#### **ORIGINAL ARTICLE**



# Connectivity between the visual word form area and the parietal lobe improves after the first year of reading instruction: a longitudinal MRI study in children

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#### **Abstract**

Shortly after reading instruction, a region in the ventral occipital temporal cortex (vOTC) of the left hemisphere, the Visual Word Form Area (VWFA), becomes specialized for written words. Its reproducible location across scripts suggests important anatomical constraints, such as specific patterns of connectivity, notably to spoken language areas. Here, we explored the structural connectivity of the emerging VWFA in terms of its specificity relative to other ventral visual regions and its stability throughout the process of reading instruction in ten children studied longitudinally over 2 years. Category-specific regions for words, houses, faces, and tools were identified in the left vOTC of each subject with functional MRI. With diffusion MRI and tractography, we reconstructed the connections of these regions at two time points (mean age  $\pm$  standard deviation:  $6.2\pm0.3$ ,  $7.2\pm0.4$  years). We first showed that the regions for each visual category harbor their own specific connectivity, all of which precede reading instruction and remain stable throughout development. The most specific connections of the VWFA were to the dorsal posterior parietal cortex. We then showed that microstructural changes in these connections correlated with improvements in reading scores over the first year of instruction but not 1 year later in a subsample of eight children (age:  $8.4\pm0.3$  years). These results suggest that the VWFA location depends on its connectivity to distant regions, in particular, the left inferior parietal region which may play a crucial role in visual field maps and eye movement dynamics in addition to attentional control in letter-by-letter reading and disambiguation of mirror-letters during the first stages of learning to read.

**Keywords** Learning to read  $\cdot$  Childhood  $\cdot$  Brain development  $\cdot$  White matter connections  $\cdot$  Myelination  $\cdot$  Visual fusiform regions  $\cdot$  Parietal lobe  $\cdot$  Vertical occipital fasciculus  $\cdot$  Diffusion imaging  $\cdot$  Tractography  $\cdot$  Microstructure

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#### Introduction

The past several decades of functional magnetic resonance imaging (fMRI) research have considerably improved our understanding of the cortical substrates for reading as well as the life-long changes it can induce in the brain (Dehaene et al. 2010b, 2015; Price 2012). Printed words are processed by a largely distributed cortical "reading network", including areas such as the left middle and superior temporal gyri, the left supramarginal gyrus, the left inferior frontal gyrus, posterior parietal cortex, and a region in the left ventral occipitotemporal cortex (vOTC) specialized for recognizing written words termed the Visual Word Form Area (VWFA) (Jobard et al. 2003; McCandliss et al. 2003; Cohen and Dehaene 2004; Dehaene et al. 2015).

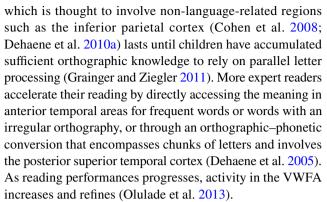
The emergence of the VWFA is the result of a culturally acquired skill. Pre-literate children (Monzalvo et al. 2012;



Dehaene-Lambertz et al. 2018) and illiterate adults show no specific activity for words in this region (Dehaene et al. 2010b), while preference for words develops at this site after minimal reading instruction (Brem et al. 2010; Lochy et al. 2016; Dehaene-Lambertz et al. 2018). Even literates show a weaker activity for unknown writing and false fonts in this region (Dehaene et al. 2010b). The VWFA develops within a mosaic of regions already specialized in processing various categories of visual stimuli (Grill-Spector and Weiner 2014; Dehaene-Lambertz et al. 2018) such as houses (Epstein and Kanwisher 1998), faces (Kanwisher et al. 1997), and tools (Grill-Spector et al. 2001), which are already present as early as 5-6 years (Scherf et al. 2007; Cantlon et al. 2011; Kersey et al. 2015). It is systematically located within the occipitotemporal sulcus (OTS), around tool- and face-processing areas (Jobard et al. 2003), regardless of one's language and writing system (Bolger et al. 2005; Rueckl et al. 2015).

To explain its highly reproducible location, at least two non-mutually exclusive hypotheses have been proposed, namely the shape hypothesis and the biased connectivity hypothesis (Hannagan et al. 2015). The former postulates that the location of a visual category processing area is governed by the local circuitry of the vOTC which is intrinsically apt at recognizing the shapes of objects. In line with this idea, a recent study demonstrated that locally scrambled images of objects, faces, and houses elicited similar responses as intact images, alluding to vOTC's fine-tuning of statistical properties of visual stimuli rather than semantically meaningful categories (Coggan et al. 2016). On the other hand, the biased connectivity hypothesis states that the location for a given visual category processing area is determined by its white matter connections to distant cortical areas apt at further processing the specific type of visual stimuli at hand. This hypothesis has been supported through diffusion MRI (Saygin et al. 2012; Osher et al. 2015) and functional correlation fMRI studies (Hutchison et al. 2014; Stevens et al. 2015) investigating either the structural or the functional connectivity of regions processing faces, objects, scenes, and bodies in the adult brain. A landmark study showed that the vOTC's structural connectivity in children before they learned to read predicts the future functional location of the VWFA in the same children after 3 years of reading experience (Saygin et al. 2016), thus providing direct support for the biased connectivity hypothesis (Dehaene and Dehaene-Lambertz 2016).

However, the process of learning to read comprises many stages over the course of several years, each of which could leave its own signature in the brain (Stuart and Coltheart 1988). During the first stage, children progressively learn grapheme—phoneme correspondences and assemble sequences of letters in a sequence of sounds by moving their attention, for instance from the left to the right side of the word. This slow, serial process of letter-by-letter reading,



Because reading may involve different cortical regions at different stages of instruction, short-term longitudinal studies could be beneficial by honing in on the individual dynamics of the emerging VWFA and reading network. To this purpose, we followed ten children longitudinally as they progressed throughout the first 2 years of reading instruction (initially without any formal reading experience) using functional and diffusion MRI (see Dehaene-Lambertz et al. (2018) for the functional part). Here, we detailed and compared the white matter connections of areas dedicated to processing words, faces, houses, and tools to identify the pathways of each visual category. We aimed to evaluate whether the emerging VWFA—with respect to the surrounding visual vOTC areas—harbors early, specific connections to distant cortical areas already present when children begin learning to read. Given the specificity of the VWFA for reading, we hypothesized that only the connections arising specifically from this region would exhibit reading-related maturational changes, as quantified by changes in diffusion tensor imaging (DTI) parameters. In fact, many previous studies have shown ability-related variations of microstructure in children and adults through voxel-by-voxel analyses (Beaulieu et al. 2005; Deutsch et al. 2005) or by isolating anatomically defined tracts such as the arcuate fasciculus, the inferior fronto-occipital fasciculus, and the inferior longitudinal fasciculus (Niogi and McCandliss 2006; Rollins et al. 2009; Yeatman et al. 2011, 2012; Saygin et al. 2013; Myers et al. 2014; Welcome and Joanisse 2014; Thiebaut de Schotten et al. 2014; Gullick and Booth 2015; Vanderauwera et al. 2015; Broce et al. 2018). As we shall see, our results suggest a crucial role of ventral temporal-to-parietal cortex connections over the first year of learning to read when children need to focus on letter-by-letter reading.

### **Materials and methods**

#### Subjects and longitudinal design

Ten children (five females) were recruited in a longitudinal study (Supplementary Table 1). All were right handed



(except for one boy), native French speakers, with no developmental disorders, hearing or visual deficits. Children had an IQ above 80 and followed the normal French academic curriculum, beginning reading instruction around the typical age of 5.5–6.5 years depending on the month in which they were born compared with the start of the school year in September. Informed consent was obtained from all individual participants included in the study. All of the participants' parents gave their written informed consent for the behavioral tests and MRI scanning. An adapted version of the text was read and given to every participant. They all assented verbally and agreed to write their name on the bottom of the written text as a proof of their will to participate in the study. This study was part of the project "Etude multimodale en neuropsychologie et imagerie du développement cérébral et cognitif et de ses relations avec la variabilité génétique" approved on June 16, 2011 by the ethical committee (CPP Kremlin Bicêtre, N° 11–008).

#### MRI evaluation

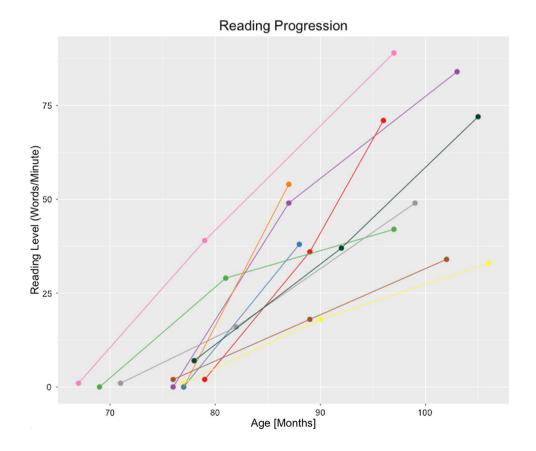
Participants were evaluated behaviorally and underwent MRI scanning longitudinally at six different visits at equal intervals from the beginning to the end of the first school year of reading instruction (mean delay between first and sixth visits  $12.0\pm1.1$  months) in addition to a seventh visit

1 year later for a subsample of children (N=8, mean delay from sixth to seventh visit  $14.5\pm3.3$  months) (Dehaene-Lambertz et al. 2018). Diffusion MRI data, which constitute the focus of this study, were obtained at three time points (TPs) at the first, sixth, and last visits (herein referred to as TP1, TP2, and TP3; mean ages and standard deviations (SD) at TP1:  $6.2\pm0.3$  years, at TP2:  $7.2\pm0.4$  years, at TP3:  $8.4\pm0.3$  years, Fig. 1, Supplementary Table 1), while behavioral and fMRI data were obtained at each visit (Dehaene-Lambertz et al. 2018). All MRI data were acquired on a 3T Siemens Trio machine with a 12-channel head coil.

#### Behavioral evaluation

Before recruitment, all participants' school teachers attested to the children's inability to read. At all visits, behavioral scores were measured in each participant using a French battery of reading-related tasks [see Dehaene-Lambertz et al. (2018)]. Among these scores, we herein focused on the number of isolated words read under 1 min (words/min) as this metric relies on early decoding abilities, can be reliably and objectively measured across children, and is interrelated with other behavioral scores (Dehaene-Lambertz et al. 2018). All children entered the study with little or no ability to read words (mean ± sd words/min at TP1: 1.4±2.1, range 0 to 2, except for one child that could read 7). The

Fig. 1 Reading progression as a function of age in the child cohort. Ten children were followed throughout the first 2 years of reading instruction (each line represents a different child). Shown are the reading scores for the three time points where diffusion MRI data were obtained. Inter-individual differences in age relied on the differing birthday month within the calendar year, compared to the fixed time points on the scholastic calendar (September-June). While all children were poor readers at TP1, their reading accelerated considerably over the course of the first and second years (TP2 and TP3). Note also that the variability in reading abilities across children increased with instruction, some children progressing faster than others





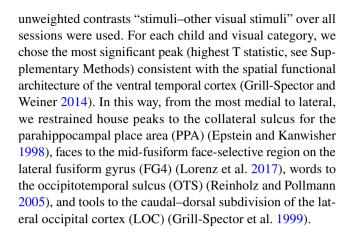
number of correct words read in 1 min (LUM) was 33.4 at the end of the first year (range 16 to 54) and 59.25 for a subset of 8 children who returned for the MRI evaluation at the end of the second year (range 33 to 89), which is within or above the standardized norm at the end of the second year of school, i.e.,  $36.7 (\pm 15.8)$  words per minute (Dehaene-Lambertz et al. 2018) (Fig. 1).

# Preprocessing and analyses of fMRI images for the identification of functional peaks

At all visits, T1-weighted (T1w) anatomical and fMRI images were acquired (Dehaene-Lambertz et al. 2018). Here, we only detailed what is relevant to this particular study, namely the identification of functional peaks for each subject and each visual category, since these individual peaks are further used to define selection regions for tractography (see next section). Among the entire set of visual stimuli used in the functional paradigm, we focused on the functional activations in the left hemisphere for houses, faces, words, and tools (and not numbers and bodies) as they form a mosaic of visual categories from the medial to lateral surface at a similar location on the posterior-anterior axis. The functional paradigm consisted in children viewing categories of visual stimuli presented in 6-s blocks, separated by short resting periods with a fixation cross [details are presented in Supplementary Methods and (Dehaene-Lambertz et al. 2018)]. To stay attentive, they had to detect a rare target (the picture of a cartoon character "Waldo"). For the current analysis, we only considered the six fMRI sessions spanning the first year of reading instruction, for which we had data from the entire child cohort (N=10) sufficient to identify the regions corresponding to the different visual categories (Dehaene-Lambertz et al. (2018) showed that those regions do not change in location).

At each visit, fMRI images were pre-processed by standard procedures with SPM8 in Matlab (http://www.fil.ion.ucl.ac.uk/spm/) as previously described in Monzalvo and Dehaene-Lambertz (2013). Functional images were then normalized onto a study-dedicated template in MNI space.

All analyses were performed at the subject level and not the group level. For first-level analyses, brain responses were modeled based on a general linear model using the canonical SPM hemodynamic response function and its time derivative convolved with each experimental condition block. Movement parameters (translation and rotation) were entered as nuisance variables. For words, we hypothesized that VWFA activity would gradually increase with reading experience over the six sessions (Brem et al. 2010; Dehaene et al. 2010b; Eberhard-Moscicka et al. 2015). We, therefore, constructed "words-other visual stimuli" contrast vectors for each session weighted by the subject's mean-centered reading scores over the six sessions. For houses, faces, and tools,



# Individual definition of category-specific pathways with diffusion MRI

#### Image acquisition and pre-processing of diffusion images

At TP1, TP2, and TP3, diffusion MRI images were acquired with a diffusion-weighted (DW) spin-echo single-shot EPI sequence, with parallel imaging (GRAPPA reduction factor 2) and partial Fourier sampling (factor 6/8). After the acquisition of the b=0 s mm<sup>-2</sup> volume, diffusion gradients were applied along 45 orientations with b=1000 s mm<sup>-2</sup>. 48 interleaved axial slices covering the whole brain were acquired with a  $2 \times 2 \times 2.5$  mm<sup>3</sup> spatial resolution (field of view =  $256 \times 256$  mm<sup>2</sup>, matrix =  $128 \times 128$ , slice thickness = 2.5 mm, TE = 86 ms, TR = 9.6 s).

Diffusion data were processed using the PTK toolkit and the Connectomist software both developed in-house at NeuroSpin (Duclap et al. 2012). DW images were first corrected for motion artifacts using a dedicated strategy (Dubois et al. 2014b), based on two successive steps: (1) automated detection and 2D resampling of slices corrupted by motion or technical problems (e.g., mechanical vibrations and spike noise) and (2) 3D realignment of the 45 diffusion-weighted volumes misregistered due to intervolume motion and distortions stemming from eddy currents. During this procedure, all images were resampled to ensure proper coregistration with anatomical images and to align the anterior and posterior commissures in an axial plane. The majority of the analyses used diffusion data from TP1 and TP2 as we mainly aimed to study connectivity patterns over the first year of reading instruction, and the number of included subjects was reduced at TP3 (only 8/10 children). This latter time point was only used for microstructural analyses as detailed below in "Creation of tractography masks and selection regions".

#### Creation of tractography masks and selection regions

At TP1 and TP2, individual tractography masks were constructed from brain segmentations of each subject's



anatomical images. To do so, native T1w images were processed with the BrainVISA Morphologist pipeline (Fischer et al. 2012). A white matter segmentation with skeletonized sulci was eroded by 1 voxel to serve as a tractography mask (Guevara et al. 2012). To compute selection regions for tractography, we further identified the superficial white matter by eroding the tractography mask by 1 voxel and considered the subtraction between the eroded tractography mask from the original mask (referred to as the morphological gradient by erosion).

For each child and each visual category, the selection region was generated based on functional peaks in the left hemisphere identified based on fMRI data in the common space as detailed above. Selection regions served to reconstruct the connectivity belonging to the functional patch of cortex for each visual category (see section "Tractography"). A functional peak common across time points was used to ensure that reconstruction of each visual category's connectivity was performed at the same spatial location. After denormalization to native T1w space, each individual functional peak (supposed to be within the cortical sheet) was projected to the closest voxel of the superficial white matter sheet and was geodesically dilated by a 7-mm sphere within this sheet to respect the 3D geometry of the fusiform territory (Fig. 2a). This choice of dilation radius allowed for maximum coverage of each peak with minimal overlap of two different visual categories (for instance, the closest geodesic distance was on average 16.1 mm for words and faces, i.e. more than twice the dilation radius). While we could have used the spatial extent of the fMRI activations to create selection regions for tractography, this would have implied other methodological a priori choices, such as the choice of statistical threshold, correction for multiple comparisons, and whether to apply them on the cluster of voxel level, which would still result in a mixture of false positives and negatives. Despite some overlap of the categories of selection regions in T1w space, the next processing step ensured that each selection region covered a unique surface for tractography.

To perfectly overlay the tractography mask and selection regions onto the DW images despite geometric distortions, we matched native T1w images and  $b=0 \text{ s mm}^{-2}$  images for each subject using a non-linear registration method guided by B-splines Free-Form Deformations (Rueckert et al. 1999; Lebenberg et al. 2015). This transformation was applied to the respective tractography masks with a nearest neighbor approximation. To regulate the final size of the selection regions, each region was transformed with a cubic interpolation and individually thresholded such that the final selection region would be closest to 30 voxels without any overlap with nearby region for other visual categories (final selection region size ranged from 27 to 36 voxels). Using a repeated-measures ANOVA, we verified that selection region size

did not differ significantly between categories (F(3,27)=1.3, p=0.29) or time points (F(1,9)=1.4, p=0.54; ezANOVA package in R) (Lawrence 2015). With this strategy, we aimed to create localized and specific selection regions that probably reflect the most active patch of cortex of the vOTC for a given visual category.

#### **Tractography**

To resolve simple crossing fiber configurations, DW images were analyzed based on a fourth-order analytical Q-ball model (Descoteaux et al. 2007). Individual 3D tractography was performed with a deterministic algorithm using regularized particle trajectories with an aperture angle of 45° (Perrin et al. 2005; Dubois et al. 2016). Four starting fiber points per voxel of the tractography mask were considered to generate fibers over the whole brain. For each visual category, we selected streamlines from the whole-brain tractogram that crossed the respective selection region and discarded those that crossed regions of another visual category. The resulting tracts were further converted to 2D maps by counting the number of streamlines per voxel.

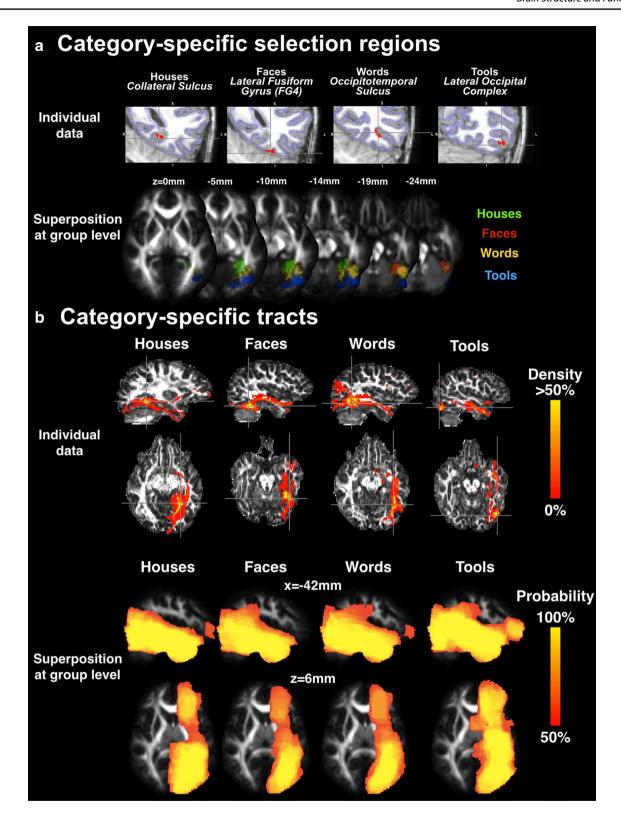
## **Group-level analyses of diffusion MRI data**

#### **Connectivity analyses**

To perform group-level analyses across time points and across visual categories, we required a reliable registration technique within and across subjects and opted for DTI-TK (Zhang et al. 2006) which optimizes registration of diffusion tensor data by overlapping corresponding anatomical areas with respect to the orientation of the entire diffusion tensors. This approach has been shown to result in better intersubject registration in white matter pathways with respect to scalar-based registration strategies such as with FA maps (Wang et al. 2011). Here, we constructed a temporally unbiased population-specific template considering all longitudinal data (TP1, TP2 and TP3) for all children as described in Keihaninejad et al. (2013), and individual diffusion data were registered onto this template. All voxel-wise analyses were performed in this space. For visualization purposes, we computed the FA map of our study-specific tensor template and registered it to the FMRIB58\_FA template using Advanced Normalization Tools (ANTs). We then used the corresponding warp field to project all statistical results in MNI space.

To enable comparisons across the first two time points (TP1 and TP2) for all subjects and categories, individual maps of tracts were (1) warped to this common template, (2) divided by the max value to create density maps (scaled between 0 and 100%), and (3) smoothed with a modest 3-mm Gaussian kernel to slightly expand the spatial extent





of each tract while conserving its specificity, similar to (Bouhali et al. 2014). For each visual category, these subject-level density maps were binarized and averaged over subjects to create a group-level probability map.

The voxel-wise connectivity analyses specified below were performed on the subject-level density maps with FSL's randomise tool (Winkler et al. 2014) using 5000 permutations and the threshold-free cluster enhancement



**◄Fig. 2** Characterization of category-specific selection regions and tracts. a Selection regions: top row: for each visual category, the selection region (in red) was identified for each subject based on functional peaks, projected, and dilated within the sub-cortical white matter segmentation (shown in purple on T1w images). Visual categories are presented from the more medial to the more lateral representations (from the house to tool processing regions). Bottom row: the repartition of locations of the selection regions over the children group is presented on selected axial slices of the subject-specific FA template in MNI space. Each patch of sub-cortical white matter is clearly attributed to a single functional selection region. b Categoryspecific tracts: top rows: the density maps of streamlines were computed for each subject and each visual category (same subject as in part a). Color bar represents the percentage of the maximal streamline number passing through a voxel. Bottom rows: tract probability maps were computed over the group by normalizing and averaging the binarized and smoothed individual density maps. Regions of at least 50% overlap over our child cohort are shown on a sagittal and axial slice in MNI space

(TFCE) method (Smith and Nichols 2009). To avoid statistical differences driven by few subjects, each analysis was restrained to a mask consisting of voxels where the group-level probability for a given visual category was higher than 50% as in Bouhali et al. (2014). We herein report results significant at a threshold of p < 0.05, familywise error (FWE) corrected, based on the TFCE statistical image.

The first analysis consisted in evaluating whether category-specific connections changed significantly over the first year of reading instruction. We thus performed a voxel-wise paired *t* test comparing the density maps for each visual category at the two time points (TP1 vs TP2) over the children group, controlling for age and reading scores.

The second analysis consisted in testing the specificity of each visual category's connectivity. Since in previous analysis, we found no significant differences between the two time points for any category-specific connectivity (see "Results"), we entered density maps of all visual categories from both time points into a repeated-measures analysis of co-variance (ANCOVA) with two within-subject factors (visual category and time point) and two within-subject covariates (age and reading scores). Subjects were treated as a random factor. We tested the specific connectivity of the region for a given visual category against all others (i.e. 3\*category-specific density maps—the 3 other maps). The analysis was restrained to the union of masks for all visual categories with group-level probability higher than 50%.

As an additional analysis, we contrasted the face vs word connectivity not only to (1) reproduce previous findings (Bouhali et al. 2014; Saygin et al. 2016), but also to (2) control for a possible bias due to the spatial location of the functional selection regions for tractography. Indeed, the VWFA is located between the face and tool regions, and its connectivity, therefore, has two tracts in its immediate vicinity with similar trajectories. On the other hand, the houses and tools regions were, respectively, the most medial and lateral, and

their tracts thus had minimal overlap with other category-specific tracts. These advantageous regions for house and tool categories could have resulted in more tracts captured by many fasciculi of the ventral occipitotemporal cortex. As detailed below, the connectivity specifically related to the VWFA differed depending on the stimuli introduced in the model. Given this model dependency, we aimed to concentrate on the most specific VWFA connectivity that we could identify by controlling for the connections of the other surrounding visual areas. The subsequent microstructure analyses were, therefore, conducted by considering the results of the analysis with all four visual stimuli.

#### Microstructure analyses

We characterized the microstructure of connections specific to the cortical region processing each visual category with the hypothesis that one's own learning experience can induce white matter changes observable with diffusion MRI [for a review, see Zatorre et al. (2012)], notably myelin formation or remodeling. Such maturational changes are mostly represented by increases in fractional anisotropy (FA) or decreases in radial diffusivity (RD), two parameters which can be estimated with diffusion tensor imaging (DTI) (Dubois et al. 2014a). Here we also assessed changes in axial diffusivity (AD) to see if correlations were related to a specific direction along the diffusion tensor.

For each child, FA, RD, and AD maps were calculated from the warped tensor images (group space) with DTI-TK functions. For each visual category and each time point, we analyzed the microstructure of the specific tract clusters obtained from the aforementioned voxel-wise ANCOVA. We focused on these group-level category-specific clusters and not on each subject's native connectivity to comply with the high overlap between the connectivity of the various visual categories. By restraining our analysis to these clusters, we were able to focus on the microstructural properties of connections for a particular visual category with more specificity and assess if effects observed during the first year generalized to the second year of reading instruction. Within each category-specific cluster, we calculated the average FA, RD, and AD by weighting each voxel by the respective probability of each tract over the children group for each TP. To avoid including non-brain or cerebellar regions in the calculation of the average DTI parameters due to spatially smoothing the connectivity maps, we calculated a cerebrum mask by summing and binarizing the entire cortical and subcortical Harvard-Oxford Atlas (with the exception of the brainstem) and back-projected it onto our study-specific template. Finally, we computed differences in DTI parameters between TP1 and TP2 as well as between TP2 and TP3.

Regarding statistical analyses, we first evaluated whether DTI parameters changed between each pair of time points



using paired t tests against the null hypothesis over the children group (N=10 for TP1-2, N=8 for TP2-3). We did not compare TP1 and TP3 to not lose the temporal dynamics provided by TP2. Second, we evaluated the relationships with improvement in reading scores. We used partial correlations in R software (Kim 2015) to test the relationship between reading improvements and microstructural changes across pairs of time points, all while controlling for the possible confounding effects of increasing age (Adibpour et al. 2018). For each kind of analysis (paired t test, partial correlation) regarding each DTI parameter, a false discovery rate (FDR) correction was applied to correct for multiple comparisons across the four visual categories (statistical threshold for significant relationships:  $p_{\rm cor} < 0.05$ ).

### **Results**

# Connectivity of vOTC category-specific regions

In each child, we identified category-specific regions in the left hemisphere based on functional peaks constrained by anatomical localization. The spatial localization was consistent across children (Supplementary Table 2 describes the individual peak coordinates). Houses were the most medial in the collateral sulcus (mean MNI coordinates x, y, z over the group: -30, -50, -7), followed by faces on the fusiform gyrus (-36, -53, -21), words in the occipitotemporal sulcus (-43, -58, -14), and tools being the most lateral and posterior to words in the occipitotemporal sulcus/posterior inferior temporal gyrus (-41, -70, -10) (Fig. 2a).

In each child, the absolute connectivity for each visual category was visually rather similar (Fig. 2b, Supplementary Fig. 1). Tracts showed connections along the ventral occipitotemporal lobe similar to the fibers of the inferior longitudinal fasciculus (ILF) in addition to long-range connections to the inferior prefrontal region likely via the inferior fronto-occipital fasciculus (IFOF) and finally more superior connections to the occipito-parietal junction (Supplementary Fig. 1). There was high variability across children in the cortical terminations in more superior regions of the brain (parietal, frontal, pre-frontal) for all categories. However, these variable connections were unaccounted for in the next statistical analyses below which only considered voxels where tracts were present in at least half of the subjects (N=5).

# Stability of connectivity patterns over the first year of reading instruction

The first voxel-wise ANCOVA with FSL's randomise tool showed that tract topography did not differ significantly between TP1 and TP2 for any visual category (all  $p_{cor}$  >

0.15), in agreement with the stability of major long-distance connections across development and prior to reading instruction. Changes in age or reading score did not correlate with any difference in connectivity between the two time points (all  $p_{\rm cor} > 0.12$ ), suggesting that this stable connectivity was not related to inter-individual differences in age or learning ability. In light of this result, we present below the group-level probability maps of each visual category combined over both time points (Fig. 2b).

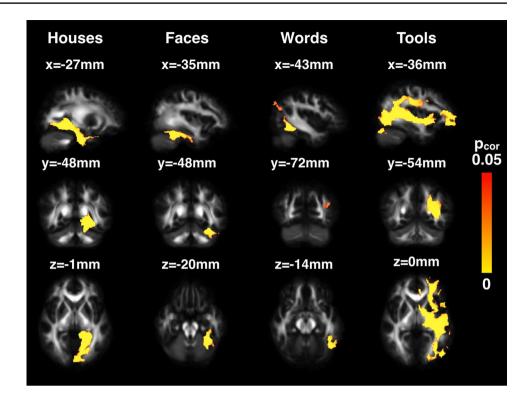
# Differences in connectivity patterns between visual categories

Visually, we observed on the group-level probability maps that the most appreciable differences in connectivity across visual categories were for houses, whose tracts densely occupied the inferior medial face of the brain, and for tools, whose tracts were densely connected to the lateral surface (Fig. 2b). The second voxel-wise ANCOVA over TP1 and TP2 quantitatively revealed the specific connectivity for each visual category (Fig. 3), from the most medial to lateral regions. The house region showed strongest connectivity towards the medial surface of the left hemisphere extending from V1 to the anterior portion of the hippocampus. The specific connectivity of the face region was limited to the local ventral temporal surface and showed no long-range connections stronger than for other visual categories. For the VWFA, in addition to strong proximal connections to surrounding cortices, notably the inferior temporal gyrus, we found preferential distal connections to regions extending superiorly and posteriorly to the occipito-parietal junction. Finally, the tool region had the most diffuse connections to the middle and superior temporal gyri, parietal lobe, and the frontal lobe through the external capsule.

Upon restraining the comparison to solely the word and face tracts, the connectivity analysis revealed that the facespecific cluster differed very little from the full analysis including the house and tool tracts (Supplementary Fig. 2). On the contrary, the word-specific cluster occupied a considerably broader area of the ventral surface extending from the occipital to temporal poles. Logically, the parietal connections were still detected. Tracts following the typical trajectory of the arcuate fasciculus were visible, yet in our cohort, less than 50% of subjects had connections reaching the frontal lobe through this pathway. The word-specific cluster also reached up and extended along the middle temporal gyrus (bottom row in Supplementary Fig. 2). Compared to our original analysis, the most striking difference was the frontal terminations of this cluster through the external capsule, which was previously occupied by the tool-specific cluster.



Fig. 3 Specific connectivity of the visual category processing regions. For each category, statistical analyses showed the connectivity clusters with different location compared with other categories. Color bar represents the FWE-corrected p value ( $p_{\rm cor}$ ). Slice coordinates are given in MNI space



# Microstructural changes in specific connections related to reading improvement

Lastly, we characterized the changes in microstructural properties of the specific connections for a cortical region processing one visual category over others based on DTI quantification in each cluster. Between TP1 and TP2, only the tool-specific cluster showed a decreasing RD (t = -3.23,  $p_{\rm cor} = 0.041$ ) (Supplementary Table 3). We proceeded to investigate how learning to read might specifically affect microstructural changes over the first year of reading instruction and observed that only the word-specific cluster showed DTI changes related to improvements in reading score, after controlling for age increase (partial correlation between changes in RD and reading scores: r = -0.81,  $p_{cor} = 0.03$ ; same trend for AD: r = -0.74,  $p_{cor} = 0.09$ ) (Fig. 4; Table 1). More precisely, those children who improved in the number of words they could read per minute during the first year of instruction also showed more pronounced decreases in RD in the connections between the VWFA and the occipitoparietal junction, suggesting a specific maturation in relation to fiber myelination during the learning process.

Regarding the second year of learning instruction (analyses between TP2 and TP3 over the same category-specific clusters), we again observed a trending decrease in RD in the tool-specific cluster (t=-3.32,  $p_{\rm cor}=0.051$ ), and an increasing FA in all clusters except for words (houses: t=4.58,  $p_{\rm cor}=0.005$ ; faces: t=2.76,  $p_{\rm cor}=0.038$ ; tools: t=4.71,  $p_{\rm cor}=0.005$ ) (Supplementary Table 3).

Subsequent partial correlations between DTI indices and improvement in reading score, controlling for increase in age, revealed no significant correlations in any category-specific clusters (all *p*cor>0.4, Table 1).

## **Discussion**

In this study, we had the rare opportunity to longitudinally evaluate the brain organization in ten children during the first year of reading instruction as well as a year later in a sub-group of eight subjects. We were able to reconstruct the specific structural connections of the emerging VWFA in addition to the already present regions processing for houses, faces, and tools, using selection regions for tractography that were functionally defined in individual children. Applying a state-of-the-art registration technique and a statistical approach to compare tracts in a temporally unbiased and reliable manner despite the small sample size, we showed that cortical areas for each visual category revealed a differential set of specific connections. Furthermore, only the word-specific connections to inferior parietal regions exhibited microstructural changes in line with reading improvements over the course of the first year of instruction, but not over the second. We hereby discuss the relevance of these findings in regard to the beginning stages of learning to read.



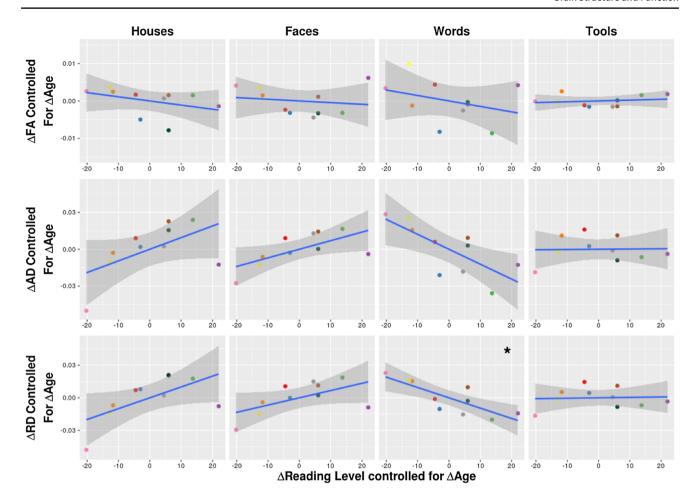


Fig. 4 Tract-specific microstructural changes over the first year of reading instruction. Improvements in reading level (words/minute) between the beginning and the end of the first school year of reading instruction ( $\Delta$ =TP2 - TP1) were compared to changes in fractional anisotropy (FA), axial diffusivity (AD), and radial diffusivity (RD) within the specific connectivity clusters of each visual category (Fig. 3) after controlling for age increase. Only the word-specific tract

showed a significant correlation between RD and reading improvement (\* $p_{\rm cor}$  < 0.05, false discovery rate corrected), suggesting that this learning relies and/or induces specific microstructural changes within the connections dedicated to this cognitive process. Best-fit lines with 95% confidence intervals are shown. Each subject is represented by the same color dot as in Fig. 1

**Table 1** Changes in DTI parameters with reading scores controlling for age

	Houses r/p/p <sub>cor</sub>	Faces r/p /p <sub>cor</sub>	Words r/p/p <sub>cor</sub>	Tools r/p/p <sub>cor</sub>
TP2-TP1				
$\Delta FA$	- 0.388/0.302/0.692	- 0.154/0.692/0.692	- 0.329/0.388/0.692	0.187/0.629/0.692
$\Delta \mathrm{AD}$	0.567/0.112/0.149	0.653/0.056/0.113	- 0.741/0.022/0.09	0.025/0.949/0.949
$\Delta RD$	0.621/0.074/0.139	0.577/0.104/0.139	- 0.811/0.008/0.032*	0.051/0.895/0.895
TP3-TP2				
$\Delta FA$	0.132/0.777/0.789	0.465/0.293/0.586	0.125/0.789/0.789	0.557/0.194/0.586
$\Delta \mathrm{AD}$	- 0.634/0.126/0.505	- 0.456/0.303/0.607	- 0.224/0.629/0.629	- 0.248/0.591/0.629
ΔRD	- 0.658/0.108/0.433	- 0.454/0.306/0.6	- 0.211/0.65/0.65	- 0.344/0.45/0.6

Partial correlations are shown for changes ( $\Delta$ ) in DTI indices and reading scores (words/min) over the first year (TP2–TP1) and second year (TP3–TP2) of reading instruction corrected for changes in age. Pearson's r is presented together with the uncorrected p values, and values adjusted with a false discovery rate (FDR) correction ( $p_{cor}$ ). Only the word-specific tract showed a significant correlation over the first year (\* $p_{cor}$ <0.05): independent of age increase, RD decreases with the reading score, suggesting that learning to read affects or relies on the microstructure of the tract. See Fig. 4 for a graphical representation of these results



# Connectivity of the ventral occipitotemporal cortices

On the whole, the absolute connectivity of the VWFA in children showed similar trajectories as for regions processing houses, faces, and tools, including the inferior longitudinal and fronto-occipital fascicles (ILF and IFOF), and temporoparietal white matter tracts. Only a few subjects had connections from the VWFA extending into either the long or posterior segments of the arcuate fasciculus. Compared with other visual categories, the word-specific connectivity consisted of immediate local connections to the inferior temporal gyrus, and the only long-range connections were those passing superiorly and posteriorly to the occipito-parietal junction and inferior parietal cortex.

Before discussing these results, we first address certain aspects of our methodology. While low statistical power due to the small sample sizes is a known problem in neuroimaging studies on reading in children (Ramus et al. 2018), a landmark study by Saygin et al. (2016), which showed that the VWFA connectivity predates its functional emergence, had a comparable sample size (N=11) as ours (N=10). In fact, our small sample size was partly a compromise for the longitudinal nature of our study, with our child cohort being scanned at seven different time points and diffusion MRI data acquired at three of them. This allowed us to carefully study the early vOTC connectivity and the short-term evolution of its microstructural changes at close intervals. Since our analyses relied on in-sample correlations, our study serves to report and describe—but not predict—changes and their relationships with reading improvements. While recent studies with larger sample sizes have acquired preand post-reading instruction imaging data in children (Myers et al. 2014; Vanderauwera et al. 2018), to our knowledge, no study has acquired similar data at such close time points. Nevertheless, the findings we observed between TP2 and TP3 might have been influenced by the lower number of subjects (N=8) than for TP1-TP2 (N=10). For this reason, as well as losing important chronological information, we did not compare TP3 and TP1.

In addition, the resulting word connectivity cluster may have been susceptible to false negatives not only from smoothing but also from controlling for the connectivity of three adjacent functional regions. While our *b* value of 1000s mm<sup>-2</sup> could be considered low for resolving crossing fibers, it is comparable to that used in related studies so far (Saygin et al. 2016; Broce et al. 2018). Here, it cannot be ruled out that future studies at higher *b* values will allow researchers to highlight subtle differences in reading connectivity throughout development. Despite these drawbacks, other aspects of our methodology were carefully considered to ensure the robustness of the findings. First, we acquired 45 DW images in non-collinear directions and

used a specific strategy to correct for motion artifacts that allowed us to not discard any data. Given the limited amount of scanning time available in young children, this type of acquisition probably approaches the maximum of what is reasonably feasible. Second, to register data over the children group, we employed DTI-TK, an optimal technique demonstrated to better align white matter structures than other software (Wang et al. 2011). Finally, our definition of selection regions for tractography was tailored to each subject's functional peaks and local cortical morphology, and we investigated the connectivity of several functional areas, more than what has usually been done.

The most similar study to ours was conducted by Saygin et al. (2016) who scanned children before and 3 years after the beginning of reading instruction with diffusion MRI and fMRI, focusing on the cortical terminations of tracts. They were able to show that the cortical connectivity from vOTC seeds at the pre-reading time point (~5 years of age) predicted the functional location of the VWFA within the vOTC 3 years later. Here, we further studied the microstructural changes in the specific white matter connections for each visual category and related these changes to age and reading improvement. In particular, we showed not only that the VWFA in children has early, specific connections with respect to the surrounding cortex but also that they mature in response to reading instruction.

The biased connectivity hypothesis (Hannagan et al. 2015) suggests that predominant direct connections to language areas, such as the superior temporal gyrus or the inferior frontal gyrus, would explain the consistent location of the VWFA in adults and throughout the process of learning to read. VWFA did project to some of these regions (Fig. 2). However, we did not find evidence that these connections were unique to VWFA. The most prominent word-specific connections in our child cohort terminated in parietal cortex, and conversely, it was the connections originating from the tools region in the lateral occipital cortex which had the most projections to frontal and temporal language areas.

At first sight, these results might seem surprising, as other studies have suggested that the VWFA does indeed harbor connections to language areas in adults and 7–11-year-old children (Epelbaum et al. 2008; Yeatman et al. 2011; Bouhali et al. 2014). In fact, there might be different non-exclusive explanations for this apparent discrepancy. First, we considered four selection regions for tractography that were relatively close along the cortical surface, so reconstructed tracts had some spatial vicinity with each other. This might be problematic for tracts originating from the middle regions (i.e., for faces and words) since the possible overlap was related to two neighboring tracts rather than one for tracts from the external regions (i.e., for houses and tools). When we re-ran the same statistical analysis keeping solely the face and word connections as in previous studies (Bouhali

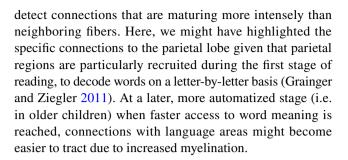


et al. 2014; Stevens et al. 2017) and removing the tool and house connections, we observed a much more diffuse cluster for word-specific connections (including the not only previously reported parietal connections but also more ventral projections from the occipital to temporal poles in addition to and long-range connections to the inferior frontal lobe through the external capsule) (see Supplementary Fig. 2), while that for faces remained virtually unchanged. The face connectivity likely did not change as it was already rather separate from the house peaks along the lateral-medial axis, whereas for words and tools, their respective locations were much closer (see Supplementary Table 2). Results on the word-specific connectivity thus strongly differed depending on the neighboring tracts that are considered in the statistical analysis. Consequently, it remains difficult to compare our findings obtained using four visual category areas with previous studies that only investigated the connectivity of two areas at once.

Regarding the location of the selection region for words, it is interesting to note that the adult VWFA takes part in a posterior-anterior functional gradient of word-sensitive areas, going from posterior regions sensitive to certain line arrangements to anterior regions preferentially responding to the most frequent recurring substrings and small words in one's learned script (Dehaene et al. 2005; Baker et al. 2007; Vinckier et al. 2007; Chan et al. 2009; Seghier and Price 2011). Anatomical connectivity reflects this posterior-anterior gradient, as the connectivity with oral language regions increases from posterior to anterior regions (Fan et al. 2014; Bouhali et al. 2014). A roughly similar functional gradient is visible in children (van der Mark et al. 2009; Monzalvo et al. 2012) even if it is less differentiated than in adults (Olulade et al. 2013), suggesting that functional specificity gradually develops along years of reading instruction and practice. However, the average coordinate that we identified in children ([-43.2 mm, -58.0 mm, -14.0 mm] in MNI space) is very close to the adult VWFA ([- 42 mm, 57 mm, - 15 mm] in (Cohen et al. 2002)), and the individual peaks remained at the same location during the first 2 years of reading instruction (Dehaene-Lambertz et al. 2018), suggesting that tractography was performed from similar regions as in other studies.

Because these children were followed up longitudinally during 2 years, it was possible to retrospectively examine the response of the VWFA voxels before they learned to read. These voxels were weakly but steadily selective to the tool category (Dehaene-Lambertz et al. 2018). This functional overlap, together with limits in scanning resolution and inter-subject averaging might explain why the word and tool regions appears to share overlapping connectivity in the present study.

Furthermore, since tractography performance depends on the fibers' anisotropy and myelination, one might expect to



### Parietal projections of the VWFA

The parietal lobe is a complex associative cortex involved in a plethora of higher cognitive functions including mental subtraction, saccades, finger pointing, grasping, as well as converting orthography to phonology and to semantics (Simon et al. 2002; Vigneau et al. 2006). Most notably, the parietal cortex is implicated in the control of visual attention (Vidyasagar 1999; Saalmann et al. 2007). This type of control is essential during the first stage of reading (Vidyasagar 1999; Pammer et al. 2006; Grainger and Ziegler 2011) when children learn to direct their attention from left to right and top to bottom along the page (in occidental languages) and to disambiguate mirror-letters such as "b" and "d" (Dehaene et al. 2010a).

So far, several fMRI studies have observed co-activation of the parietal lobes with the VWFA in many circumstances. Adults recruit it during serial effortful reading of words that are distorted through rotation, increased letter spacing, hemifield shifting, or low contrast (Cohen et al. 2008; Rosazza et al. 2009; Kay and Yeatman 2017). Moreover, the increased activation of the parietal lobes in viewing such distorted words is accompanied by more posterior activity of the VWFA than when viewing words in their normal format (Cohen et al. 2008), perhaps due to the ventral-to-dorsal connections of this area (Yeatman et al. 2014). These studies suggest that when the automatic parallel processing of bigrams cannot be performed, subjects revert to letter-by-letter reading, thus relying more on early-level word processing and attentional control involving the parietal cortex. As an illustration, one reported patient who had bilateral occipitoparietal atrophy with an intact vOTC was unable to read words presented vertically, words with double-spaced letters, or words in mirror-reversed form; however, reading words in their normal, horizontal form was preserved (Vinckier et al. 2006). Strong attention to normally presented words and consonant strings can also elicit activity of the dorsal visual stream in the occipito-parietal junction and intraparietal sulcus (IPS) (Cohen et al. 2003; Cattinelli et al. 2013). The activity of the inferior IPS might also reflect top-down modulations on the VWFA directly related to task demands on word recognition (Kay and Yeatman 2017) or the need to encode letter position (Ossmy et al. 2014).



Altogether, these studies suggest that a major role of the parietal lobe in reading is to focus attentional control on novel or unusual presentations of visual words. Behaviorally, this activity is predominantly reflected in letter-byletter reading, increasing the reading time with word length (Cohen et al. 2008), an effect that progressively disappears when reading becomes more automatized (Zoccolotti et al. 2005). Because of their lack of expertise and automaticity in word recognition, children may particularly recruit this pathway at the onset of reading acquisition. Indeed, the analyses of our children's functional responses throughout the first year of reading acquisition revealed transitory parietal activation in response to words that disappeared after two years (Dehaene-Lambertz et al. 2018). The present results indicate that, during the same time period, myelination of the connections between VWFA and parietal cortex changed. This observation is also congruent with a comparison done between illiterate and ex-illiterate adults, which found that literacy enhanced the density of gray matter in dorsal occipito-parietal regions (Carreiras et al. 2009). The authors also attribute an important role to the dorsal stream at the beginning stages of reading.

However, beyond attentional mechanisms, eye movement dynamics could also have played a role in driving the observed microstructural changes. A recent study showed that, when reading, children exhibit stereotypical eye movement patterns related to the cortical locations for visual field coverage, which are not the same for adults (Gomez et al. 2018). In children, word-sensitive regions of the vOTC are not located on patches of cortex centered on the fovea, but are slightly eccentric; therefore, they naturally view words slightly off-center such that cortical visual field coverage falls on the center of the word. On the other hand, cortical activity for words in adults is shifted towards the fovea, causing them to place their gaze on the center of words. Since the intraparietal sulcus harbors visual field maps involved in eye movements (Levy et al. 2007), is also connected to the VWFA, and modulates its activity in relation to task difficulty (Kay and Yeatman 2017), the microstructural changes in connectivity between the VWFA and parietal cortex may also be the result of eye movement dynamics that occur in reading children.

These connections might coincide with the description of the vertical occipital fasciculus (VOF) by Yeatman et al. (2014), which has recently been proposed to participate in the circuitry of the VWFA (Wandell and Yeatman 2013). The VOF is posited to relay ventral word-shape recognition systems and dorsal visual systems and lesions to this fasciculus can result in pure alexia (Greenblatt 1976). Its most anterior boundary is near the midpoint of the mid-fusiform sulcus (Yeatman et al. 2014; Takemura et al. 2015) and also behind the cortical projections of the posterior arcuate fasciculus (Weiner et al. 2016). It projects superiorly lateral

to the IFOF and ILF and terminates in the lateral occipital, inferior parietal lobe, or both. In our case, the more significantly prominent tracts belonging to the VWFA connections projected all the way up to the inferior intraparietal sulcus and the lateral occipito-parietal junction. A study found that the VOF reconstructed with diffusion tractography did indeed connect the intraparietal sulcus to functional peaks of the VWFA in eight out of nine adults (Kay and Yeatman 2017). In our cohort, we found that this pathway was also present in the majority of our children (N=7). Our findings suggest that the VOF might play a crucial role in the early-reading stage. This idea was recently corroborated by a complementary cross-sectional study in children, which analyzed changes in dissected tracts of the reading network (Broce et al. 2018).

# Microstructural changes in the word-specific connections with learning to read

As for the specific connectivity between the emerging VWFA and the inferior parietal lobe, predating reading instruction, we showed that an increase in reading ability over the first year of learning correlated with a decrease in radial diffusivity (RD) in only these connections and independent of age increase. Decreasing RD may be indicative of fiber organization, increased myelination, myelin remodeling, astrocyte changes, or angiogenesis (Dubois et al. 2014a), notably when learning a new skill (Zatorre et al. 2012) or increasing the speed of neural information as suggested for visual processing in infants (Dubois et al. 2008; Adibpour et al. 2018). In our child cohort, it thus seems that the connections between the word-specific vOTC and the parietal cortex are involved in the learning process and are mediating crucial information during the first stages of learning to read, which leads to their specific myelination. Interestingly, we observed no correlation in terms of fractional anisotropy; however, this may be explained by the fact that the VOF is a thin fascicle crossed by many fibers (Yeatman et al. 2014; Takemura et al. 2015), which complicates the interpretation of FA compared with RD changes when some pools of crossing fibers become myelinated (Dubois et al. 2014a). Most importantly, no DTI changes in any other category-specific connectivity correlated with the improvement in reading scores, which further reinforced the myelination specificity for word-specific tracts. In fact, isolating the specificity of each visual category's connectivity was necessary to observe these domain-specific maturational changes. In a post hoc analysis, we used the non-constrained global connectivity maps (shown in Supplementary Fig. 1) to perform the same correlation analysis. As expected, global changes in diffusion parameters were not able to reflect reading-related improvements (all  $p_{cor}$  >



0.29, Supplementary Table 4), which remained unique to the word-specific connectivity.

It seems that this reading-related maturation of these connections was also specific to the first year of learning, as we did not observe similar relationships between RD decrease and reading score in the same region over the second year of instruction, but these findings only relied on a sub-group of eight children. Moreover, the variability of changes in diffusion parameters was rather large across children which, combined with the small sample size, could have possibly masked certain effects (Supplementary Table 3).

The corpus of diffusion MRI studies related to reading is abundant; yet, to our knowledge, we are the first team to report changes in vOTC-to-parietal fibers with reading improvements. We provide different explanations as to why no such relationships have heretofore been reported. First, many previous studies relied on ROI-based investigations in which this white matter region was not considered (Rollins et al. 2009; Cui et al. 2016) or used tractography to delineate other white matter bundles (Lebel and Beaulieu 2011; Vandermosten et al. 2012; Saygin et al. 2013; Gullick and Booth 2015; Vanderauwera et al. 2015). Second, for whole-brain voxel-based investigations that could have identified local correlations in the vOTC-to-parietal white matter region, most of the studies recruited children well after they were able to read (Beaulieu et al. 2005; Deutsch et al. 2005; Odegard et al. 2009; Rimrodt et al. 2010). For the few longitudinal studies with larger sample sizes that acquired baseline data prior to reading instruction, the follow-up scans also fell several years after the first year of learning to read (Schmithorst et al. 2005; Myers et al. 2014; Saygin et al. 2016; Vanderauwera et al. 2018), making it difficult to capture short-term consequences of this learning mechanism. One recent study, however, reported relations between diffusion metrics of the VOF in both hemispheres and phonological awareness in a cross-sectional study of 20 children aged 5–8 years old (Broce et al. 2018). The authors mentioned potential involvement of the right hemisphere in early literacy but suggested that activity might shift to the left hemisphere. Our observed correlations between early microstructural changes of the left vOTC-to-parietal white matter and reading improvements support this hypothesis.

We here propose that the vOTC-to-parietal connections are maximally relevant at the beginning stages of learning literacy and would, therefore, exhibit specific, maturational signatures during this short time frame, and not later on. Whereas the intense myelination of the vOTC-to-parietal connections is specifically related to reading improvement during the first year of instruction, these connections might be less solicited during the second year as reading becomes less effortful. Indeed, as children grow older and improve their reading skills, whole-word reading becomes automatic and goes beyond letter-by-letter decoding. Children would,

therefore, gradually rely less on parietal resources and more on anterior portions of the VWFA territory directly connected to language areas, possibly via the IFOF and AF. Nevertheless, these results should be validated in a larger cohort due to the relative small sample size of the present study.

### **Conclusion**

We reported that the early vOTC connectivity predates reading instruction and already demonstrates specificity to visual categories in 6-year-old children. For words, this specific connectivity involves white matter fibers to the dorsal posterior parietal cortex, and their myelination is uniquely related to reading improvement during the first year of instruction. These findings support children's transient reliance on the parietal lobe for attentional control over novel words and letter-by-letter reading in addition to possible visual field map and eye movement dynamics during the first stages of learning to read. The role of these connections is likely maximal at the onset of learning when parietal resources are highly solicited to manage the strong attentional demands of effortful grapheme-phoneme decoding. Future studies should reproduce these findings in a larger cohort of children in a longitudinal follow-up with possibly more time points throughout the first year of reading and years beyond. It would then be conceivable to follow the evolution of the VWFA location and its connectivity until the adult stage. In addition, the vOTC-to-parietal connectivity's role in decoding novel words and symbols might be investigated in proficiently reading adults that would be trained to automatize reading in unfamiliar formats, such as vertically. This would constitute a reliable study to control for confounding effects observed with young children such as brain maturation and inter-individual variability in attentional control. We would expect that sufficient training in adults would involve specific microstructural changes in the vOTC-to-parietal white matter as a function of reading ability.

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### **Compliance with ethical standards**

**Informed consent** Informed consent was obtained from all individual participants included in the study.



Ethical approval All participants and parents gave their written informed consent for the behavioral tests and MRI scanning, and the study was approved by the local ethics committee for biomedical research

Conflict of interest The authors declare that they have no conflict of interest.

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