possible without making mistakes"). The number of words read correctly per minute was converted into Z-scores based on grade-appropriate norms. In English, reading was not timed.

PA was assessed by a phoneme deletion task, requiring children to delete a specified phoneme from a word or nonword (e.g., "Say /bli:k/ without the /k/"). Number of correct responses was scored.

Naming speed was assessed via language specific RAN tasks requiring children to sequentially name as quickly as possible lists of digits and pictures depicting easily recognizable objects. The dependent measure was the number of items named per minute.

Verbal ST/WM was measured by WISC digit span (forwards and backwards). Scaled scores (M = 10, SD = 3) were calculated based on age-specific norms.

#### Data analysis

Our main analytical approach is a multilevel logistic regression analysis, allowing nesting students within orthographic complexity groups. This allows us to estimate the effect of orthographic complexity on diagnostic category, as well as the effect of cognitive variables, both across and within orthographic complexity groups. Crucially, this analysis allows us to test to what extent the predictive value of cognitive variables differs between languages with different orthographic complexity. The exact procedures of data treatment and data analysis are described in the online supplement.

#### **Results**

Means, *SD*s, minima and maxima for each variable and each group are reported separately for the three levels of orthographic complexity in Table S3 in the online supplement. Age was lower in the low than in the medium complexity group and again lower in the medium than in the high complexity group. Within the high complexity group, dyslexic children were on average three months older than control children. Table S2 indicates an overrepresentation of dyslexic children in the higher grade levels. Therefore grade level was controlled for in the following statistical analysis. Dyslexic children's scores on Block Design and Similarities were systematically lower than those of the control children, but average compared to the norm. The standardized word reading measure was used as sole group selection variable and the large

group differences on Phoneme deletion, RAN and Digit span confirm that these are relevant predictor measures for dyslexia.

### Multilevel Logistic Regressions of diagnostic category

The age range in the full European sample was unusually large including children from Grades 2 to 7. Therefore, we reran the analyses with an age-limited sample including Grades 3, 4, and 5, thereby eliminating the age differences between orthographic complexity groups (116, 117 and 116 months for low, medium and high complexity). The intraclass correlation of 0.0395 [95% CI 0.0197, 0.067] for all students and 0.040 [0.016,0.075] for the age-limited sample (Grades 3 to 5), indicates that about 4% of the variance of the trait is attributable to the nesting variable orthographic complexity level. The median odds ratio (MOR) was estimated to be 1.423 [95% CI 1.278,1.588], for the full sample and 1.425 [95% CI 1.247;1.638] for children in Grades 3,4, and 5, meaning that in median a given child is 40% more likely to be dyslexic in high- than in low-complexity orthographies. Further inclusion of country as an additional random effect did not lead to a significant increase of the model likelihood ( $\chi^2$ (35) = 30.782 and 15.027 for the full and age-limited samples, respectively, p > .1), providing some empirical support for the validity of our three levels of orthographic complexity. Hence, the variable country was not retained in the model.

Table 1 Multilevel Logistic Model for Full Sample (n = 1998)

	Odds	Confidence Interval				
	ratio	lower	upper	t-value	r (> t )	het
Grade	1.007	0.886	1.143	0.100	.921	<.001
Gender	0.706	0.565	0.882	-3.067	.002	.223
Block	1.040	0.992	1.090	1.632	.103	.584
Design						
Similarities	0.885	0.849	0.922	-5.822	<.001	.603
Phoneme	0.354	0.308	0.408	-14.529	<.001	<.001
Deletion						
RAN Digits	0.356	0.311	0.407	-15.08	<.001	<.001
Digit Span	0.694	0.616	0.783	-5.963	<.001	.131

Note: het = p-value of heterogeneity

Next, Phoneme Deletion, RAN digits, and Digit Span were introduced as predictor variables. RAN digits rather than RAN pictures was included because this measure is more similar across languages and correlations with reading tended to be stronger (RAN digits: .53, RAN pictures: .47, controlling for age). Grade, Gender, Block Design and Similarities were introduced to control for the group differences in these measures. The corresponding odds ratios and p-values derived from the Wald statistics are presented in Table 1 for the full sample and in Table S4 in the online supplementary for the age-limited sample (Grades 3 to 5). As expected, Phoneme Deletion, RAN digits and Digit Span were reliable predictors of dyslexia status. Gender and Similarities also had a significant influence on dyslexia status. The probability of being dyslexic is multiplied by about 2.6 (1/0.354) for each point decrease (in z units) of Phoneme deletion and 2.8 for RAN. A child with Phoneme Deletion = -1 and RAN = -1 has therefore roughly 7 times the risk of being dyslexic than with a score of 0 on both variables (with odds ratio converted to relative risks assuming a dyslexia prevalence of 5%). On the other hand one z-unit of digit span only increases the relative risk by 41%.

Table 2 Multilevel Logistic Models Separately for Each Level of Orthographic Complexity

	Odds	Confidence	e Interval		
	ratio	lower	upper	z_value	Pr(> z )
Low Complexity (n = 682)					
Grade	0.638	0.476	0.856	-3.004	.003
Gender	0.753	0.521	1.089	-1.506	.132
Block Design	1.022	0.946	1.104	0.555	.579
Similarities	0.909	0.849	0.974	-2.715	.007
Phoneme Deletion	0.481	0.388	0.596	-6.681	<.001
RAN Digits	0.491	0.400	0.604	-6.744	<.001
Digit Span	0.594	0.478	0.737	-4.731	<.001

Medium Complexity (n = 932)					
Grade	0.972	0.781	1.211	-0.250	.803
Gender	0.830	0.584	1.180	-1.040	.299
Block Design	1.096	1.018	1.181	2.419	.016
Similarities	0.881	0.824	0.941	-3.737	<.001
Phoneme Deletion	0.307	0.244	0.386	-10.095	<.001
RAN Digits	0.285	0.228	0.356	-11.071	<.001
Digit Span	0.773	0.644	0.929	-2.746	.006
High Complexity (n = 384)					
Grade	1.455	1.107	1.912	2.693	.007
Gender	0.317	0.159	0.635	-3.243	.001
Block Design	0.961	0.827	1.116	-0.520	.603
Similarities	0.865	0.769	0.975	-2.385	.017
Phoneme Deletion	0.187	0.116	0.303	-6.836	<.001
RAN Digits	0.262	0.169	0.404	-6.040	<.001
Digit Span	0.639	0.450	0.906	-2.515	.012

Note: Cox & Snell  $R^2 = 0.294$ , 0.401, and 0.489 for low, medium, and high complexity; Nagelkerke  $R^2 = 0.394$ , 0.537, and 0.672 for low, medium, and high complexity; AUC = 0.817, 0.877, and 0.929 for low, medium, and high complexity

We did, however, note significant differences in the estimates for some predictors.

Tables 1 and S4 show significant evidence for heterogeneity for Grade, Phoneme Deletion and RAN Digits. This heterogeneity, equivalent to an interaction effect between orthographic complexity groups and these predictors, prompted us to also perform analyses separately for each orthographic complexity subgroup (see Table 2). The results of this analysis for all children showed that the effect sizes of Phoneme Deletion and RAN increased with

orthographic complexity. Differences for Phoneme Deletion were significant for low vs medium complexity groups (Q = 8.14, df = 1, p = .004), high vs. low complexity groups (Q = 13.92, 1df, p = < 0.001), and of borderline significance for medium vs. high complexity groups (Q = 3.68, df = 1, p = .055). For RAN the heterogeneity was driven by the low complexity group, which showed significantly higher odds ratios than both the medium (Q = 14.56, df = 1, p < .001) and high complexity groups (Q = 6.28, df = 1. p = 0.012), indicating that its impact is weaker in the low than in the other two complexity groups (see Figure 1). In all three orthographic complexity groups, Digit Span and verbal IQ were also significant but more moderate predictors. In addition, grade level was of moderate predictive relevance in the low and high complexity group, Block Design in the medium complexity group and gender in the high complexity group. This heterogeneity can be illustrated by noting that one z-unit of phoneme deletion multiplies the probability of dyslexia by 2 (relative risk of 1.97 from the odds ratio of 1/0.481) in low-complexity orthographies, it multiplies it by almost 3 (relative risk of 2.92 from the odds ratio of 1/0.307) in medium- and by more than 4 (relative risk of 4.39 from the odds ratio of 1/0.187) in high-complexity orthographies.

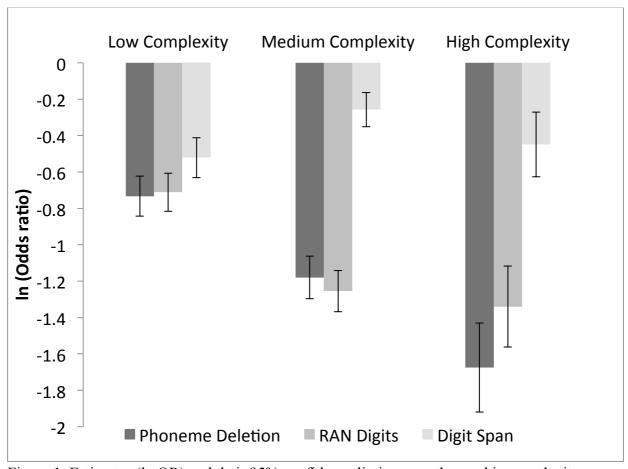


Figure 1. Estimates (ln OR) and their 95% confidence limits per orthographic complexity group for Phoneme Deletion, RAN Digits and Digit Span respectively.

Results for the age-limited sample (Grades 3 to 5) are reported in Table S4 and S5 of the online supplementary and are consistent with the full-sample analysis. Differences for Phoneme Deletion were significant for high vs. low complexity groups (Q = 6.73, df = 1, p = .009), for high vs medium/low complexity combined (Q = 5.32, df = 1, p = .023) and low vs. medium/high complexity combined (Q = 5.39, df = 1, p = .021) and showed a trend for medium vs. high (Q = 2.93, df = 1, p = .086). For RAN the low complexity group was again significantly different from both medium (Q = 18.84, df = 1, p < .001) and high complexity groups (Q = 8.01, df = 1, p = .005).

Thus, the direction of the observed heterogeneity effects pointed to more pronounced ORs in the higher orthographic complexity group indicating an increase of predictive capability

of the model with increasing orthographic complexity. In accordance with this, the area under the ROC curve (AUC), reflecting the predictive power of the model across the whole range of classification criteria, was higher in the high-complexity than in the low-complexity group, with medium-complexity in-between. Figure 2 shows the corresponding ROC curves. Aiming to test whether differences in AUCs between the orthographic complexity groups were meaningful we ran a bootstrap analysis with 10,000 replicates. For each bootstrap sample the full logistic regression analysis was run with all random and fixed effects and AUCs in each of the three complexity groups for each of the replicated were recorded, The 95% confidence intervals for all differences did not include zero, indicating that all three differences had a certain level of meaningfulness.

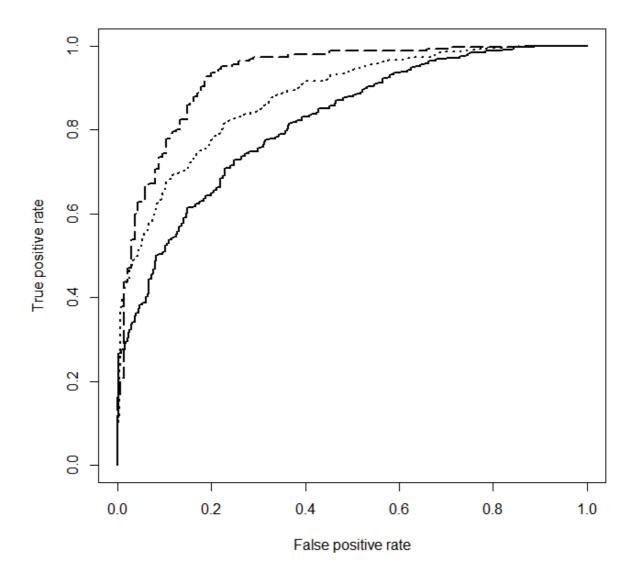


Figure 2. ROC-curves (high complexity: dashed, medium complexity: dotted, low complexity: full)

Finally, we analysed whether predictive patterns would change when RAN pictures instead of RAN digits was introduced by rerunning the full sample analysis and the analyses separately for each orthographic complexity level. Findings (Tables S6 and S7) were fully consistent with the earlier analysis.

## **Discussion**

We investigated the cognitive and literacy skills of about 1000 dyslexic and 1000 control children aged 8 to 12, from eight European countries, learning to read in six different languages varying widely in terms of orthographic complexity. We specifically tested to what extent various cognitive variables predicted children's diagnostic status, and to what extent this differed between languages of varying orthographic complexity.

# What are the predictors of dyslexia and are they similar for different levels of orthographic complexity?

Standard predictors of reading skills and dyslexia were introduced in this large-sample analysis. Findings confirmed that phoneme deletion and RAN are strong concurrent predictors of developmental dyslexia, while verbal ST/WM and general verbal abilities played a significant but comparatively minor role.

Interestingly, our statistical model classified more participants correctly when orthography was more complex. This may be a consequence of the larger variance in phonological and reading skills in high than in low complexity orthographies. Indeed, despite normalisation of all variables, dyslexic children often reached more extreme negative z-scores in high than in low complexity languages. In low complexity orthographies, reading achievement is generally higher (Seymour et al., 2003), even for dyslexic children (Landerl et al., 1997). Thus, variance in reading skills is reduced, and so is variance in phonological skills, given the influence of the former on the latter. The little variance that remains to be explained, amplified by rescaling into z-scores, may be much noisier and reflect more idiosyncratic factors in low than in high complexity orthographies, where variance in phonological skills can show its full impact on reading skills and on dyslexia.

Specifically, the impact of phoneme deletion and RAN was stronger in more than in less complex orthographies. No such heterogeneity was found for verbal ST/WM. Phoneme deletion as a standard measure of phoneme awareness is generally seen as an important predictor of dyslexia (Vellutino et al., 2004). Ziegler et al. (2010) showed for young readers (Grade 2) in five alphabetic orthographies that the predictive power of phoneme deletion increases with the degree of orthographic complexity and in the present study this important finding could be confirmed for dyslexia. Thus, there is accumulating evidence in favour of Share's (2008) opacity by transparency hypothesis.

Our finding that RAN is a strong predictor is at odds with Ziegler et al. (2010), but fits well with the rest of the literature (Kirby, et al., 2010). We have introduced both RAN digits and RAN pictures in our regression models. Both were reliable predictors of diagnostic status at all orthographic complexity levels. Thus, the present study does not confirm earlier assumptions that processes involved in alphanumeric RAN (naming letters and digits) are different from non-alphanumeric task versions like naming colours or objects (Bowey et al., 2005). Similar to Phoneme Deletion, RAN also showed a stronger impact on relatively more complex orthographies. Thus, earlier claims that RAN may be a stronger predictor in orthographies with low compared to high complexity, as in such orthographies the variance in reading skills is usually determined by reading fluency rather than accuracy (Kirby et al., 2010), are not supported by the current study.

#### Limitations and caveats

The present cross-linguistic dyslexia study covers an unprecedented number of languages representing a large range of orthographic complexity. Nevertheless, our conclusions remain limited to the alphabetic orthographies included, which all use the Latin alphabet and a left-to-right writing direction. Any generalisation to other alphabetic orthographies, and all the more so to non-alphabetic orthographies would be tentative.

In this study, the constructs of interest, PA, RAN, and verbal ST/WM were assessed by only one measure each. Having several tasks per construct would obviously have increased construct validity. Unfortunately, it was not feasible to significantly increase testing time across all countries in such a large-scale project.

As in any cross-linguistic study, a major issue is the extent to which linguistic tasks designed in different languages tap similar cognitive processes and similar levels of difficulty. One possibility is to choose languages that are sufficiently close (such as English and German) and to match all the material (e.g., Landerl, et al., 1997; Ziegler, et al., 2003). When a broader range of languages is studied, this is not an option. There is simply no way to design equivalent lists of words or nonwords across languages as different as English and Finnish. Furthermore, even if the material was matched, the difficulty of certain tasks (such as word reading or phoneme deletion) might not be, as this is partly dependent on the orthographic complexity of the language. Thus, it is inevitable that in the present study some tasks tap different levels of performance and thus have different sensitivities in different languages. This issue is most crucial with respect to the role of phoneme deletion. Indeed, it has been suggested that in languages with transparent orthographies, both reading accuracy and PA are easily acquired, even by dyslexic children, so that the former is a minor issue, and the latter is of minor importance for reading acquisition and dyslexia. Nevertheless, we found that PA was a significant predictor of dyslexia, even in the most transparent languages. Thus, to the extent that there is variation in performance in PA (and there is, even in Finnish), this variation is still meaningful in terms of the prediction of diagnostic category. Even in a language where dyslexic children reach near-perfect performance on phoneme deletion, the fact that their performance is slightly less perfect than that of controls' predicts dyslexia status.

The present cross-sectional study can only provide suggestive information regarding causality. Our use of the word "predictor" is strictly statistical, i.e., the extent to which knowing the value of one variable allows to predict the value of another variable. We do not imply that

the pattern of predictions observed here would necessarily hold across different time points. Our present findings are most likely to reflect bi-directional causality between predictors and reading skills. Longitudinal studies on the prediction of reading and dyslexia in different orthographies will be seminal in order to specify causality (see, for example, Caravolas et al., 2012; Furnes & Samuelsson, 2010; Georgiou, Parrila, & Papadopoulos, 2008).

Finally, an obvious limitation of the current study is that at present, comparable statistical descriptions of the languages and orthographies involved that would allow methodologically adequate quantification of orthographic differences are unavailable. Certainly, the absence of such statistics cannot mean that cross-linguistic studies cannot produce valuable results. The European network NEURODYS created the unique opportunity to analyse unusually large samples of dyslexic and control children with diagnostic and assessment procedures that were parallelized as much as possible across various orthographies. Our rough categorisation of orthographic complexity based on feedforward / feedback consistency certainly underestimates the differences between the orthographies involved and can only be a first and cautious step towards the important enterprise to fully understand the implications of orthographic and linguistic structure on reading development and dyslexia.

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#### Footnotes

<sup>&</sup>lt;sup>1</sup> The analysis by Landerl, et al. (submitted) is based on the typical readers in the NEURODYS project and has 954 participants in common with the current control group

<sup>&</sup>lt;sup>2</sup> There is an overlap of 43 Dutch participants (all controls) and 76 Hungarian participants (32 dyslexic and 44 controls) with Ziegler et al (2010) and 69 Dutch and 178 Hungarian children with Vaessen et al. (2010).

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