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#### ORIGINAL ARTICLE



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### Comparing estimates of physical activity in children across different cut-points and the associations with weight status

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#### **Funding information**

This research was funded by the Folkhälsan Research Center, University of Helsinki, Ministry of Education and Culture in Finland, Ministry of Social Affairs and Health, Academy of Finland (Grants: 285439, 287288, 288038), Juho Vainio Foundation, Signe and Ane Gyllenberg Foundation, Finnish Cultural Foundation/South Ostrobothnia Regional Fund, Päivikki and Sakari Sohlberg Foundation, Medicinska Föreningen Liv och Hälsa, Finnish Foundation for Nutrition Research, and Finnish Food Research Foundation This study aimed to compare sedentary time (SED) and intensity-specific physical activity (PA) estimates and the associations of SED and PA with body mass index (BMI) and waist circumference (WC) using three different sets of cut-points in preschool-aged children. A total of 751 children  $(4.7 \pm 0.9 \text{ years, boys } 52.7\%)$  wore an ActiGraph GT3X+BT accelerometer on their hip for 7 days (24 h). Euclidean norm -1 G with negative values rounded to zero (ENMO) and activity counts from vertical axis (VACounts) and vector magnitude (VMCounts) were derived. Estimates of SED and light, moderate, vigorous, and moderate-to-vigorous PA (MVPA) were calculated for commonly used cut-points by Hildebrand et al., Butte et al., and Evenson et al. Furthermore, the prevalence of meeting the PA recommendation, 180 min/day of which at least 60 min/day being MVPA, were assessed for the cut-points. Multilevel mixed analysis was used to examine associations of SED and PA with BMI and WC. In accordance with the results, SED and PA intensity estimates differed largely across cut-points (i.e., SED = 22-341 min/day; light PA = 52-257 min/day; moderate PA = 5-18 min/day; vigorous PA = 7-17 min/day; MVPA = 13-35 min/day), and the prevalence of children meeting the PA recommendation varied from 4% to 70%. Associations of SED and PA with BMI or WC varied between the cut-points. Our results indicate that SED and PA estimates in preschool-aged children between studies using these

This is an open access article under the terms of the Creative Commons Attribution-NonCommercial-NoDerivs License, which permits use and distribution in any medium, provided the original work is properly cited, the use is non-commercial and no modifications or adaptations are made. © 2022 The Authors. Scandinavian Journal of Medicine & Science In Sports published by John Wiley & Sons Ltd. cut-points are poorly comparable. Methods facilitating accelerometer-derived PA estimate comparison between studies are highly warranted.

**KEYWORDS** 

acceleration metrics, adiposity, exercise, sedentary behavior, youth

#### **1** INTRODUCTION

Engaging in sufficient levels of physical activity (PA) has been connected to numerous health benefits, including lower adiposity in preschool-aged children (3–5 years).<sup>1</sup> In accordance with the World Health Organization (WHO) PA recommendations, preschool-aged children should spend at least 180 min a day engaging in PA at any intensity, with the inclusion of at least 60 min of moderate-to-vigorous intensity PA (MVPA).<sup>2</sup> Conflictingly, the proportion of preschoolers complying with the recommendation has been reported to vary between 11%–93% when assessed with accelerometers.<sup>3–5</sup> In addition to actual variation in children's habitual PA, accelerometer-defined PA metrics<sup>6</sup> and cutpoints<sup>7</sup> used have been found to influence the proportions.

Accelerometers are the most widely used objective method of assessing PA in research currently.<sup>8</sup> There are several types of accelerometers and data processing methods available to assess SED and PA, but the estimates of these different methods have been found inconsistent.<sup>9</sup> Usually, accelerometers collect a raw acceleration signal at a pre-specified frequency and they are cleaned (i.e., gravitational acceleration and noise are removed from the signal) and aggregated over a time period (i.e., epoch). The data processing to clean the signal has traditionally been performed directly by the manufacturers, with the activity counts by ActiGraph being the most frequent acceleration metrics used in previous literature. Activity counts are usually calculated as the vector magnitude of the three axes (VMCounts) or as the one-dimensional vertical axis (VACounts). Thereafter, age-appropriate cut-points are defined to distinguish intensity-specific PA.<sup>10,11</sup> However, activity counts are not comparable between accelerometers from different manufacturers, or even between different generations of accelerometers from the same manufacturer.<sup>9,12</sup> Cut-points are usually calibrated in small studies with limited sample sizes and underrepresented activities of daily life.<sup>10,11,13,14</sup> Therefore, it is typical to observe large discrepancies in the estimation of PA intensities from various cut-points when they are extrapolated to different settings and/or participants.<sup>15</sup> The development of opensource algorithms to clean the raw signal is now an alternative to activity counts.<sup>16,17</sup> The Euclidean Norm of the raw acceleration in the three axes Minus One G (ENMO, 1 G ~ 9.8  $m/s^2$ ) with negative values rounded to zero has become

widely used and has shown a high agreement between brands,<sup>18</sup> facilitating data harmonization across studies. Although, open-source raw accelerometer data processing has been warranted in order to increase equivalency of data outputs and improved comparability between studies using different devices,<sup>19</sup> using activity counts provides better comparability with the majority of previous literature. Yet the comparability across commonly used cut-points based on activity counts and open-source methods has only been studied in school-aged children thus far warranting the need to confirm the findings in preschool-aged children.

Several cut-points have been used to classify PA intensity from hip-worn accelerometers in preschoolers. VACounts have been frequently used to assess PA in children<sup>20</sup> and the commonly used cut-points by Evenson et al.<sup>11</sup> have been cross-validated among 5 to 15-year-old children.<sup>21</sup> The cut-points by Butte et al.<sup>10</sup> provide PA intensities based on the VMCounts measurements in preschool-aged children. The more recently developed ENMO measurements offer an open-source method increasing comparability between studies, and the cut-points by Hildebrand et al.<sup>13,14</sup> have been previously used in children and provide the most reference data.<sup>6,19,22</sup> A previous study in preschoolers<sup>7</sup> reported that cut-points by Butte et al.<sup>10</sup> led to less sedentary time (SED) and more light PA and MVPA compared to estimates using cut-points by Janssen et al.<sup>23</sup> based on VACounts. In school-aged children,<sup>6,22</sup> Hildebrand et al.<sup>13,14</sup> has been shown to provide less moderate and vigorous PA compared to estimates using Evenson et al.<sup>11</sup> and Romanzini et al.<sup>24</sup> who used VMCounts. However, it has also been found that Hildebrand et al.<sup>13,14</sup> provided more moderate PA and less vigorous PA compared to estimates using Evenson et al.<sup>11</sup> in another study in school-aged children.<sup>19</sup> The proportions of school-aged children meeting the PA recommendation (i.e., at least 60 min of MVPA per day) have been reported to vary considerably between different cut-points.<sup>6,19</sup> Yet, there is a lack of previous studies comparing acceleration estimates based on both traditional activity counts and open-source metrics and cut-points in preschool-aged children, even though such knowledge would be essential for comparing SED and PA estimates between studies.

To date, information on comparability between estimates of SED and PA in preschool-aged children based on different cut-points is scarce, especially using open-source metrics.

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**TABLE 1** Children's age-appropriate cut-points for the estimation of sedentary time (SED) and physical activity (PA) intensities (N = 751)

References	Acceleration metric	Epoch length	SED/Light PA	Light PA/ Moderate PA	Moderate PA/ Vigorous PA
Hildebrand et al. <sup>13,14</sup>	ENMO	5 s	40 mg	140 mg	465 mg
Butte et al. <sup>10</sup>	VMCounts	60 s	820 c	3908 c	6112 c
Evenson et al. <sup>11</sup>	VACounts	15 s	26 c	574 c	1003 c

Abbreviations: c, Activity counts; ENMO, Euclidean norm -1 g; VACounts, Vertical axis counts; VMCounts, Vector magnitude counts.

Furthermore, there is a lack of studies examining whether associations of SED and PA with the most frequently used health indicators vary when using different SED and PA cutpoints based on the commonly used metrics. Overweight and obesity are closely connected to health.<sup>25</sup> Their associations with SED and PA have been widely investigated, although with inconsistent findings.<sup>26</sup> Associations of SED and PA with overweight and obesity have been studied in children also compositionally taking the relative changes in the daily activities into account.<sup>27</sup> However, due to the differences in the study designs and methods assessing SED, PA and weight status, conclusions about the associations should still be drawn with caution.<sup>26</sup> Since body mass index (BMI) is the most common method to assess obesity and waist circumference (WC) is an important marker of central obesity, they have been recommended to be used as a routine measurement in clinical practice.<sup>28</sup> Therefore, it is of high importance to further examine how their associations with SED and PA are dependent on the cut-points used based on data from the same study. Therefore, the aims of this study were to compare (1) SED and intensityspecific PA estimates and (2) the associations of SED and PA with anthropometrics (BMI and WC) when using three different cut-points (VACounts<sub>Evenson</sub>, VMCounts<sub>Butte</sub>, and ENMO<sub>Hildebrand</sub>) in preschool-aged children.

#### 2 | MATERIALS AND METHODS

#### 2.1 | Study design and participants

The present study utilizes cross-sectional data from the Increased Health and Wellbeing in Preschools (DAGIS) study.<sup>29</sup> The study was conducted in early childhood education and care (ECEC) centers in southern and western Finland in 2015–2016. The eligibility criteria for the ECEC centers in the study were: (1) having at least one group consisting of 3–6-year-old children, (2) providing early education only during the daytime, (3) being Finnish or Swedish speaking (official languages of Finland), and (4) charging income-dependent fees. In total, 864 children (25% of the invited children, boys 52%) and their families, from 66 ECEC centers (43% of the invited ECEC centers) in 8 municipalities

participated in the study. Guardians gave their written informed consent. The study was approved by the University of Helsinki Ethical Review Board in the Humanities and Social and Behavioral Sciences in February 2015 (#6/2015).

## 2.2 | Assessment of sedentary time and physical activity

SED and PA were measured using a hip-worn triaxial ActiGraph wGT3X-BT accelerometer (Pensacola, FL, USA) for 7 days, 24 h per day. The raw accelerations that were collected using 30 Hz were processed using ActiLife v.6.13.3 (ActiGraph, Pensacola, FL, USA) to obtain VMCounts and VACounts using the normal filter developed by ActiGraph. Additionally, we exported the raw accelerations in ".csv" files to process them in the GGIR R package v.  $1-5.12^{30}$  to obtain ENMO.

For VMCounts and VACounts, we used ActiLife to obtain the SED and PA intensity metrics. For such purpose, periods of  $\geq 10$  min of consecutive zeros were regarded as non-wear time and removed from the further analyses.<sup>31</sup> In addition, the times between parent-reported sleep onset and wake-up were excluded. A valid day was defined as  $\geq 600$  min of wearing time during waking hours, and children with valid data on at least 3 weekdays and 1 weekend day were included in the analyses. A 15-s epoch length was used for VACounts and the Evenson et al. cut-points were applied (VACounts<sub>Evenson</sub>).<sup>11</sup> VMCounts were aggregated in 60-s epochs and the Butte et al. cut-points were used (VMCounts<sub>Butte</sub>)<sup>10</sup> (Table 1). The epoch and cut-points decisions were based on the practical considerations reported in a previous systematic review.<sup>20</sup>

The GGIR R package was used to obtain the SED and PA intensity metrics based on ENMO.<sup>30</sup> The processing methods involved the following: (1) Auto-calibration of the data according to the local gravity.<sup>32</sup> (2) Detection of the non-wear time based on the raw acceleration of the three axes.<sup>17</sup> In brief, each 15-min block was classified as non-wear time if the standard deviation of 2 out of the 3 axes was lower than 13 mg during the surrounding 60-min moving window, or if the value range for 2 out of the 3 axes was lower than 50 mg. (3) Detection of sustained abnormal

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high accelerations higher than 5.5 g. (4) Calculation of the ENMO as (~9.8  $m/s^2$ ) with negative values rounded to zero. (5) Imputation of detected non-wear time and abnormal high accelerations by means of the acceleration for the rest of the recording period during the same time interval as the affected periods. (6) Identification of waking and sleeping hours using an automatized algorithm guided by parent-reported sleep times.<sup>33</sup> Finally, estimation of SED and PA intensities were calculated using the Hildebrand et al.<sup>13,14</sup> cut-points for ENMO (ENMO<sub>Hildebrand</sub>) (Table 1). Mean daily SED and PA intensity levels were then calculated as: (mean of available weekdays\*5 + mean of available weekend days\*2)/7. Furthermore, meeting the WHO recommendation for PA (i.e., 180 min/day at any PA intensity including at least 60 min MVPA)<sup>34</sup> was assessed for VACounts<sub>Evenson</sub>, VMCounts<sub>Butte</sub>, and ENMO<sub>Hildebrand</sub>.

#### 2.3 | Assessment of anthropometrics

Weight and height were measured by trained researchers, and thereafter, BMI was calculated as body weight (kg) / height<sup>2</sup> (m). The threshold for being overweight/obese was defined using the age- and sex-specific BMI cut-offs of the International Obesity Task Force criteria.<sup>35</sup> WC was measured over one layer of clothing twice to the nearest 0.1 cm with measuring tapes (SECA 201) and the mean of these values was calculated. Waist was defined as the midpoint between the top of the iliac crest and the lower margin of the last palpable rib.

#### 2.4 | Covariates

Children's age and sex were reported by the parents. Families participated in the study during different seasons and, therefore, the research time was divided into three categories: fall (September-October), winter (November-December) and spring (January-April). The educational level of both parents was inquired by a questionnaire and further categorized as low educational level (i.e., comprehensive, vocation, or high school), middle educational level (i.e., bachelor's degree or college), or high educational level (i.e., master's degree or licentiate/doctor).

#### 2.5 | Statistical analysis

Descriptive statistics were calculated as means, standard deviations (SD), and percentages (%). Comparing the time estimates of SED, light PA, moderate PA, vigorous PA, and MVPA between each pair of VACounts<sub>Evenson</sub>, VMCounts<sub>Butte</sub>, and ENMO<sub>Hildebrand</sub> estimations were

conducted using paired-samples t-test, Bland-Altman plots with their limits of agreement (LOA), mean absolute percent error (MAPE), and Lin's concordance correlation coefficient (LCCC). Since VACounts<sub>Evenson</sub> is the most traditional acceleration metric and cut-points from these three, it was used as a reference against VMCounts<sub>Butte</sub> and ENMO<sub>Hildebrand</sub> in the analyses regarding MAPE. As no criterion measure exists, VMCounts<sub>Butte</sub> was randomly selected as the reference cut-points between VMCounts<sub>Butte</sub> and ENMO<sub>Hildebrand</sub>. Multilevel mixed model at the ECEC centers level was used to assess the associations of SED and PA based on VACounts<sub>Evenson</sub>, VMCounts<sub>Butte</sub>, and ENMO<sub>Hildebrand</sub> with BMI and WC. All models were adjusted for child's age and sex, research season, parental educational level, and accelerometer wear time. Assumptions were visually checked and they were not violated. In this study, the interest was which one of the multilevel mixed models, or both, in each pairwise comparisons contained the correct set of regressors and were more suitable to model BMI or WC. Therefore, we used the J test<sup>36</sup> to examine whether the associations of SED and PA with BMI and WC differed statistically between each pair of the cut-points used in estimating SED and PA. To control for differences in wear time, paired-samples t-test, MAPE, and LCCC as sensitivity analysis were performed by standardizing SED estimates for wear time previously proposed.<sup>37</sup> The analyses were performed in SPSS statistical software (version 26.0) and in R software. Statistical significance was considered when p < 0.05.

#### 3 | RESULTS

Valid accelerometer data were obtained for 751 children with 4 (0.7%), 5 (3.7%), 6 (19.0%), and 7 (76.6%) days, and on average the children wore the accelerometer for 6.7 days (SD 0.57). Background characteristics as well as the time spent in SED and various PA intensities based on the different cut-points are reported in Table 2. The differences between SED and PA intensities estimated from the different cut-points expressed in min/day are graphically presented in Figure 1. Moreover, the proportion of children meeting the PA recommendations varied from ENMO<sub>Hildebrand</sub> 3.6% to VMCounts<sub>Butte</sub> 46.1% and VACounts<sub>Evenson</sub> 69.5% (Figure 2). The prevalence was higher for boys than for girls, regardless of the used cut-points.

Further comparisons between SED and PA intensities estimates are shown in Table 3. All pairwise comparisons were significantly different (p < 0.05). The various mean daily estimations differed between 22–341 min/ day for SED, 52–257 min/day for light PA, 5–18 min/day for moderate PA, 7–17 min/day for vigorous PA, and 13– 35 min/day for MVPA, respectively. The lowest MAPE was

TABLE 2 Descriptive characteristics of participating children

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	All		Boys	Boys		Girls	
	N	Mean ± SD	N	Mean ± SD	N	Mean ± SD	
Age (years)	751	$4.7 \pm 0.9$	396	$4.8 \pm 0.9$	355	$4.7 \pm 0.9$	0.24
Height (cm)	720	$109.5 \pm 7.8$	372	$110.5 \pm 7.9$	348	108.6 ± 7.7	0.001
Weight (kg)	719	$19.2 \pm 3.5$	372	19.6 ± 3.5	347	$18.8 \pm 3.4$	0.003
BMI (kg/m <sup>2</sup> )	719	$15.9 \pm 1.4$	372	15.9 ± 1.3	347	$15.8 \pm 1.4$	0.43
Overweight or obese <sup>a</sup> $(N, \%)$	719	83 (11.5)	372	40 (10.8)	347	43 (12.4)	0.50
Waist circumference (cm)	719	$53.7 \pm 4.0$	372	$54.0 \pm 3.8$	347	$53.5 \pm 4.2$	0.076
Parental education level <sup>b</sup> ( $N$ , %)	747		396		351		0.11
Low		161 (21.6)		89 (22.5)		72 (20.5)	
Middle		320 (42.8)		156 (39.4)		164 (46.7)	
High		266 (35.6)		151 (38.1)		115 (32.8)	
Research season <sup>c</sup> ( $N$ , %)	751		396		354		0.79
Fall		306 (40.7)		163 (41.2)		143 (40.3)	
Winter		285 (37.9)		153 (38.6)		132 (37.2)	
Spring		160 (21.3)		80 (20.2)		80 (22.5)	
PA and SED (min/day) <sup>d</sup>							
SED							
<b>ENMO</b> <sub>Hildebrand</sub>	751	$711.1\pm50.3$	396	$709.6 \pm 50.0$	355	$712.8 \pm 50.6$	0.39
VMCounts <sub>Butte</sub>	751	$370.2 \pm 54.7$	396	366.5 ± 54.7	355	374.2 ± 54.5	0.055
VACounts <sub>Evenson</sub>	751	$392.4 \pm 46.6$	396	$385.2 \pm 46.7$	355	$400.4 \pm 45.2$	<0.001
Light PA							
ENMO <sub>Hildebrand</sub>	751	$122.8 \pm 23.4$	396	$126.9 \pm 23.4$	355	118.3 ± 22.7	<0.001
VMCounts <sub>Butte</sub>	751	$379.6 \pm 41.6$	396	$378.3 \pm 41.1$	355	$381.1 \pm 42.3$	0.36
VACounts <sub>Evenson</sub>	751	$327.5 \pm 34.7$	396	$330.2 \pm 34.3$	355	324.6 ± 34.9	0.029
Moderate PA							
<b>ENMO</b> <sub>Hildebrand</sub>	751	$33.7 \pm 10.6$	396	$34.9 \pm 11.0$	355	$32.3 \pm 10.1$	0.001
VMCounts <sub>Butte</sub>	751	$46.4 \pm 18.6$	396	$51.3 \pm 18.6$	355	$40.9 \pm 17.0$	<0.001
VACounts <sub>Evenson</sub>	751	$51.9 \pm 14.6$	396	$56.1 \pm 14.7$	355	$47.1 \pm 13.0$	<0.001
Vigorous PA							
<b>ENMO</b> <sub>Hildebrand</sub>	751	$3.4 \pm 2.5$	396	$3.4 \pm 2.6$	355	$3.4 \pm 2.3$	0.97
VMCounts <sub>Butte</sub>	751	$12.6 \pm 8.6$	396	13.4 ± 9.1	355	$11.7 \pm 7.8$	0.006
VACounts <sub>Evenson</sub>	751	19.9 ± 9.4	396	$21.2 \pm 9.9$	355	$18.6 \pm 8.8$	<0.001
MVPA							
<b>ENMO</b> <sub>Hildebrand</sub>	751	$37.1 \pm 12.4$	396	$38.3 \pm 12.8$	355	$35.8 \pm 11.9$	0.006
VMCounts <sub>Butte</sub>	751	$59.0 \pm 24.5$	396	64.8 ± 24.9	355	$52.6 \pm 22.5$	<0.001
VACounts <sub>Evenson</sub>	751	$71.8 \pm 22.2$	396	77.3 <u>+</u> 22.6	355	$65.7 \pm 20.1$	<0.001
Wearing time during waking hours							
ENMO <sub>Hildebrand</sub>	751	$862.8 \pm 41.8$	396	$865.7 \pm 40.7$	355	859.5 ± 42.9	0.040
VMCounts <sub>Butte</sub>	751	808.8 ± 34.4	396	809.6 ± 34.2	355	807.9 ± 34.6	0.51
VACounts	751	791.7 + 36.0	396	792.5 + 36.3	355	790.8 + 35.6	0.50

Abbreviations: ENMO, Euclidean norm -1 g; MVPA, Moderate-to-vigorous physical activity; PA, physical activity; SED, sedentary time; VACounts, Vertical axis counts; VMCounts, Vector magnitude counts.

<sup>a</sup>According to Cole and Lobstein<sup>35</sup>.

<sup>b</sup>Low educational level included comprehensive, vocation, or high school; middle educational level included bachelor's degree or college; and high educational level included master's degree or licentiate/doctorate.

<sup>c</sup>Fall was defined as September–October, winter was defined as November–December, and spring was defined as January–April.

<sup>d</sup>Cut-points by Hildebrand et al.<sup>13,14</sup> for ENMO<sub>Hildebrand</sub>, Butte et al.<sup>10</sup> for VMCounts<sub>Butte</sub>, and Evenson et al.<sup>11</sup> for VACounts<sub>Evenson</sub>.

<sup>e</sup>T-test for continuous variables and chi-square test for categorized variables. Significant values are bolded.



**FIGURE 1** Mean daily time spent (min) and standard deviations (error bars) in sedentary time and physical activity intensitites considering different cutpoints (N = 751). Cut-points expressed in the legend with the acceleration metric used and the first author of the validation study in subscripts, that is, Butte et al.<sup>10</sup>, Hildebrand et al.<sup>13,14</sup>, and Evenson et al.<sup>11</sup> VMCounts: Vector magnitude counts; VACounts: Vertical axis counts; ENMO: Euclidean norm -1 g

**FIGURE 2** Proportion of children meeting the physical activity recommendation (at least 180 min a day engaging in physical activity at any intensity, with the inclusion of at least 60 min of moderate-to-vigorous PA considering different cut-points (Hildebrand et al.<sup>13,14</sup> for ENMO<sub>Hildebrand</sub>, Butte et al.<sup>10</sup> for VMCounts<sub>Butte</sub>, and Evenson et al.<sup>11</sup> for VACounts<sub>Evenson</sub>). VMCounts: Vector magnitude counts; ENMO: Euclidean norm -1 g; VACounts: Vertical axis counts

between VACounts<sub>Evenson</sub> and VMCounts<sub>Butte</sub> in SED (8.7), while the highest MAPE was between VACounts<sub>Evenson</sub> and ENMO<sub>Hildebrand</sub> in vigorous PA (785.9). Furthermore, the strongest LCCC was between VACounts<sub>Evenson</sub> and VMCounts<sub>Butte</sub> in moderate PA (0.82), while the weakest LCCC was between VMCounts<sub>Butte</sub> and ENMO<sub>Hildebrand</sub> in light PA (0.01).

Bland-Altman plots displayed in Figure 3 illustrate the differences in SED and PA estimates between each pair of the cut-points. The mean bias for SED and all PA intensities were large when comparing the cut-points. At the individual level, LOA were the widest for SED and light PA between VACounts<sub>Evenson</sub> and VMCounts<sub>Butte</sub> with ENMO<sub>Hildebrand</sub>, while LOA was the smallest for vigorous PA between VMCounts<sub>Butte</sub> and VACounts<sub>Evenson</sub>. Moreover, regarding

vigorous PA there was a trend between  $VACounts_{Evenson}$ and  $VMCounts_{Butte}$  with  $ENMO_{Hildebrand}$  showing a greater difference in estimates when the mean increased.

Table 4 shows associations of SED and PA intensities with BMI and WC. Using ENMO<sub>Hildebrand</sub>, SED was inversely and light PA directly associated with BMI (both p < 0.05). Using VACounts<sub>Evenson</sub> or VMCounts<sub>Butte</sub>, all associations with BMI were non-significant. Using ENMO<sub>Hildebrand</sub>, vigorous PA and MVPA were inversely associated with WC (both p < 0.05). Similarly, using VMCounts<sub>Butte</sub>, moderate PA and MVPA were inversely associated with WC. Using VACounts<sub>Evenson</sub>, light PA was directly associated with WC (p = 0.010), respectively.

Table S1 presents which multilevel mixed models contained the correct set of regressors in accordance with the TABLE 3 Comparison between sedentary time (SED) and physical activity (PA) calculated from different cut-points (N = 751)

	Difference (min/d)			MAPE	
	Mean <sup>a</sup> (95% CI)	SD	LOA	(%)	LCCC
SED					
$VACounts_{Evenson}$ vs. $ENMO_{Hildebrand}$	-319 (-322 to -315)	45.6	-408 to -229	44.8	0.02
$VACounts_{Evenson}$ vs. $VMCounts_{Butte}$	22 (20 to 24)	29.5	-36 to 80	8.7	0.76
$VMCounts_{Butte}$ vs. $ENMO_{Hildebrand}$	-341 (-344 to -338)	46.2	-431 to -250	48.0	0.03
Light PA					
$VACounts_{Evenson}$ vs. $ENMO_{Hildebrand}$	205 (203 to 207)	30.2	145 to 264	173.9	0.02
$VACounts_{Evenson}$ vs. $VMCounts_{Butte}$	-52 (-54 to -50)	22.7	−97 to −8	13.6	0.43
$VMCounts_{Butte}$ vs. $ENMO_{Hildebrand}$	257 (254 to 259)	36.1	186 to 327	217.3	0.01
Moderate PA					
$VACounts_{Evenson}$ vs. $ENMO_{Hildebrand}$	18 (17 to 19)	12.0	-5 to 42	62.9	0.28
$VACounts_{Evenson}$ vs. $VMCounts_{Butte}$	5 (5 to 6)	8.8	-12 to 23	24.5	0.82
$VMCounts_{Butte}$ vs. $ENMO_{Hildebrand}$	13 (12 to 14)	14.5	-16 to 41	47.8	0.40
Vigorous PA					
VACounts <sub>Evenson</sub> vs. ENMO <sub>Hildebrand</sub>	17 (16 to 17)	8.1	1 to 32	786.3	0.08
$VACounts_{Evenson}$ vs. $VMCounts_{Butte}$	7 (7 to 8)	3.9	-0 to 15	413.3	0.68
VMCounts <sub>Butte</sub> vs. ENMO <sub>Hildebrand</sub>	9 (9 to 10)	7.4	-5 to 24	89.3	0.15
MVPA					
VACounts <sub>Evenson</sub> vs. ENMO <sub>Hildebrand</sub>	35 (34 to 36)	16.3	3 to 67	102.3	0.21
$VACounts_{Evenson}$ vs. $VMCounts_{Butte}$	13 (12 to 13)	9.8	-6 to 32	64.0	0.79
VMCounts <sub>Butte</sub> vs. ENMO <sub>Hildebrand</sub>	22 (21 to 23)	18.0	-13 to 57	31.1	0.35

Data are presented as mean differences, 95% confident interval (CI), and standard deviation (SD) as well as limits of agreement (LOA), mean absolute percent error (MAPE), and Lin's concordance correlation coefficient (LCCC). Cut-points expressed with the acceleration metric used; Evenson et al.<sup>11</sup>, Hildebrand et al.<sup>13,14</sup>, and Butte et al.<sup>10</sup>.

Abbreviations: ENMO, Euclidean norm -1 g; MVPA, Moderate-to-vigorous physical activity; VACounts, Vertical axis counts; VMCounts, Vector magnitude counts.

<sup>a</sup>Based on paired-samples *t*-test, all mean differences were  $p \le 0.001$ .

*J* test. Regarding associations with BMI,  $ENMO_{Hildebrand}$  was more suitable compared to  $VMCounts_{Butte}$  or  $VACounts_{Evenson}$  in SED and light PA, while all three cut-points were equally suitable in moderate PA, vigorous PA, and MVPA. Regarding associations with WC,  $ENMO_{Hildebrand}$  was more suitable compared to  $VMCounts_{Butte}$  or  $VACounts_{Evenson}$  in SED and light PA, except  $VACounts_{Evenson}$  was equally suitable in SED.  $ENMO_{Hildebrand}$  and  $VACounts_{Evenson}$  were generally more suitable in models regarding moderate PA, vigorous PA, and MVPA.

In accordance with the main findings, sensitivity analyses found SED estimates differing between the cut-points after standardizing for wear time (all  $p \le 0.001$ ). In addition, MAPE was the lowest between VACounts<sub>Evenson</sub> and VMCounts<sub>Butte</sub> (9.7) and the highest between VMCounts<sub>Butte</sub> and ENMO<sub>Hildebrand</sub> (44.6). LCCC was the strongest between VACounts<sub>Evenson</sub> and VMCounts<sub>Butte</sub> (0.71) and the weakest between  $\text{ENMO}_{\text{Hildebrand}}$  against  $\text{VMCounts}_{\text{Butte}}$  and  $\text{VACounts}_{\text{Evenson}}$  (both 0.02).

#### 4 | DISCUSSION

This study aimed to compare (1) SED and intensity-specific PA estimates and (2) the associations of SED and PA with anthropometrics (BMI and WC) when using three different sets of cut-points, VACounts<sub>Evenson</sub>, VMCounts<sub>Butte</sub>, and ENMO<sub>Hildebrand</sub>, in preschool-aged children. All SED and PA estimates varied largely between the cut-points, although VACounts<sub>Evenson</sub> and VMCounts<sub>Butte</sub> were more consistent compared to ENMO<sub>Hildebrand</sub>. Furthermore, the proportion of children meeting the PA recommendations as well as the associations of SED and PA intensities with BMI and WC were highly discrepant across the different cut-points.





**FIGURE 3** Bland-Altman plots with their limits of agreements using three different cut-points (Hildebrand et al.<sup>13,14</sup> for ENMO<sub>Hildebrand</sub>, Butte et al.<sup>10</sup> for VMCounts<sub>Butte</sub>, and Evenson et al.<sup>11</sup> for VACounts<sub>Evenson</sub>), N = 751

The SED and PA estimates differed between the three
cut-points used in the current study. Especially there
was a lack of equivalence and poor agreement between
$ENMO_{Hildebrand}$ with VACounts <sub>Evenson</sub> and VMCounts <sub>Butte</sub> .
The poor agreement was interpreted, among other things,
as large bias in the LOA analyses, which has also been seen
in 10-year-old children comparing moderate PA, vigorous
PA, and MVPA estimates between ENMO <sub>Hildebrand</sub> and
Romanzini et al. <sup>22,24</sup> We found that VMCounts <sub>Butte</sub> provided
the lowest SED estimates followed by VACounts <sub>Evenson</sub> and
ENMO <sub>Hildebrand</sub> . The finding regarding VMCounts <sub>Butte</sub> and
VACounts <sub>Evenson</sub> is similar to what has been previously $\frac{7}{7}$
shown in another study in preschoolers, who reported
that SED estimates were lower using VMCounts <sub>Butte</sub> com-
pare to VACounts <sub>Janssen</sub> . In school-aged children, <sup>°</sup> it was
shown that ENMO <sub>Hildebrand</sub> provided higher SED estimates
compared to vACounts <sub>Evenson</sub> , and the current study indi-
cates that the trend is also present in younger children.
moreover, we observed that the estimates of light PA were
timates followed by VACounts and VMCounts
This suggests a possible misclassification of light $PA$ as
SED when using the ENMO
She when using the hitrito Hildebrand compared to the

other cut-points included in this study. It is likely that the different metrics and cut-points for SED and light PA may have led to these somewhat differing estimates. VACounts<sub>Evenson</sub> has been indicated to provide more accurate estimates of SED and light PA compared to other cutpoints using VACounts for ActiGraph when assessed by room calorimetry measurements in preschool-aged children.<sup>23</sup> Thus, it is possible that ENMO<sub>Hildebrand</sub> may detect some light PA as SED, whereas VMCounts<sub>Butte</sub> may detect some SED as light PA. However, none of these can be used as a criterion. In future studies, the use of machine learning<sup>38</sup> or cut-point free<sup>39</sup> alternatives should be considered in order to improve classification of PA. Nevertheless, the findings of the current study should be acknowledged when comparing SED and light PA estimates using ENMO<sub>Hildebrand</sub>, VMCounts<sub>Butte</sub>, or VACounts<sub>Evenson</sub> measurements in young children.

The estimates of MVPA were the lowest using VMCounts<sub>Butte</sub> ENMO<sub>Hildebrand</sub> followed by and VACounts<sub>Evenson</sub>. The observation regarding VMCounts and VACounts is similar to results previously reported in preschoolers,<sup>7</sup> though the opposite has been observed in school-aged children.<sup>6</sup> In addition to different cut-points,

time (SED) and physical activity (PA) with		β
body mass index and waist circumference using three different cut-points (N = 712-713)	ENMO <sub>Hildebrand</sub>	
	SED	-0.09
	Light PA	0.09
	Moderate PA	0.00
	Vigorous PA	0.01
		0.00

**MVPA** 

Moderate PA	0.00	0.91	-0.06	0.078
Vigorous PA	0.01	0.90	-0.10	0.004
MVPA	0.00	0.91	-0.07	0.038
'MCounts <sub>Butte</sub>				
SED	0.02	0.64	0.05	0.16
Light PA	-0.03	0.41	-0.01	0.70
Moderate PA	0.00	0.97	-0.08	0.012
Vigorous PA	0.04	0.28	-0.04	0.16
MVPA	0.02	0.67	-0.08	0.017
ACounts <sub>Evenson</sub>				
SED	-0.06	0.14	-0.04	0.21
Light PA	0.06	0.13	0.08	0.010
Moderate PA	0.01	0.85	-0.04	0.19
Vigorous PA	0.05	0.17	-0.04	0.26

**Body mass index** 

p-value

0.043

0.028

Values are standardized coefficiens ( $\beta$ ) with their *p*-values based on multilevel mixed modelling. Statistically significant values are bolded.

0.03

Adjusted for the child's sex and age, accelerometer wear time, research time, and parental educational level. The analyses regarding waist circumference were additionally adjusted for child's height.

0.46

Abbreviations: ENMO, Euclidean norm -1 g; MVPA, Moderate-to-vigorous physical activity; VACounts, Vertical axis counts; VMCounts, Vector magnitude counts.

TABLE 4 Multilevel mixed modelling

showing the associations of sedentary

p-value

0.40

0.35

0.18

Waist circumference

β

-0.03

0.03

-0.04

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the epoch length (VACounts -15s versus VMCounts - 60s) might have influenced estimates, as shorter epoch length may capture more MVPA. The activity pattern of young children is intermittent and includes very short bouts of movement, which is why shorter epoch lengths might be more suitable in capturing higher PA intensities.<sup>20</sup> We also found that ENMO<sub>Hildebrand</sub> provided lower MVPA estimates compared to VMCounts<sub>Butte</sub> and VACounts<sub>Evenson</sub>, which is supported by the previous studies in school-aged children,<sup>6,22</sup> although opposite results have also been reported.<sup>19</sup> It is notable that the MVPA estimates based on ENMO<sub>Hildebrand</sub> are equivalent with the studies<sup>6,22</sup> observing lower estimates using ENMO<sub>Hildebrand</sub> compared to Hänggi et al.<sup>40</sup> and VMCounts<sub>Romanzini</sub> using VMCounts as well as to VACounts<sub>Evenson</sub>. The relatively small differences regarding ENMO<sub>Hildebrand</sub> are promising in terms of comparing PA outputs between studies.

In the current study, we observed that the proportion of children meeting the PA recommendation varied from 4% (ENMO<sub>Hildebrand</sub>) to 46% (VMCounts<sub>Butte</sub>) and 70% (VACounts<sub>Evenson</sub>). VACounts<sub>Evenson</sub> leading to higher rates compared to VMCounts<sub>Butte</sub> is in line with the study in preschoolers reporting that cut-points by VACounts<sub>Evenson</sub> led to higher rates compared to Janssen et al.23 using VMCounts.7 Moreover, ENMO<sub>Hildebrand</sub> leading to lower rates compared to VACounts<sub>Evenson</sub> as well as VMCounts<sub>Hänggi</sub> and VMCounts<sub>Romanzini</sub> is similar to what has been reported in school-aged children.<sup>6,19</sup> The differences in time spent in MVPA are largely explaining these differences, since all preschool-aged children have been reported to fulfill the PA recommendation of 180 min of any PA intensity when leaving the stricter MVPA requirement out based on VACounts<sub>Evenson</sub> and VMCounts<sub>Janssen</sub>. Since the PA recommendation has been used to describe sufficient levels of PA in young children, it is important to be aware of the differences in the rates of complying with the PA recommendations. However, it is worth noting that the development of the PA recommendations have been based mainly on self-reported PA data<sup>1</sup> and, thus, these rates should be observed with caution. Nevertheless, more research is needed to provide information on healthrelated PA based on objective methods between studies.

To the best of our knowledge, this is the first study investigating associations of SED and PA estimates with anthropometry using ENMO<sub>Hildebrand</sub> measurements. We found that lower SED and higher light PA were associated with a higher BMI using ENMO<sub>Hildebrand</sub>, but no associations were found when using VMCounts<sub>Butte</sub> or VACounts<sub>Evenson</sub>. One reason for the associations with BMI is that the threshold for light PA in ENMO<sub>Hildebrand</sub> detects light PA differently compared to counts and, therefore, some of the light PA may have been detected as SED. It is worth noting that previous studies in preschool-aged children have reported mainly null results between SED and BMI<sup>41</sup> and inconsistent results between PA and BMI<sup>1</sup> when SED and PA have been based on cut-points using VMCounts or VACounts. Furthermore, MVPA and vigorous PA have been observed to positively associate with fat-free mass, but not with fat mass.<sup>42</sup> Since BMI is an indicator of both, the associations may be difficult to detect. Thus, BMI may not be an accurate assessment to identify children with a high body fatness at preschool age,<sup>43</sup> which may explain the lack of significant associations. Nevertheless, the associations of SED and PA based on ENMO<sub>Hildebrand</sub> measurements with BMI should be crossvalidated using a different study population and to confirm or contravene our findings.

Vigorous PA and MVPA using  $\text{ENMO}_{\text{Hildebrand}}$  and moderate PA and MVPA using  $\text{VMCounts}_{\text{Butte}}$  were inversely associated with WC and the magnitudes of the associations were consistent. Moreover, the findings regarding MVPA was supported by the *J* test. Interestingly, light PA using  $\text{VACounts}_{\text{Evenson}}$  was directly associated with WC, which is in line with the previously mentioned association between light PA using  $\text{ENMO}_{\text{Hildebrand}}$  and BMI. This may indicate that light PA using  $\text{VACounts}_{\text{Evenson}}$  and  $\text{ENMO}_{\text{Hildebrand}}$  detect children with unfavourable anthropometrics in a similar manner.

The wear times also varied between the cut-points as the data processing methods and algorithms differed, especially between ENMO and VMCounts/VACounts. Since we wanted to compare the actual values of the SED and PA estimates, we did not adjust the values for wear times. However, the associations of SED and PA estimates with anthropometry were adjusted for wear times in order to be comparable with the previous findings regarding associations of SED and PA with BMI and WC. However, since wear time may influence SED estimates, we ran sensitivity analyses by standardizing the SED estimates for wear times. In accordance with the findings, the differences remained similar between the cut-points when accounting for wear time.

The strengths of the present study include a relatively large sample of children and the assessment of SED and PA in free-living conditions with the high compliance rate. In addition, the accelerometer processing allowed us to use three different metrics and cut-points, VACounts, VMCounts, and ENMO, based on the measurements from the same children during the same days. Yet, the similar protocols have been previously conducted in school-aged children.<sup>6</sup> We are not aware of the previous studies investigating associations of SED and PA estimates using ENMO<sub>Hildebrand</sub> with health outcomes in preschoolers. We included BMI and WC as outcomes, since they have both been recommended to be used as a routine measurement in clinical practice.<sup>44</sup> Increasing knowledge of the comparability of the associations based on different metrics and cut-points with the commonly used measurements is not only highly valuable for PA researchers, but also for clinicians in promoting health of young children and their families.

The study also has some limitations that need to be considered. Firstly, the cut-points we used were based on different studies including different samples and protocols, which may have produced different estimates. Secondly, the VACounts<sub>Evenson</sub> and ENMO<sub>Hildebrand</sub> have been validated in slightly older children (5-8 years and 7-11 years, respectively) compared to VMCounts<sub>Butte</sub>, which may have led to somewhat different SED and PA estimates. We also considered cut-points by Crotti et al.<sup>45</sup> for ENMO metrics that has been developed for 5-7-year-old children. However, we chose to use the cutpoints by Hildebrand et al.<sup>13,14</sup> and Evenson et al.,<sup>11</sup> since they are more commonly used cut-points for ENMO and VACounts currently providing the largest body of reference data.<sup>6,19,20,22</sup> Furthermore, using similar protocols in processing the accelerometer data with a previous study<sup>6</sup> provides possibility to confirm findings in another population and age group. Future studies should clarify how PA and SED estimates on children based on the cut-points by Crotti et al.<sup>45</sup> relates to the others (e.g., VACounts<sub>Evenson</sub>, VMCounts<sub>Butte</sub>, and ENMO<sub>Hildebrand</sub>). Some standing behaviour might have been misclassified as SED in this study. Although, a hip-worn ActiGraph accelerometer has been found to accurately classify SED when comparing to ActivePAL,<sup>46</sup> it is worth noting that the authors offer a cut-point of <22 counts per minute for an optimal for hip vertical axis, which is substantially lower than the commonly used <100 counts per minute. However, since the study was conducted in older adults (>70 years old), there is no information how such cutpoints perform in young children. Therefore, the cutpoint <100 counts per minute was used in the current study. In addition, there is probably little time per day in which a preschool child is standing still for a sustained period of time and consequently, the misclassification of standing versus SED time might be less of a problem in preschoolers than in other populations. Finally, the cross-sectional study design rejects any conclusion about causality to be drawn from the association of SED and PA with BMI and WC. However, the aim of the study was to compare the associations between the three cut-points with anthropometry, and not focus on investigating the associations themselves.

In conclusion, our study showed large discrepancies in the SED and PA estimates between the three cut-points studied in preschool-aged children, which is in line with previous findings among school-aged children.<sup>6</sup> We also presented a great variety in the associations of SED and PA with BMI and WC depending on the different cutpoints. Such knowledge is essential when comparing health outcomes between studies using different methods. Furthermore, the proportions of children meeting the PA recommendations varied largely between the cut-points used, which should be acknowledged in health promotion. In future studies, more attention should be paid to improve the comparability of SED and PA estimates in young children by, for instance, harmonizing accelerometer raw data processing methods.

#### 5 | PERSPECTIVES

In the current study, we provide an overview on the comparability of three different cut-points based on both traditional activity counts and open-source metrics in classifying SED and intensity-specific PA in preschool-aged children. Our study shows that there is great variety in the SED and PA estimates, which precludes comparisons across studies using different methods. This variety also leads to significant differences in the proportions of children meeting the PA recommendations, which makes it nearly impossible to determine the accurate rates. In addition to incongruences in the SED and PA estimates, our study also shows that the associations with health outcomes, such as BMI or WC, might be affected by the selection of cut-points. Thus, our results not only confirm findings from previous studies, but also extend the current literature to compare three cut-points from different metrics for young children. In future studies, there is a great need for data pooling and harmonization in order to improve comparability between studies.

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#### **CONFLICT OF INTEREST**

None of the authors had a conflict of interest.

#### DATA AVAILABILITY STATEMENT

The data are not publicly available due to research ethical reasons and because the owner of the data is the Folkhälsan Research Center and not the research group. However, researchers interested in the data and materials from the DAGIS study may contact principal investigator Eva Roos, eva.roos@folkhalsan.fi.

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#### SUPPORTING INFORMATION

Additional supporting information may be found in the online version of the article at the publisher's website.

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