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# Associations of sleep with gray matter volume and their implications for academic achievement, executive function and intelligence in children with overweight/obesity

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Summary

**Background:** Children with overweight/obesity have poorer sleep and smaller gray matter volume (GMV) than normal-weight children. No studies have investigated the associations of objectively-assessed sleep and GMV in children with overweight/obesity, or their implications for academic and cognitive outcomes.

**Objectives:** To explore the associations of sleep behaviors with GMV in the whole brain and particularly the hippocampus as a region of interest independent of sedentary time (SED) and physical activity; and to assess whether GMV in the associated regions was related to academic achievement, executive function and intelligence quotient (IQ).

**Methods:** Ninety-six children with overweight/obesity  $(10 \pm 1 \text{ year})$  were included. Sleep behaviors were assessed with accelerometers. GMV was acquired by magnetic resonance imaging. Academic achievement, executive function and IQ were assessed with separate tests. Analyses were adjusted for sex, peak height velocity and parent education as well as SED and physical activity.

Results: Earlier wake time, less time in bed, wakening after sleep onset (WASO) and WASO occurrences were associated with higher GMV in eight cortical brain regions (k:56-448, P's < .001). Longer total sleep time, higher sleep efficiency and less WASO time were associated with higher GMV in the right hippocampus ( $\beta$ :0.187-0.220, P's < .05). The inferior temporal, fusiform, supramarginal, and postcentral gyri, the 2 of 13 WILEY Pediatric

achievement and/or IQ. Associations remained after adjustments for SED and physical activity.

superior parietal cortex, precuneus and hippocampus associated with academic

**Conclusions:** Sleep behaviors are associated with GMV in multiple cortical regions including the right hippocampus in children with overweight/obesity, which in turn, were associated with academic achievement and IQ.

### KEYWORDS

academic success, accelerometer, brain, child, cognition, sleep

### 1 | INTRODUCTION

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Childhood academic achievement and cognition are affected by insuf-16 17 ficient sleep duration (ie, <8 hours); a public health concern reported 18 worldwide.<sup>1,2</sup> Grav matter volume (GMV) is a measure of the amount 19 of tissue in a brain region under examination. It represents all tissue 20 properties contained in gray matter including vasculature, glial cells, 21 and neuronal cell bodies. GMV contributes to the processing of infor-22 mation in the brain. Further, greater GMV in the developing brain is 23 positively associated with brain health outcomes such as academic 24 achievement and cognition,<sup>3</sup> which are crucial characteristics for childhood success in school and throughout life. Likewise. several 25 26 studies have reported that sleep behaviors, that is, those behaviors 27 related to sleep that can be measured in free-living conditions, such as total sleep time or total time in bed, are associated with academic 28 achievement,<sup>4-7</sup> executive function<sup>8,9</sup> and intelligence.<sup>10</sup> The study of 29 the sleep behaviors and their association with GMV could provide 30 insight into the mechanisms underlying the relationship of sleep with 31 32 academic achievement, executive function and intelligence. To date, 33 previous research suggests a positive link between sleep behaviors 34 and GMV in several cortical regions in 14-year-old adolescents<sup>11</sup> and 35 with hippocampal GMV in 5-18-year-olds.<sup>12</sup> Special attention should be paid to the hippocampus, which is important for memory consoli-36 dation during sleep.<sup>13,14</sup>

38 Most of the previous findings on the relationship between sleep 39 behaviors and academic achievement, executive function and intelligence have focused on sleep onset, wake time, and total sleep time. In 40 41 this regard, later sleep onset and wake times are associated with lower GMV in cortical regions<sup>11</sup> and poorer school performance,<sup>6,11</sup> including 42 mathematics, reading and social sciences.<sup>7,15</sup> Total sleep time showed a 43 small effect on school grades.<sup>5</sup> Previous studies hypothesized impaired 44 attention during school hours to explain the link between reduced sleep 45 and poorer academic achievement.<sup>4,11</sup> Likewise, previous studies have 46 found modest associations between later sleep onset, shorter total 47 sleep time and lower sleep quality with poorer executive function (ie, 48 cognitive flexibility, inhibition and working memory<sup>16,17</sup>) in adolescents<sup>8</sup> 49 and young adults.<sup>9</sup> Lastly, sleeping more than 8 hours was associated 50 with higher IQ in male adolescents.<sup>10</sup> 51

52 It is noteworthy that previous research derives timing and 53 duration variables from self-reported sleep onset and wake times (ie, asking participants what time they go to bed and wake on aver-67 age).<sup>11,12</sup> Self-report methods have been found to be influenced by 68 subjective inaccuracies and social desirability.<sup>18-20</sup> As an example, 69 total sleep time has usually been derived from the difference 70 between reported sleep onset and wake times, which would indicate 71 total time in bed rather than total sleep time. Thus, previous findings 72 based on self-reported information should be complemented via the 73 use of objective assessments. Several algorithms have demonstrated 74 that wrist-worn accelerometers can provide valid assessment of 75 sleep behaviors.<sup>21-23</sup> Another important limitation of previous stud-76 ies is the use of school grades as indicator of academic 77 achievement.<sup>11</sup> which are affected by teachers' subjectivity and 78 inter-school variability.<sup>24</sup> The use of accelerometer-derived sleep 79 behaviors and standardized tests for the measurement of academic 80 achievement are needed to investigate this relationship. 81

Children with overweight/obesity have been characterized as 82 having poorer sleep behaviors.<sup>25-27</sup> and smaller GMV than children 83 with a normal weight.<sup>28-30</sup> Furthermore, these children often engage 84 in greater sedentary time (SED) and insufficient physical activity,<sup>31</sup> 85 which may also be associated with poorer sleep behaviors.<sup>32,33</sup> SED 86 and physical activity behaviors coexist with sleep in the 87 24-hour cycle. All of these behaviors can potentially affect one 88 another, since increasing the time spent in one would reduce the time 89 devoted to another of the remaining behaviors. Therefore, when 90 studying associations between sleep behaviors and GMV, it is crucial 91 to study the potential influence of SED and physical activity behaviors 92 on these associations. This scenario requires investigation of sleep 93 behaviors on GMV, academic achievement and cognition in children 94 with overweight/obesity, as well as how SED and physical activity 95 behaviors may influence these relationships. 96

Given the important issues described above this study explored: 97 (a) the association of sleep behaviors with GMV in children with over-98 weight/obesity using a whole-brain volumetric approach, as well as 99 the specific association between sleep behaviors and GMV in the hip-100 pocampus using a region-of-interest (ROI) approach, independent of 101 SED and physical activity; and, (b) whether GMV in those regions 102 associated with sleep behaviors were also related to academic 103 achievement, executive function and IQ. To the best of our knowl-104 edge, there has not been a clear hypothesis guiding which brain 105 regions might underlie the association of sleep with academic 106

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1 achievement, executive function or IQ. However, a main candidate 2 could be the hippocampus, given its relationship to learning and mem-3 orv.<sup>12-14</sup> Thus, we chose to use a whole-brain approach and further investigate the specific association with the hippocampus using a ROI 4 approach. Based on previous research,<sup>4-9,34</sup> we hypothesized that 5 sleep behaviors would be associated with GMV, and that GMV in 6 7 some of these regions would be associated with academic achieve-8 ment, executive function and/or IQ.

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## 11 2 | METHODS

## 13 2.1 | Participants and Study Design

15 This study used baseline data from the ActiveBrains project (http:// profith.ugr.es/activebrains). Of the 110 children who enrolled, 96 pro-16 17 vided valid accelerometry and brain data at baseline  $(10 \pm 1 \text{ years})$ 18 38 girls) and were included in this cross-sectional study. Since the 19 ActiveBrains project is a randomized controlled trial aimed at discov-20 ering the effects of exercise on brain, cognition and academic achieve-21 ment in children with overweight/obesity, the sample size was 22 primarily calculated to detect moderate changes in brain outcomes after the intervention.<sup>35</sup> The detailed rationale and inclusion criteria 23 are described elsewhere.<sup>35</sup> Briefly, inclusion criteria included: 24 (a) overweight or obesity based on the World Obesity Federation cut-25 off points<sup>36,37</sup>; (b) 8 to 11 years old; (c) no physical disabilities or neu-26 27 rological disorders that affect physical performance; and, (d) in the 28 case of females, not to have started menstruation at the time of the 29 baseline assessment. Data were collected from 2014 to 2016 in Gra-30 nada (Spain) in three different waves evaluated during the months of 31 November, December, January and February (always during school 32 time in the three waves). Parents were informed of the purpose of the 33 study and parental written informed consent was obtained. The 34 ActiveBrains project was approved by the Ethics Committee on 35 Human Research (CEIH) of the University of Granada.

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## | Sleep behaviors, SED and physical activity

Participants wore ActiGraph GT3X+ accelerometers (ActiGraph, Pensa-40 41 cola, FL, USA) on their non-dominant wrist for seven consecutive days 42 and reported information on the time in which they went to bed and 43 got out of the bed every day. Raw accelerations were downloaded via the ActiLife v.6.13.3 software (ActiGraph, Pensacola, Florida) and 44 processed in the R package GGIR<sup>38</sup> (v. 1.5.12, https://www.cran.r-45 project.org/). Detailed information on accelerometer data processing 46 can be found elsewhere.<sup>39</sup> Identification of sleep onset and wake times 47 were determined by an automatized algorithm guided by participants' 48 reported times.<sup>22</sup> First, the algorithm examined potential sleep occur-49 50 rences (ie, at least 5 minutes with low variability in arm angle, that is, ., 51 <5°) throughout the 24 hours. Next, the first and last epochs classified 52 as sleep before and after the reported times were considered the defini-53 tive sleep onset and wake times. Finally, the algorithm developed by Sadeh et al<sup>21</sup> was applied within the bedtime defined to classify every 54 1-minute epoch as "asleep" or "awake." Sleep behaviors included indica-55 tors of sleep timing (ie, wake time and sleep onset), total time in bed, 56 total sleep time and sleep patterns (ie, sleep efficiency, wakening after 57 sleep onset [WASO] time and number of WASO). Total time in bed is 58 59 the time difference between wake and sleep onset times. Total sleep time represents the sum of all minutes classified as sleep within total 60 time in bed. Sleep efficiency is the percentage of time classified as sleep 61 over the total time in bed. Cut points for the non-dominant wrist pro-62 posed by Hildebrand et al<sup>40,41</sup> were used to classify SED. LPA and 63 MVPA. A total of 104 met the pre-requisite of recording 4 valid days 64 (ie,  $\geq$  16 hours/day); including at least 3 weekdays and 1 weekend day 65 were required. Specifically, to consider a day valid, participants should 66 accumulate 2/3 of the waking hours and 2/3 of night hours as wear 67 time and altogether accumulate at least 16 hours of wear time. Sleep-68 related variables, SED, LPA and MVPA daily values were averaged as 69 follows: ((school-day average \* 5) + (weekend day average \* 2))/7. 70

## 2.3 | Magnetic resonance imagining (MRI)

All images were collected with a 3.0 Tesla Siemens Magnetom Tim 75 Trio scanner (Siemens Medical Solutions, Erlangen, Germany) with a 76 32-channel head coil. High-resolution. T1-weighted images were 77 acquired using a 3D MPRAGE (magnetization-prepared rapid 78 gradient-echo) protocol. The acquisition parameters were the follow-79 ing: repetition time = 2300 ms: echo time = 3.1 ms: inversion 80 time = 900 ms; flip angle =  $9^\circ$ ; field of view = 256  $\times$  256; acquisition 81 matrix =  $320 \times 320$ , 208 slices; resolution =  $0.8 \times 0.8 \times 0.8$  mm; and 82 scan duration = 6 minutes and 34 seconds. 83

Whole-brain volumetric analyses were conducted using the Sta-84 tistical Parametric Mapping software (SPM12; Wellcome Department 85 of Cognitive Neurology, London, UK) implemented in Matlab (The 86 MathWorks, Inc, Natick, Massachusetts). Imaging pre-processing 87 included quality control, motion correction, spatial normalization to an 88 MNI (Montreal Neurological Institute) template, and spatial smooth-89 ing. Detailed information about pre-processing steps is described else-90 where.<sup>3</sup> Hippocampal volumetric analyses were conducted using 91 FMRIB's Software Library (FSL) version 5.0.7. Specifically, we used 92 FMRIB's Integrated Registration and Segmentation Tool (FIRST) in 93 FSL. FIRST is a semi-automated model-based subcortical segmenta-94 tion tool which uses the Bayesian framework from shape and appear-95 ance models obtained from manually segmented images from the 96 Center for Morphometric Analysis, Massachusetts General Hospital, 97 Boston, Massachusetts.<sup>42</sup> Briefly, FIRST runs a two-stage affine regis-98 tration to a standard space template (ie, MNI space) using 12 degrees 99 of freedom and uses a subcortical mask to exclude voxels outside sub-100 cortical regions. Second, the subcortical regions, including the hippo-101 campus, are segmented for both hemispheres separately. The manual 102 volumetric region labels are parameterized as surface meshes and 103 modeled as a point distribution model. In addition, the hippocampus 104 segmentation from FIRST was then split based on the center of grav-105 ity of the region into anterior and posterior sub-regions for each 106

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hemisphere separately. This resulted in separate anterior and posterior hippocampal segmentations for each hemisphere in each participant.<sup>43,44</sup> The final segmentations were visually inspected for quality. The volume of each region was obtained from FIRST in mm<sup>3</sup>.

### 2.4 Academic achievement, executive function and intelligence quotient

10 Academic achievement was assessed with the Spanish version of the 11 Woodcock-Johnson III battery, which is a valid and reliable (internal consistency reliability coefficient > 0.9) measure of academic achieve-12 13 ment in children.<sup>45</sup> Children completed a total of 12 tests from this bat-14 tery including reading, language, mathematics and sciences during one 15 session of 100-120 minutes. Tests were independently checked by two trained evaluators and then scores were processed in the Compuscore 16 17 and profile software (v. 3.1., Riverside Publishing Company, Itasca, Illi-18 nois). We used standardized scores of broad reading, mathematics and 19 writing components, as well as composite measures of academic skills 20 (answers accuracy), academic fluency (processing speed), academic 21 applications (problem solving) and total academic achievement.

22 Executive function domains included cognitive flexibility, inhibition and working memory as described elsewhere.<sup>39,46</sup> Cognitive flexi-23 24 bility was assessed with the second and fourth conditions of the 25 design fluency test (DFT) and the third and fourth conditions of the trail making test (TMT).<sup>47,48</sup> Both the DFT and the TMT are valid and 26 reliable for measuring cognitive flexibility in children.<sup>47,49</sup> The score 27 from these tests was standardized by sex using z-scores and then 28 29 averaged to obtain a unique indicator of cognitive flexibility. The Stroop test<sup>50</sup> was used as a valid and reliable indicator of inhibi-30 tion.<sup>47,49,51,52</sup> Performance time for condition 3 (ie, inhibiting reading 31 32 by naming color) minus condition 1 (ie, color naming) was used as pre-33 viously reported.<sup>39,46</sup> Finally, working memory was measured from a 34 modified version of the Delayed non-match-to-sample (DNMS) com-35 puterized task, which has been previously validated.53 A total of 16 practice trials and 140 experimental trials were presented in two 36 separated conditions (ie, low- and high-memory load). Response accu-38 racy for the high-load condition was used.<sup>54</sup>

39 IQ was assessed with the Spanish version of the Kaufman Brief Intelligence Test (K-BIT).<sup>55</sup> The K-BIT shows a coefficient  $\alpha$  for validity of 40 0.86 to 0.93 in its Spanish version.<sup>55</sup> Crystallized and fluid intelligence 41 42 components were assessed with vocabulary and matrices sub-tests, 43 respectively. Both sub-test scores were summed to obtain the IQ score.

#### 2.5 Confounders 46

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48 Participants' weight, height, peak height velocity and parents' educa-49 tion level were obtained as part of the protocol of the ActiveBrains project.<sup>35</sup> Weight and height were measured twice consecutively with 50 an electronic scale (SECA 861, Hamburg, Germany) and a stadiometer 51 52 (SECA 225, Hamburg, Germany), respectively, and average values 53 were used in analyses. Body mass index (BMI) was calculated as

#### 2.6 **Statistics**

white matter volume and total GMV.

Participants' descriptive characteristics were summarized as mean and 64 standard deviation (SD) or percentages. All variables were checked for 65 normality. Included and excluded participants did not significantly differ 66 in sociodemographic and anthropometric variables (all P > .05). Based on 67 previous studies.<sup>11,12</sup> we tested sex, peak height velocity, parent univer-68 sity education level and total brain volume as confounders in sensitivity 69 analyses. As all models remained similar with and without adjustment for 70 total brain volume, we excluded it from the covariates. Thus, the associa-71 tion between sleep behaviors (ie, sleep onset, wake time, total time in 72 bed, total sleep time, sleep efficiency, WASO time and WASO number) 73 and GMV was analyzed using whole-brain voxel-wise multiple regression 74 models, adjusted for sex, peak height velocity and parent university edu-75 cation level (ie, basic confounders). Sensitivity analyses were performed 76 adding BMI as confounder to the previous model and all significant asso-77 ciations presented in this study remained unchanged (data not shown). 78 Additionally, we extracted the eigenvalues from the peak coordinates of 79 each significant cluster. The associations of the extracted mean GMV 80 from significant clusters and academic achievement, executive function 81 and IQ were studied with linear regression models adjusted for basic 82 confounders. The Benjamini-Hochberg procedure was applied to 83 account for the random effect in multiple comparisons for every depen-84 dent domain (ie, academic achievement, executive function and IQ) with 85 q = 0.1. Then, we performed additional independent models adding 86 either SED, LPA or MVPA as confounders. These covariates were not 87 included in the same model because time spent in sleep, SED, LPA and 88 MVPA is constrained by the day duration and, therefore, incur perfect 89 multicollinearity when included in the same model. 90

kg/m<sup>2</sup>. Peak height velocity was derived from standing and sitting

height as a continuous measure of maturational status<sup>56</sup>. Parents

reported whether none, one, or both of them reached university level

education. Total brain volume was derived from FreeSurfer software

version 5.3.0 (http://surfer.nmr.mgh.harvard.edu) as the sum of total

The statistical threshold in the imaging analyses was calculated 91 with AlphaSim, as implemented in Resting-State fMRI Data Analysis 92 Toolkit toolbox (RESTplus).<sup>57</sup> Parameters were defined as follows: 93 cluster connection radius (rmm) = 5 mm and the actual smoothness of 94 the data after model estimation, incorporating a gray mask volume of 95 128 190 voxels. The voxel-level alpha significance (threshold, P < .001 96 uncorrected) along with the appropriate cluster size for controlling for 97 multiple comparisons in each analysis were indicated in the results. 98 The resulting cluster extents were further adjusted to account for the 99 non-isotropic smoothness of structural images.58 100

Multiple linear regression models were used to study the associa-101 tions between sleep behaviors and ROI hippocampal GMV adjusted for 102 basic confounders. Additional models adjusting for SED, LPA or MVPA 103 were performed. All statistical analyses were performed in R (v. 3.4.4, 104 https://cran.r-project.org/), except those involving imaging data which 105 were performed using the GLM approach implemented in SPM12. 106

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#### 3 RESULTS

3 Sociodemographic and anthropometric characteristics, sleep behav-4 iors, academic achievement, executive function and IQ scores of par-51 ticipants are reported in Table 1. Fourteen participants were excluded from analyses because they did not accumulate enough accelerometer 54 wear time (N = 5) or had missing (N = 1) or low-quality (N = 8) MRI 55 images. These participants were similar to the included participants in 56 terms of age, peak height velocity, BMI and parent education level 57 (P's > .115). 58

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### **TABLE 1** Descriptive characteristics of participants

	All (N = 96)	Boys (N = 58)	Girls (N = 38)
Physical characteristics, mean (SD)		C.C	7
Age (years)	10.02 (1.13)	10.16 (1.15)	9.79 (1.09)
Peak height velocity (years)	-2.30 (0.96)	-2.65 (0.79)	-1.77 (0.96)
Weight (kg)	55.67 (10.69)	56.46 (10.54)	54.46 (10.95)
Height (cm)	143.95 (8.10)	144.72 (7.44)	142.78 (8.99)
BMI (z-Score)	3.04 (0.89)	3.17 (0.99)	2.82 (0.65)
arent education university level, %			
Neither parent	66	72	58
One parent	17	16	18
Both parents	17	12	24
'hysical activity, mean (SD)		7	
SED (min/day)	561.07 (60.09)	553.46 (60.32)	572.70 (58.62)
LPA (min/day)	275.85 (39.30)	271.39 (38.42)	282.65 (40.17)
MVPA (min/day)	54.94 (20.80)	62.01 (22.05)	43.86 (12.36)
leep behaviors, mean (SD)			
Wake time (hh:mm)	8:07 (0:34)	8:05 (0:33)	8:10 (0:36)
Sleep onset time (hh:mm)	23:02 (0:40)	23:01 (0:41)	23:04 (0:38)
Total time in bed (min/day)	527.24 (31.87)	526.14 (33.55)	528.93 (29.49)
Total sleep time (min/day)	457.78 (34.91)	455.39 (32.42)	461.42 (38.58)
Sleep efficiency (%)	84.53 (4.92)	84.01 (4.39)	85.34 (5.6)
WASO time (min/day)	77.14 (23.8)	79.92 (20.51)	72.89 (27.85)
Number of WASO (nr.)	23.40 (4.43)	24.04 (4.08)	22.42 (4.81)
Valid days (nr.)	6.95 (0.4)	6.97 (0.49)	6.92 (0.35)
cademic achievement, mean (SD)			
Reading (standard score)	108.17 (13.13)	108.31 (11.17)	107.95 (15.83)
Mathematics (standard score)	101.80 (10.79)	102.45 (11.42)	100.82 (9.81)
Writing (standard score)	113.60 (12.86)	112.66 (12.02)	115.05 (14.10)
Academic skills (standard score)	118.66 (16.18)	117.76 (14.77)	120.03 (18.26)
Academic fluency (standard score)	103.56 (11.92)	104.03 (10.70)	102.84 (13.69)
Academic applications (standard score)	99.31 (9.12)	99.81 (9.18)	98.55 (9.10)
Total achievement (standard score)	109.14 (11.98)	109.03 (10.85)	109.29 (13.67)
xecutive function, mean (SD)			
Cognitive flexibility (z-Score)	-0.03 (0.81)	0.08 (0.82)	-0.2 (0.77)
Inhibition (s)	41.9 (17.31)	38.97 (15.31)	46.38 (19.34)
Working memory (number of correct answers)	65.54 (16.44)	67.00 (16.46)	63.31 (16.39)
ntelligence, mean (SD)	98.45 (12.34)	97.02 (12.14)	100.63 (12.48)

*Note*: Data are presented as mean ± SD or percentages.

52 105 Abbreviations: BMI, body mass index; LPA, Light physical activity; MVPA, moderate-to-vigorous physical activity; SED, sedentary time; WASO, wakening 53 after sleep onset.

TABLE 2 Brain regions showing significant negative associations of sleep behaviors with gray matter volume (n = 96)

						Basic confoui	nders	Basic conf	+ SED	Basic conf. +	LPA	Basic conf. +	MVPA
Predictors	Brain regions	х	Y	z	Hem	Peak t	Cluster size	Peak t	Cluster size	Peak t	Cluster size	Peak t	Cluster size
Wake time	Inferior temporal gyrus	-41	-12	-44	L	3.58	186	3.54	164	3.56	164	3.55	164
(hh:mm)		47	-21	-35	R	3.76	243	3.73	218	3.71	210	3.75	222
	Fusiform gyrus	-30	-47	-18	L	3.76	138	3.78	144	3.79	149	3.80	152
	Supramarginal gyrus	-48	-50	33	L	4.00	412	3.96	375	3.94	404	3.96	402
	Superior parietal cortex	29	-75	57	R	4.12	56	4.08	52	4.09	50	4.10	52
Total time in bed (min/day)	Postcentral gyrus	-33	-42	56	L	4.22	257	4.60	420	4.41	335	4.18	267
WASO time (min/day)	Superior temporal pole	29	18	-29	R	3.61	98	3.67	132	3.59	89	3.56	86
	Precuneus	-2	-39	48	L	3.67	400	3.65	400	3.64	269	3.68	478
	Superior parietal cortex	18	-60	71	R	3.61	150	3.57	145	3.51	79	3.59	122
Number of WASO (nr.)	Medial superior frontal gyrus	12	45	42	R	3.73	448	3.69	402	3.76	287	3.69	422
	Postcentral gyrus	63	-12	23	R	3.96	418	3.90	372	3.75	283	3.96	431
		-56	-39	53	L	3.67	117	3.62	102	3.56	63	3.64	109
	Superior parietal cortex	-20	-75	54	L	3.63	125	3.61	124	3.77	161	3.61	114

Note: Whole-brain voxel-wise multiple regression models were used. Basic confounders are sex, peak height velocity (years) and parent education university level (neither/one/both). All contrasts were thresholded using AlphaSim at P < .001 with k = 47 for wake-up time, k = 57 for bedtime, k = 46 for WASO time, k = 55 for number of WASO for the basic confounders model, and remained similar for the rest of models, and surpassed Hayasaka correction. Anatomical coordinates (X, Y, Z) are given in Montreal Neurological Institute (MNI) Atlas space. No clusters were significatively associated with sleep onset

tomical coordinates (X, Y, Z) are given in Montrea
 time, sleep time or sleep efficiency.

Abbreviations: Hem, hemisphere; L, left; LPA, Light physical activity; MVPA, moderate-to-vigorous physical activity; R, right; SED, sedentary time; WASO, wakening after sleep onset.



FIGURE 1 Brain regions showing negative associations of sleep behaviors with gray matter volume in children with overweight/obesity.
 WASO: wakening after sleep onset. Analyses were adjusted for sex, peak height velocity and parent education university level. All contrasts were thresholded using AlphaSim at *P* < .001 with *k* = 47 for wake-up time, *k* = 57 for bedtime, *k* = 46 for WASO time, *k* = 55 for number of WASO, and surpassed Hayasaka correction. Anatomical coordinates (X, Y, Z) are given in Montreal Neurological Institute (MNI) Atlas space. The color bar represents *t*-values scale

#### 3.1 Whole-brain associations of sleep behaviors

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with GMV Table 2 presents the sleep behaviors inversely associated (no positive associations were found) with GMV in the whole-brain volumetric analyses adjusted for sex, peak height velocity, parent education level, as well as SED and physical activity behaviors. A later wake time was temporal gyrus (Left: peak t = 3.58, k = 186; Right: peak t = 3.76, k = 243), and 3 more clusters in the fusiform gyrus (peak t = 3.76, k = 138), the supramarginal gyrus (peak t = 4.00, k = 412) and the superior parietal cortex (peak t = 4.12, k = 56). A longer total time in bed was associated with lower GMV in the postcentral gyrus (peak t = 4.22, k = 257), but no association with total sleep time was found. A longer WASO time was associated with less GMV in the superior temporal pole (peak t = 3.61, k = 98), the precuneus (peak t = 3.67, 

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FIGURE 2 volume in the left and the right hippocampus. WASO: wakening after sleep onset. \*Analyses were adjusted for sex, peak height velocity and parent education university level

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**TABLE 3** Associations of gray matter volume from regions associated with wake-up time and total time in bed with academic achievement, executive function and intelligence (N = 96)

	Wake time	Wake time								
	L Inferior temporal gyrus	R Inferior temporal gyrus	L Fusiform gyrus	L Supramarginal gyrus	R Superior parietal cortex	L Postcentral gyrus				
Academic achievement										
Reading	0.121	-0.012	0.160	0.104	0.174	0.355**				
Mathematics	0.160	0.166	0.224*	0.241*	0.333**	0.216*				
Writing	0.149	0.027	0.200	0.170	0.207*	0.163				
Academic skills	0.097	0.006	0.150	0.120	0.152	0.225*				
Academic fluency	0.256*	0.126	0.231*	0.264*	0.294**	0.244*				
Academic applications	0.136	0.070	0.181	0.155	0.276**	0.281**				
Total achievement	0.171	0.058	0.217*	0.195	0.260**	0.296**				
Executive function										
Cognitive flexibility	0.184	0.020	0.191*	0.126	-0.001	0.075				
Inhibition	-0.04	-0.057	0.051	-0.192	-0.146	0.185				
Working memory	-0.03	0.069	0.065	0.113	0.152	0.210*				
Intelligence	0.105	0.045	0.183	0.269*	0.102	0.209*				

Note: Multiple linear regression models adjusted for sex, peak height velocity (years) and parent education university level (neither/one/both). Bolded font indicates that the specific association surpassed the Benjamini-Hochberg correction for multiple comparison tests (performed for each domain, that is, academic achievement, executive function and intelligence). L, left; R, right.

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24 <sup>*</sup>Indicates P < .05.
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<sup>\*\*</sup>Indicates P < .01.

**TABLE 4** Associations of gray matter volume from regions associated with WASO time and number of WASO with academic achievement, executive function and intelligence (N = 96)

	R Superior temporal pole	L Precuneus	R Superior parietal cortex	R Medial superior frontal gyrus	R Postcentral gyrus	L Postcentral gyrus	L Superion parietal cortex	
Academic achievement			<i>4</i>					
Reading	0.122	0.249*	0.252*	0.138	0.216*	0.031	0.109	
Mathematics	0.193	0.249*	0.309**	0.153	0.181	0.001	0.069	
Writing	0.091	0.219*	0.079	-0.013	-0.031	-0.100	0.022	
Academic skills	0.169	0.241*	0.194	0.044	0.163	0.009	0.100	
Academic fluency	0.050	0.249*	0.193	0.146	0.137	-0.057	0.088	
Academic applications	0.125	0.170	0.232*	0.104	0.038	-0.065	-0.021	
Total achievement	0.163	0.274**	0.248*	0.098	0.147	-0.028	0.074	
Executive function								
Cognitive flexibility	0.009	-0.065	-0.065	-0.021	-0.104	-0.114	-0.123	
Inhibition	0.037	-0.069	-0.064	0.030	-0.068	0.046	-0.094	
Working memory	-0.054	0.040	0.088	0.095	0.028	0.094	0.012	
Intelligence	0 105	0.233*	0.060	_0.084	-0.005	_0.076	_0.034	

Note: Multiple linear regression models adjusted for sex, peak height velocity (years) and parent education university level (neither/one/both). Bolded for
 indicates that the specific association surpassed the Benjamini-Hochberg procedure for multiple comparison tests (performed for each domain, that is, aca-

demic achievement, executive function and intelligence).

Abbreviations: L, left; R, right; WASO, Wakening after sleep onset.  $^{52}$  Indicates P < 05

<sup>52</sup> \*Indicates P < .05.

53 \*\*Indicates P < .01.

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**TABLE 5** Standardized beta coefficients for the association of gray matter volume in hippocampal regions and academic achievement, executive function and intelligence (N = 96)

	Right hippocampus	Right anterior hippocampus	Right posterio hippocampus
Academic achievement			
Reading	0.106	0.063	0.161
Mathematics	0.06	0.043	0.087
Writing	0.128	0.114	0.139
Academic skills	0.059	0.015	0.122
Academic fluency	0.164	0.156	0.16
Academic applications	0.099	0.092	0.106
Total achievement	0.116	0.085	0.155
Executive function			
Cognitive flexibility	-0.03	-0.038	-0.018
Inhibition <sup>a</sup>	-0.204*	-0.222*	-0.159
Working memory	-0.03	-0.045	-0.009
Intelligence	0.059	0.046	0.08

Note: Multiple linear regression models adjusted for sex, peak height velocity (years) and parent education university level (neither/one/both). Bolded font indicates that the specific association surpassed the Benjamini-Hochberg procedure for multiple comparison tests (performed for each domain, that is, academic achievement, executive function and intelligence).

22 \*\*Indicates P < .01.</p>
23 \*Indicates P < .05.</p>

 $^{23}$  all ndicates that the score is multiplied by -1 (ie, a positive association is interpreted as higher inhibition).

25 k = 400) and the superior parietal cortex (peak t = 3.61, k = 150). The 26 number of WASO was inversely associated with GMV in two bilateral 27 clusters in the postcentral gyrus (Right: peak t = 3.96, k = 418; Left: 28 peak t = 3.67, k = 117) and in two more clusters in the medial superior 29 frontal gyrus (peak t = 3.73, k = 448) and the superior parietal cortex (peak t = 3.63, k = 125). All of these clusters showed P < .001 and 30 they remained significant after additional adjustments for SED, LPA or 31 MVPA. Associated clusters are visually presented in Figure 1. 321 33 Table S1 shows bivariate correlation coefficients and confidence 34 intervals between sleep behaviors (Supplementary Material).

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# 37 3.2 | Associations of sleep behaviors with GMV in 38 the hippocampus

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Figure 2 depicts scatter plots for the association between total sleep time, sleep efficiency and WASO time with GMV in the left and right hippocampi. Associations with the right hippocampus were positive for total sleep time ( $\beta$  = 0.187, *P* = .049) and sleep efficiency ( $\beta$  = 0.220, *P* = .019) and negative for WASO time ( $\beta$  = -0.202, *P* = .033). Specific associations for the anterior and posterior hippocampal sub-regions can be found as Supplementary Material (Table S3).

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# 49 3.3 | GMV associations with academic achievement, 50 executive function and intelligence quotient

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52 Higher GMV in those clusters related to wake time (ie, inferior tempo-53 ral gyrus, fusiform, supramarginal gyri and superior parietal cortex) were associated with higher academic achievement scores. Specifi-78 cally, four of the five clusters were associated with one or more aca-79 demic achievement indicators ( $\beta$  ranging from 0.217 to 0.333, all 80 P < .028); and one cluster (ie, supramarginal gyrus) was also associated 81 with IQ (Table 3). GMV in the cluster related to total time in bed (left **T8**2 postcentral gyrus) was associated with various academic achievement 83 indicators (ie, reading, academic skills, academic fluency, academic 84 applications and total achievement) ( $\beta$  ranging from 0.225 to 0.355, 85 P's < .032) (Table 3). Additionally, clusters in the precuneus and the 86 superior parietal cortex, which were previously associated with 87 WASO time, were also associated with reading, mathematics, aca-88 demic skills, fluency and total achievement ( $\beta$  ranging from 0.232 to 89 0.309, P's < .028) (Table 4). The remaining clusters were not associ-**T9**0 ated with academic achievement, executive function or IQ 91 (all P > .05). 92

Finally, GMV in right hippocampus was not associated with academic achievement, executive function and IQ (Table 5). We only found a negative association with inhibition ( $\beta = -0.222$  to 0.271, 95 P = .02) surpassing the correction for multiple comparisons. 96

## 4 | DISCUSSION

Our findings support an association between certain sleep behaviors101(ie, sleep timing, duration and pattern) and GMV in cortical and sub-<br/>cortical brain structures, including the hippocampus, in children with102overweight/obesity. Specifically, earlier wake time, less total time in<br/>bed, lower WASO time and the number of WASO were associated104with greater GMV in one or several brain structures. Additionally, ROI106

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analyses in the hippocampus depicted associations of a longer total 1 2 sleep time, higher sleep efficiency and a lower WASO time with the 3 GMV in the right hippocampus. All of these associations were 4 adjusted for sex, peak height velocity and parent education university 5 level. Nearly every association remained following adjustment for 6 SED, LPA or MVPA. The identified brain structures associated with 7 sleep behaviors were also positively associated with academic 8 achievement and, to a lesser extent, IQ (but not with executive func-9 tion). These findings should be interpreted with caution given the mul-10 tiple tests performed. Further studies should investigate the brain 11 regions reported in this study with larger samples.

#### 14 4.1 | Whole-brain associations of sleep behaviors with GMV 15

17 Only two previous studies investigated the associations between sleep 18 behaviors and GMV in children and/or adolescents using a whole-brain volumetric approach.<sup>11,12</sup> The whole-brain volumetric approach 19 20 depicted a complete picture of sleep and GMV associations at a whole-21 brain level, rather than at a region-of-interest level. Thus, the whole-22 brain approach affords the exploration of associations not described in 23 previous studies. These two studies focused separately on weekdays 24 and weekend days.<sup>11,12</sup> Our study was the first to investigate the week as a whole (using weighted averages to account for the correspondent 25 26 weight of school days and weekend days in daily life) and, therefore, 27 consider the association with brain structure as a result of sleep behav-28 iors during both weekdays and weekend days. This approach provided 29 us with a unique and clear perspective on the association between sleep 30 variables and GMV rather than assuming different associations of sleep 31 with GMV dependent upon the day in which sleep occurs.

32 In regard to sleep timing, later wake times were associated with 33 less GMV in several cortical structures, such as the inferior temporal, 34 fusiform, and supramarginal gyri and the superior parietal cortex. Sleep onset was not associated with GMV in any brain region. The inferior temporal gyrus, the fusiform gyrus and the supramarginal 36 gyrus are important for reading and language processing, word recognition and posture and gesture identification.<sup>59,60</sup> GMV in these 38 39 structures was positively associated with academic fluency, mathematics, total achievement and IQ. The superior parietal cortex is 40 important for processing spatiotemporal and visual information,<sup>61</sup> 41 42 which is important for academic achievement as GMV in this region 43 was associated with mathematics, academic fluency, academic appli-44 cations and total achievement. One previous study found that self-45 reported earlier wake time during weekends was associated with 46 greater GMV in the medial frontal orbital and the anterior cingulate cortices in 14 year-olds.<sup>11</sup> Diversity in the associated brain regions 47 48 can respond to a different stage in brain development (pre-49 adolescence vs adolescence) and/or different methods of assessing sleep (ie, self-reported vs objective). Consistent with our findings, 50 Urrila et al<sup>11</sup> found a positive association between GMV and school 51 grades, which suggests that larger GMV was linked to better academic 52 53 achievement. This study complements the previous one by adding a

detailed study of the associations with different academic abilities and 54 by including executive function and IQ. 55

Likewise, total time in bed was associated with higher GMV in 56 57 the postcentral gyrus. Considering the negative association with wake time and the lack of association with sleep onset, it is logical that lon-58 ger total time in bed is due to later wake times, which are both nega-59 tively associated with GMV in several brain regions. None of the 60 previous studies<sup>11,12</sup> found associations with GMV in the postcentral 61 gyrus, but differing sample characteristics and methodological incon-62 sistencies may account for this discrepancy. The postcentral gyrus is 63 located in the primary somatosensory cortex. Our findings suggest 64 that those children who stay in bed longer may interact less with the 65 environment and, in turn, may not stimulate this brain region ade-66 quately. This negatively affects academic achievement, since GMV in 67 this specific cluster was positively associated with reading, academic 68 skills, academic fluency, academic applications and total achievement. 69 However, this should not be interpreted as a negative consequence of 70 longer sleep periods. Total sleep time was not associated with GMV in 71 any region, but total time in bed was associated, suggesting that those 72 children who stayed in bed longer (especially when engaged in non-73 sleeping time activities) have smaller GMV in certain regions, which 74 may lead to poorer academic achievement. 75

In regard to sleep patterns, longer WASO time was related to 76 lower GMV in the superior temporal pole, the precuneus and the right 77 superior parietal cortex; and a higher number of WASO with lower 78 GMV in the superior medial frontal and the postcentral gyri, and the 79 left superior parietal cortex. GMV in the precuneus and the right 80 superior parietal cortex were positively associated with reading, math-81 ematics, academic skills, fluency, applications and total 82 achievement. Consistently, Urrila et al<sup>11</sup> also found sleep behaviors 83 associated with GMV in the precuneus and, in turn, this GMV was 84 associated with school grade average. The precuneus has been related 85 to visuospatial perception and, together with the hippocampus, to epi-86 sodic memory.<sup>62,63</sup> These functions are important for academic 87 achievement. It is also noteworthy that the right superior parietal cor-88 tex was negatively associated with wake time and WASO time in our 89 sample. Since these two sleep behaviors were not correlated with 90 each other (see Table S1), we cannot assume that these findings are 91 overlapping. Likewise, the left postcentral gyrus was associated with 92 bedtime and the number of WASO, indicators which did not correlate 93 with one another. Only the cluster related to bedtime was associated 94 with academic achievement. 95

Briefly, these findings complement previous literature by con-96 firming some specific brain regions which were associated with sleep 97 behaviors and by describing associations which have not been previ-98 ously reported. Brain development during childhood and adolescence 99 is heavily dependent upon the age of participants, with age having a 100 differential relationship relative to which brain areas are more or less 101 sensitive to sleep behaviors.<sup>64</sup> In this regard, our sample comprised 102 8-11-year-old children, while previous studies were focused on older 103 adolescents. Furthermore, all of the participants in the current study 104 presented with overweight or obesity, which could alter the relation-105 ship between sleep and brain outcomes, including development,<sup>28</sup> and 106

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1 may account for differences in the findings between the current study 2 and previous research. Likewise, we found eight cortical regions asso-3 ciated with sleep, which resulted in a high number of statistical tests 4 that were employed to study their association with academic achieve-5 ment, executive function and IQ. Although we applied a correction for 6 multiple comparisons, we advise caution in the interpretations and 7 suggest further investigation of these findings.

8 All of the above-mentioned associations were not affected by 9 including SED; LPA or MVPA in the models. Therefore, SED, LPA and 10 MVPA do not appear to influence the association between sleep behav-11 iors and GMV in our sample of children with overweight/obesity.

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# 4.2 | Associations of sleep behaviors with GMV in the hippocampus

17 The hippocampus is a subcortical brain structure that is in constant 18 communication with cortical structures and has been found to be cru-19 cial for memory consolidation during sleeping.<sup>13,14</sup> A major hypothesis 20 on this link points to the memory consolidation process, which occurs predominantly during sleep.<sup>14</sup> Our ROI analyses of the hippocampus 21 22 showed that total sleep time was positively associated with GMV in the right hippocampus. This finding agrees with Taki et al.,<sup>12</sup> who 23 24 found similar associations using self-reported sleep behaviors in 25 5-18-year-old children. Specifically, they found a longer total sleep 26 time during weekdays was associated with the hippocampus; a rela-27 tionship not observed for weekend total sleep time. This study com-28 pliments their findings by objectively assessing a representative whole 29 week, including both weekdays and weekends.

30 Furthermore, higher sleep efficiency and shorter WASO time were associated with greater hippocampal GMV in the right hemisphere. This 31 is the first study to investigate the associations between these variables 32 and GMV in children. Of note, sleep efficiency and WASO time were 33 34 highly correlated in this sample (see Table S1). Our conclusion is that 35 WASO time should be as short as possible, meaning that sleep efficiency and GMV in the hippocampus would be higher. It is noteworthy 36 that our whole-brain volumetric analyses failed to find associations 38 between sleep behaviors and GMV in the hippocampal regions as the 39 ROI analysis did. The whole-brain analysis requires enough contiguous voxels associated with sleep behaviors to consider a significant associa-40 41 tion, which makes this analysis stricter than the ROI.

Further, the right hippocampus appears more sensitive to sleep behaviors than the left hippocampus in children with overweight/obesity. However, GMV in the right hippocampus was not clearly associated with academic achievement, executive function or IQ (ie, only the anterior sub-section of the right hippocampus was associated with inhibition).

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### 4.3 | Limitations and strengths

51 Several limitations of this study should be acknowledged. First, the 52 cross-sectional design does not afford a causal interpretation of the 53 findings. Next, accelerometer-based estimates of sleep do not represent sleep itself, but rather an estimation based on movement patterns, so 54 our findings should be interpreted with caution. However, accelerome-55 ters are a less-invasive objective method to assessing sleep behaviors in 56 free-living settings, while also providing good validity.<sup>21,22</sup> Likewise, nap 57 time cannot be accurately identified via accelerometers, and we did not 58 59 collect self-report information on naps; thus, it could be that part of the daily sleep is missing in our estimates. Furthermore, some participants 60 had missing accelerometer or MRI data and had to be excluded from 61 analyses because of the impossibility of imputing MRI images. However, 62 these participants were similar to those included in analyses in terms of 63 BMI and sociodemographic characteristics. Nevertheless, strengths of 64 this study include: the relatively large sample size (96 children with valid 65 MRI); the consideration of SED and physical activity as potential con-66 founding factors for sleep behaviors and GMV; the objective assess-67 ment of sleep behaviors across an entire week; the standardized tests 68 for the measurement of academic achievement rather than school 69 grades; and the focus on children with overweight/obesity, given the 70 bidirectional associations between obesity and sleep behaviors, physical 71 activity and brain development. 72

In conclusion, our findings indicate that sleep behaviors, including 73 timing, duration and patterns, are associated with GMV and, subse-74 quently. GMV is associated with academic achievement and IQ in chil-75 dren with overweight/obesity. The superior parietal and postcentral 76 cortices appear to be the most consistent regions associated with sleep, 77 given that they were also associated with academic achievement indica-78 tors. We should also highlight that WASO time was associated with 79 GMV in both cortical structures and, subsequently, related strongly to 80 academic achievement. Total sleep time, sleep efficiency and WASO 81 time are specifically associated with the right hippocampus, but this 82 subcortical region was not associated with academic achievement. 83 executive function or IQ. Sleep behaviors are important for GMV and 84 85 academic achievement and, to a lesser extent, IQ, but appeared unrelated with executive function. All these associations remained sig-86 nificant after considering the potential effect of SED, LPA and MVPA. 87

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## SUPPORTING INFORMATION

Additional supporting information may be found online in the Supporting Information section at the end of this article.

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