

#### 1 Title: Wrist accelerometer cut-points for classifying sedentary behavior in children.

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#### 21 Abstract

Introduction: To examine the validity and accuracy of wrist accelerometers for classifying
sedentary behavior (SB) in children.

Methods: Fifty-seven children (5-8y and 9-12y) completed a ~170min protocol including 15
semi-structured activities and transitions. Nine ActiGraph (GT3X+) and two GENEActiv
wrist cut-points were evaluated. Direct observation was the criterion measure. The accuracy
of wrist cut-points was compared to that achieved by the ActiGraph hip cut-point (≤25
counts/15s) and the thigh-mounted activPAL3<sup>TM</sup>. Analyses included equivalence testing,
Bland-Altman procedures and area under the receiver operating curve (ROC-AUC).

**Results:** The most accurate ActiGraph wrist cut-points (Kim, vector magnitude: <3958 30 counts/60s and vertical axis: ≤1756 counts/60s) demonstrated good classification accuracy 31 32 (ROC-AUC = 0.85-0.86) and accurately estimated SB time in 5-8y (equivalence p=0.02; mean bias: 4.1%, limits of agreement [LoA]: -20.1-28.4%) and 9-12y (equivalence p<0.01; -33 2.5%, -27.9-22.9%). Mean bias of SB time estimates from Kim were smaller than ActiGraph 34 hip (5-8y: 15.8%, -5.7-37.2%; 9-12y: 17.8%, -3.9-39.5%) and similar to or smaller than 35 activPAL3<sup>TM</sup> (5-8y: 12.6%, -39.8-14.7%; 9-12y: -1.4%, -13.9-11.0%), although classification 36 accuracy was similar to ActiGraph hip (ROC-AUC = 0.85) but lower than activPAL3<sup>TM</sup> 37 (ROC-AUC = 0.92-0.97). Mean bias (5-8y: 6.5%, -16.1-29.1%; 9-12y: 10.5%, -13.6-34.6%) 38 for the most accurate GENEActiv wrist cut-point (Schaefer: ≤0.19g) was smaller than 39 ActiGraph hip, and activPAL3<sup>TM</sup> in 5-8y, but larger than activPAL3<sup>TM</sup> in 9-12y. However, 40 SB time estimates from Schaefer were not equivalent to direct observation (equivalence 41 p>0.05) and classification accuracy (ROC-AUC = 0.79-0.80) was lower than for ActiGraph 42 hip and activPAL3<sup>TM</sup>. 43

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44 **Conclusion:** The most accurate SB ActiGraph (Kim) and GENEActiv (Schaefer) wrist cut-45 points can be applied in children with similar confidence as the ActiGraph hip cut-point ( $\leq 25$ 46 counts/15s), although activPAL3<sup>TM</sup> was generally more accurate.

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48 Keywords: activity monitor, youth, validation, physical activity, objective measurement,

49 sitting

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## 51 Introduction

Sedentary behaviors (SB) are defined as any waking behaviors in a sitting or reclining 52 position that require an energy expenditure of  $\leq 1.5$  metabolic equivalents (30). Although 53 54 some studies among children and adolescents suggest that the total volume or pattern of SB is associated with adverse health outcomes, independent of moderate- to vigorous intensity 55 physical activity (MVPA) (7, 8, 24), overall the evidence appears to be inconsistent (6, 11). 56 57 Accurate measures of SB are essential for both observational and experimental research to further investigate the influence of SB on health outcomes, as well as the prevalence and 58 determinants of SB, and the effectiveness of interventions to reduce SB. 59

Accelerometry is the method of choice for objectively measuring the amount and patterning of SB in children (32) and various accelerometers are available for placement on different body locations (e.g. hip, wrist or thigh) (17). Hip-mounted accelerometers have commonly been used in children (32), with cut-point approaches typically applied to define SB (17). For example, large population surveys, such as the National Health and Nutrition Examination Study (NHANES) 2003-2004 incorporated hip-worn ActiGraph accelerometers and SB time was estimated using a <100 counts/minute threshold (22). However, concerns 67 about low participant compliance to accelerometry protocols and subsequent data loss have resulted in a shift from hip to wrist placement (14). NHANES 2011-2014 (31) incorporated 68 wrist-worn accelerometers and the data from this study and other initial reports (13, 28) 69 70 indicate that wrist-placement results in increased wear time due to greater compliance, which in turn leads to greater confidence that the data are representative of daily physical activity 71 and SB. The ActiGraph (ActiGraph LLC, Pensacola Beach, FL) and GENEActiv 72 (ActivInsights Ltd., Cambridge, UK) are accelerometer-based motion sensors typically worn 73 on the hip or wrist. Thresholds or cut-points have been developed for the wrist-worn 74 75 ActiGraph (5, 9, 19) and GENEActiv (26, 29) to classify SB in children. The wrist cut-points were developed using different age groups, sample sizes and activity protocols, which results 76 in variations in the cut-points used to classify SB. For example, wrist cut-points developed 77 78 for ActiGraph's vertical axis (VA; x-axis) range from 35 counts[c]/5s (9) to 202c/5s (Chandler et al., personal communication, 2016). Using different accelerometer models, 79 placing them at different body locations, and applying different cut-points, results in 80 81 considerable differences in estimates of SB (17, 28), which makes it difficult to compare outcomes between studies and examine the epidemiology of SB. Therefore, comparison of 82 these assessment methods is needed. Rowlands et al. (2014) compared free-living SB 83 estimates from a GENEActiv (26) signal vector magnitude (SVM) wrist cut-point 84 (Phillips<sub>SVM</sub>: right wrist, <6gs; left wrist, <7gs) with the widely used ActiGraph hip cut-point 85 86 for VA (Evenson:  $\leq 25c/15s$ ) (12) in a sample of free-living 10-12 year-olds (28). This study reported that the outcomes from these monitors were highly correlated, however, sedentary 87 time estimated by Phillips<sub>SVM</sub> was significantly lower (9.6%) than estimates from the 88 ActiGraph hip cut-point. Because the study did not have a criterion measure of SB, the level 89 of error from each measure is unknown. Furthermore, the relative validity of the range of 90

91 GENEActiv and ActiGraph wrist cut-points remains unknown, because only one92 accelerometer model and one cut-point for the wrist were evaluated.

It is also important to evaluate the validity of recent SB wrist cut-points against 93 94 alternative objective measures to understand the accuracy of newer approaches relative to other options for assessing SB. One alternative method is thigh-mounted accelerometry, such 95 as the activPAL3<sup>TM</sup> (PAL Technology Ltd., Glasgow, UK) posture detection system, which 96 classifies periods spent sitting/lying, standing or stepping. Because of the monitor's 97 placement on the thigh, it uses the orientation (angle to vertical) of the thigh to accurately 98 estimate SB (34), rather than simply the movement intensity measures used in traditional hip-99 based cut-point approaches which have difficulties differentiating between standing and 100 sitting (17, 21). Whether or not wrist-based cut-point approaches provide equally accurate 101 estimates of SB relative to alternative approaches such as hip- or thigh-based accelerometry 102 103 is unclear and requires further investigation. Furthermore, it is important to evaluate the accuracy of the wrist cut-points to detect breaks in SB in order to understand their influence 104 105 on health outcomes.

To our knowledge, no comprehensive validation studies have been conducted in 106 107 children in which sedentary wrist cut-points for the ActiGraph or GENEActiv have been evaluated simultaneously during a standardised activity protocol, against a criterion measure 108 and alternative objective measures of SB. Therefore, the aims of this study were to examine 109 the classification accuracy and validity of sedentary wrist cut-points for ActiGraph and 110 GENEActiv, relative to the hip-mounted ActiGraph (Evenson: <25c/15s) and the thigh-111 mounted activPAL3<sup>TM</sup>, using direct observation as the criterion measure in 5-12 year-olds. 112 Based on evidence that the thigh-mounted activPAL3<sup>TM</sup> demonstrated acceptable accuracy 113 for classifying SB in school-aged children (34) and that traditional hip-based accelerometers 114 115 tend to overestimate time spent in SB (17), and the assumption that wrist cut-points might have similar difficulties as hip cut-points in discriminating between standing and sitting, it was hypothesized that the most accurate wrist cut-points would demonstrate similar accuracy as the hip cut-point for assessing SB, but lower accuracy than the thigh-mounted activPAL3<sup>TM</sup>.

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#### 121 Methods

122 *Participants* 

Fifty-seven children aged 5-12y who were without physical or health conditions that would affect participation in physical activity were recruited as part of an activity monitor validation study. The study was approved by the University of Wollongong Health and Medical Human Research Ethics Committee. Written parental consent and participant assent were obtained prior to participation.

128 Procedures

Participants were required to visit the laboratory on two occasions. Anthropometric 129 130 measures were completed during the first visit using standardised procedures while children were wearing light clothing and with shoes removed. BMI  $(kg/m^2)$  and weight status were 131 calculated (20). Children completed a protocol of 15 semi-structured activities from sedentary 132 (lying down, TV viewing, handheld e-game, writing/coloring, computer game), light (getting 133 ready for school, standing class activity, slow walk, dancing), and moderate-to-vigorous (tidy 134 up, brisk walk, soccer, basketball, running, locomotor course) intensity (Supplemental Digital 135 Content 1). Activities were equally divided over 2 visits and completed in a structured order 136 of increasing intensity for 5 min, except for lying down (10 min). 137

At each visit, children were fitted with an ActiGraph GT3X+ on the right hip (midaxilla line at the level of the iliac crest) with an elastic belt, and an ActiGraph GT3X+ and a GENEActiv dorsally on each wrist. The distal and proximal position of the ActiGraph and GENEActiv monitors on each wrist was alternated for each participant to avoid placement effects. An activPAL3<sup>TM</sup> was placed mid-anteriorly on the right thigh.

143 *Activity monitors* 

The ActiGraph GT3X+ is a tri-axial accelerometer that measures accelerations 144 ranging in magnitude  $\pm 6g$ . Raw accelerometry data can be stored at a user-specified sample 145 frequency ranging from 30-100Hz. The GENEActiv has a waterproof design and measures 146 tri-axial accelerations ranging in magnitude  $\pm 8g$  at a sample frequency ranging from 10-147 148 100Hz. The ActiGraph and GENEActiv were initialised with a sample frequency of 100Hz. Data reduction approaches were performed according to the methods used to develop each 149 cut-point (Table 1), as reported in original calibration studies (5, 9, 12, 19, 26, 29). Raw 150 151 ActiGraph data were downloaded using ActiLife version 6.12.1. ActiGraph hip and wrist data 152 were converted to counts per 5s (5, 9), 15s (12), or 60s (19) corresponding to the epoch lengths used in their development. Output variables for ActiGraph monitors were VA, which 153 is sensitive to movement only along the longitudinal axis of the lower arm or the dominant 154 plane of the body (hip) and vector magnitude (VM), a 3-dimensional measure of the 155 acceleration which is not sensitive to orientation and direction of movement. Raw 156 GENEActiv wrist data were downloaded and converted into 1s epochs using the GENEActiv 157 software version 2.2 according to methods described by Philips et al. (26), in order to create 158 159 gravity-subtracted signal vector magnitude (SVMgs) data. Customized software was used to filter the raw GENEActiv data (bandpass filter, cut-off frequencies: 0.2 and 15Hz) in order to 160 remove the gravitational acceleration component as well as high-frequency sensor noise, as 161

described by Schaefer et al. (29). An average gravity-subtracted signal vector magnitude(SVMg) was then calculated for each second using a formula described by the authors.

The activPAL3<sup>TM</sup> is an activity monitor worn on the thigh that uses tri-axial acceleration data (20Hz) to assess the position and movement of the limb. The activPAL3<sup>TM</sup> software version 7.2.32 with proprietary algorithms was used to classify tri-axial accelerometry data into periods spent sitting/lying, standing or stepping. Event records created by the software were used to create 1s epoch data files which were used in the analyses to classify periods spent sedentary. The activPAL3<sup>TM</sup> was initialised with minimum sitting or upright period of 1s.

#### 171 *Direct observation*

Direct observation was used as criterion measure to establish the classification 172 173 accuracy and validity of the cut-points. Children were recorded on video completing the activities as well as during transitions between activities. A single observer coded all videos 174 using Vitessa 0.1 (University of Leuven, Belgium) which generated a time stamp every time 175 a change in posture or intensity was coded by the observer. Subsequently, a second-by-176 second classification system was generated. Every second following the time stamp inserted 177 by the observer was classified as being the same posture as the one occurring at the time 178 stamp itself until the next time stamp was created, indicating that a change in the child's 179 posture had occurred. In the event of two postures occurring within the same second, this 180 second was duplicated in order to label both postures. Labels for postures were sitting/lying 181 182 (gluteus muscles resting on ground, feet, legs or any other surface, or lying in prone position), standing (e.g both feet touching the ground, squatting, standing on one foot, kneeling on one 183 184 or two knees), stepping (e.g moving one leg in front of the other, including stepping with a flight phase, jumping, stepping, sliding/side gallop) and "off screen" for direct observation 185

186 using 1s epochs. A dichotomous coding system was applied to re-code postures into sedentary (sitting/lying: "1") and non-sedentary (standing, stepping: "0"). Videos of 5 187 randomly selected participants were analysed twice by the same observer and by a second 188 189 observer to test inter- and intra-observer reliability. Inter- and intra-observer reliability were examined using Cohen's Kappa and single measure intra-class correlation coefficients (ICC) 190 from two-way mixed effect models (fixed-effects = observer; random effects = participants), 191 using the consistency definition. Cohen's Kappa coefficient for inter-observer reliability was 192 0.941. Inter-observer ICC was 0.974 (0.974 - 0.974) and intra-observer ICC was 0.963 (0.962) 193 194 - 0.963).

#### 195 Data synchronization

196 Monitors and direct observation were time synchronized using an internal computer clock. Second-by-second direct observation data were synchronized with 1s epoch data from 197 activPAL3<sup>TM</sup> and GENEActiv. Direct observation and activPAL3<sup>TM</sup> data files contained 198 199 events of duplicated seconds when two postures were assigned to the same second. If this was the case for direct observation data, these seconds were duplicated at the corresponding time 200 point for activPAL3<sup>TM</sup> and GENEActiv output. If this was the case for activPAL3<sup>TM</sup> data, the 201 202 seconds were duplicated for direct observation and GENEActiv output. The second-bysecond duplicates were not generated for ActiGraph output, because these data were exported 203 in 5s, 15s and 60s epochs. This method was applied for evaluation of classification accuracy 204 and was in line with previous validation studies in preschool children (10, 18). In order to 205 align direct observation with ActiGraph epochs, new time frames were created for direct 206 207 observation with steps of 5s, 15s and 60s. If >50% of the seconds within an epoch were classified as sedentary, the epoch was coded as sedentary ("1"), if  $\leq 50\%$  of the epoch was 208 classified as sedentary, the epoch was coded as non-sedentary ("0"). The synchronized direct 209 210 observation and accelerometry data were excluded when direct observation epochs were

coded as "off screen". For estimates of time spent in different postures, codes of duplicated
seconds for either direct observation (0.02% of total direct observation data) or accelerometer
(0.04% of total activPAL3<sup>TM</sup> data) were assigned 0.5sec, in order to avoid artificially
inflating the total time observed. The absolute number of SB breaks for each method was
defined as the number of transitions from SB to non-SB.

216 *Statistical analyses* 

Prior to analyses, the total sample was divided into two age groups (5-8y, n=25 and 9-217 12y, n=32) because of the potential that younger and older children might engage in SB 218 differently (17). Analyses included equivalence testing, Bland-Altman procedures and 219 calculating sensitivity, specificity and area under the receiver operating curve (ROC-AUC) to 220 221 evaluate and compare the accuracy and validity of different SB cut-points for wrist mounted ActiGraph and GENEActiv accelerometers, hip-worn ActiGraph accelerometer and 222 activPAL3<sup>TM</sup>. The equivalence of estimated sedentary time from different activity monitors, 223 224 sites and cut-points and direct observation was examined at the group level of measurement 225 using the 95% equivalence test. In order to reject the null-hypothesis of the equivalence test, the 90% confidence interval (CI) of time spent sedentary predicted by the monitors should 226 227 fall entirely within the predefined equivalence region of  $\pm 10\%$  (2). The 90% CIs of the estimated sedentary time were bootstrapped, because the sample sizes of the age groups were 228 relatively small and, therefore, not all data were normally distributed. Agreement and 229 systematic bias for estimated sedentary time were evaluated at the individual level using 230 Bland-Altman procedures (17). For the ROC analyses, classification accuracy was rated as 231 232 excellent (ROC-AUC  $\ge$  0.90), good (ROC-AUC = 0.80-0.89), fair (ROC-AUC = 0.70-0.79) or poor (ROC-AUC < 0.70) (23). The difference between the absolute number of SB breaks 233 estimated by the monitors and direct observation was tested using paired sample *t*-tests. 234

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# 236 **Results**

Descriptive characteristics of participants are presented in Table 2. All participants 237 completed the protocol and had valid activPAL3<sup>TM</sup> and ActiGraph wrist and hip data. For one 238 of the visits, video data were unavailable for 3 children (age 5, 9 and 10y) and GENEActiv 239 240 wrist data were unavailable for 3 different children (all 9-12y). Out of the remaining 250,854 1s epochs from 5-8y and 296,134 epochs from 9-12y, 27,983 epochs and 23,513 epochs of 241 direct observation were coded as "off screen" and excluded from analyses, respectively, 242 leaving 222,872 (88.8%) valid epochs for 5-8y and 272,622 (92.1%) valid epochs for 9-12y. 243 Mean direct observation time for 5-8y was  $167.2 \pm 21.9$  min, of which  $78.0 \pm 11.8$  min was 244 coded as SB. Mean direct observation time for 9-12y was 154.2  $\pm$  35.6 min, of which 69.5  $\pm$ 245 18.4 min was coded as SB. Results are presented for the non-dominant wrist (unless stated 246 otherwise), because placement on this wrist was recommended by the physical activity 247 monitor protocol (4) released by the National Health and Nutrition Examination Survey and 248 previous studies have used the non-dominant wrist for the development of wrist cut-points (5, 249 16, 29). Results for the dominant wrist are presented in Supplemental Digital Content. 250

#### 251 Validation of ActiGraph wrist cut-points

Figures 1 (5-8y) and 2 (9-12y) present the 95% equivalence tests for accelerometry-based estimated time spent in SB from wrist-worn ActiGraph and GENEActiv cut-points, the hipworn ActiGraph cut-point and activPAL3<sup>TM</sup>, as well as the equivalence region of direct observation. At the group level, estimates of SB time from Kim et al.'s ActiGraph VM wrist cut-point (Kim<sub>VM</sub>) were equivalent to direct observation (p=0.02) in 5-8y, and estimates from the VA cut-point (Kim<sub>VA</sub>) approached equivalence (p=0.08). Mean bias for estimated SB time from Kim<sub>VM</sub> was 4.1% (limits of agreement [LoA]: -20.1% – 28.4%) (Table 3), whereas 259 Kim<sub>VA</sub> underestimated SB time by 6.5% (LoA: -33.1% - 20.2%). In 9-12y, Crouter<sub>VA/ROC</sub> and Kim<sub>VA</sub> were equivalent to direct observation (p<0.01) and Crouter<sub>VM/ROC</sub> approached 260 equivalence (p=0.05). These cut-points underestimated SB time by 1.7% (LoA: -25.9% -261 22.5%), 2.5% (LoA: -27.9% - 22.9%) and 5.3% (LoA: -27.9% - 22.9%), respectively. 262 Estimates of SB time from other ActiGraph wrist cut-points were not equivalent to direct 263 observation in either age group. The mean bias varied from 7.2% (Crouter<sub>VA/ROC</sub>) to 20.5% 264 (Chandler<sub>VA/2016</sub>) in 5-8y and from 10.9% (Crouter<sub>VA/REG</sub>) to 29.6% (Chandler<sub>VA/2016</sub>) in 9-265 12y. Good classification accuracy (Table 4) was found for Kim<sub>VA</sub> (both age groups: ROC-266 267 AUC = 0.86) and Kim<sub>VM</sub> (5-8y: ROC-AUC = 0.85; 9-12y: ROC-AUC = 0.82). Classification accuracy for other ActiGraph wrist cut-points was fair (5-8y: ROC-AUC = 0.77-0.79, 9-12y:268 ROC-AUC = 0.72-0.75). At the individual level (Table 3), LoAs for all cut-points, including 269 270 the most accurate ActiGraph wrist cut-points, were relatively wide (range = Chandler<sub>VA/2016</sub> in 5-8y: 0.0% - 41.0%; to Chandler<sub>VA/2016</sub> in 9-12y: -6.6% - 65.9%), which indicated large 271 random error. No systematic bias (Table 3) was found for any of the ActiGraph wrist cut-272 points (p>0.05). Findings of the equivalence test, classification accuracy and Bland-Altman 273 analyses for ActiGraph wrist cut-points for the dominant wrist (Supplemental Digital Content 274 2, 3 and 4) were consistent with findings for the non-dominant wrist. Compared to direct 275 observation, the absolute number of breaks were overestimated by all ActiGraph cut-points in 276 both age groups for both wrists (5-8y: mean difference range = 2.4-160.8, all p<0.05; 9-12y: 277 278 mean difference range = 1.8-138.6, all p<0.05), except from Kim<sub>VM</sub> for the non-dominant wrist (5-8y: mean difference =  $1.4\pm5.7$ , p=0.24; 9-12y: mean difference = 1.8, p=0.05) 279 (Supplemental Digital Content 5). Mean differences with direct observation were larger for 280 281 wrist cut-points developed with 5sec epochs (5-8y: 154.4±4.1, 9-12y: 129.9±5.2) compared to cut-points developed with 60sec epochs (5-8y: 2.9±1.2, 9-12y: 2.5±0.8). 282

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| 285 | Estimates of SB time from GENEActiv wrist cut-points Phillips <sub>SVM</sub> and Schaefer <sub>SVM</sub>        |
|-----|---|
| 286 | for the non-dominant wrist were not equivalent to direct observation (Figures 1 and 2).                         |
| 287 | Phillips <sub>SVM</sub> and Schaefer <sub>SVM</sub> overestimated SB time in 5-8y by 16.8% (LoA: -3.9% – 29.6%) |
| 288 | and 9.6% (LoA: -13.8% - 33.0%), respectively, and in 9-12y by 17.8% (LoA: -11.6% -                              |
| 289 | 47.3%) and 12.6% (LoA: -12.3% – 37.6%), respectively (Table 3). Although estimates from                         |
| 290 | the GENEActiv wrist cut-points for the dominant wrist were also not equivalent to direct                        |
| 291 | observation in both age groups, the cut-points performed slightly better for this wrist when                    |
| 292 | estimating SB time at the group level (Supplemental Digital Content 4). For the dominant                        |
| 293 | wrist, Phillips <sub>SVM</sub> and Schaefer <sub>SVM</sub> overestimated SB time in 5-8y by 8.1% (LoA: -24.0% – |
| 294 | 40.1%) and 6.5% (LoA: -16.1% – 29.1%), respectively, and in 9-12y by 8.2% (LoA: -18.6%                          |
| 295 | - 35.0%) and 10.5% (LoA: -13.6% - 34.6%), respectively (Supplemental Digital Content 2).                        |
| 296 | Classification accuracy for all GENEActiv wrist cut-points were fair to good in both age                        |
| 297 | groups and for both wrists (ROC-AUC = $0.79-0.80$ ). At the individual level, the LoA was                       |
| 298 | smallest for Phillips <sub>SVM</sub> (-3.9% – 29.6%), although all other LoAs for GENEActiv cut-points          |
| 299 | were relatively wide, which indicated large random error (Table 3 and Supplemental Digital                      |
| 300 | Content 2). No systematic bias was found for any of the GENEActiv wrist cut-points                              |
| 301 | (p>0.05). All GENEActiv wrist cut-points overestimated the absolute number of breaks                            |
| 302 | compared to direct observation in both age groups (5-8y: mean difference range = 354.8-                         |
| 303 | 468.8, all p<0.01; 9-12y: mean difference range = 313.2-398.1, all p<0.01) (Supplemental                        |
| 304 | Digital Content 5). Mean differences with direct observation were larger for the GENEActiv                      |
| 305 | wrist cut-points developed with 1sec epochs, compared to the ActiGraph cut-points                               |
| 306 | developed with both 5sec epochs and 60sec epochs.   |

308 Comparison of validity of wrist cut-points against ActiGraph hip cut-point and activPAL3<sup>TM</sup>

In 5-8y, estimates of SB time by activPAL3<sup>TM</sup> (12.6% [LoA: -39.8% - 14.7%]) and 309 the hip-worn ActiGraph (15.8% [LoA: -5.7% - 37.2%]) were not equivalent to direct 310 observation, and the most accurate ActiGraph wrist cut-points (Kim<sub>VA</sub> and Kim<sub>VM</sub>), 311 GENEActiv wrist cut-points for the dominant wrist and Schaefer<sub>SVM</sub> for the non-dominant 312 wrist had smaller mean biases. Despite these differences, LoAs for the ActiGraph and 313 GENEActiv wrist cut-points were similarly wide to activPAL3<sup>TM</sup> and the hip-worn 314 ActiGraph. In contrast to the group level findings, classification accuracy for the Kim cut-315 points were significantly lower than activPAL3<sup>TM</sup> (ROC-AUC = 0.92, 95%CI = 0.92-0.93), 316 but similar to the hip-worn ActiGraph (ROC-AUC = 0.85, 95%CI = 0.84-0.85) in 5-8y. 317 Classification accuracy of both GENEActiv wrist cut-points for the non-dominant and 318 dominant wrist was significantly lower than activPAL3<sup>TM</sup> and the hip-worn ActiGraph. 319

In 9-12y, estimates of SB time by activPAL3<sup>TM</sup> were equivalent to DO (-1.4% [LoA: 320 321 -13.95 - 11.0%]) (p<0.01), which was also the case for the most accurate ActiGraph wrist cut-points (Crouter<sub>VA/ROC</sub> and Kim<sub>VA</sub>). However, mean biases were larger and estimates of 322 SB time were not equivalent to direct observation for the hip-worn ActiGraph (17.8% [LoA: -323 324 3.9% - 39.5%]), and GENEActiv cut-points for either wrist in 9-12y. LoAs for the ActiGraph and GENEActiv wrist cut-points were wider than activPAL3<sup>TM</sup>, but similar to ActiGraph on 325 the hip in 9-12y. The most accurate ActiGraph wrist cut-point (Kim<sub>VA</sub>) exhibited lower 326 classification accuracy than activPAL3<sup>TM</sup> (ROC-AUC = 0.97, 95%CI = 0.97-0.97), but was 327 similar to the hip-worn ActiGraph (ROC-AUC = 0.85, 95%CI = 0.84-0.85) in 9-12y. 328 Classification accuracy of the GENEActiv cut-points for both wrists was lower than 329 activPAL3<sup>TM</sup> and the hip-worn ActiGraph, in 9-12y. 330

Mean differences with direct observation for SB breaks were larger for most ActiGraph and both GENEActiv wrist cut-points compared to the activPAL3<sup>TM</sup> (5-8y: 8.5±6.0, p<0.01; 9-12: 3.2±3.1, p<0.01) and the hip-worn ActiGraph (5-8y: 33.2±13.7, p<0.01; 9-12: 29.3±10.9, p<0.01) in both age groups, except for the Kim<sub>VM</sub> cut-points where the differences were smaller.

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#### 337 Discussion

This study examined the accuracy and validity of ActiGraph and GENEActiv wrist 338 cut-points for classifying SB in 5-12 year-old children. The ActiGraph wrist cut-points 339 340 Kim<sub>VM</sub> and Kim<sub>VA</sub> accurately estimated SB time in 5-8y and 9-12y, respectively, at the group level, and exhibited good classification accuracy. These cut-points provided more accurate 341 estimates of SB time compared to the Evenson ActiGraph hip cut-point ( $\leq 25c/15s$ ). Although 342 GENEActiv wrist cut-points appeared to provide more accurate group-level estimates of SB 343 time than the ActiGraph hip cut-point for 5-8y and 9-12y, these cut-points over-estimated SB 344 345 time, and classification accuracy was significantly lower than for the ActiGraph hip cut-point and activPAL3<sup>TM</sup> in both age groups. Excluding an overestimation of SB time in 5-8y, 346 activPAL3<sup>TM</sup> exhibited greater accuracy than the ActiGraph and GENEActiv wrist cut-points 347 348 and the ActiGraph hip cut-point. Overall, the most accurate ActiGraph and GENEActiv wrist cut-points estimated SB with similar accuracy as the ActiGraph hip cut-point, although the 349 accuracy of the thigh-mounted activPAL3<sup>TM</sup> was generally higher. The KIM<sub>VM</sub> cut-point 350 estimated the absolute number of breaks in SB more accurately than the ActiGraph hip cut-351 point and activPAL3<sup>TM</sup> in both age groups, whereas the other ActiGraph and GENEActiv 352 353 wrist cut-points showed larger overestimations. To our knowledge, no previous studies have simultaneously evaluated the relative validity of multiple ActiGraph or GENEActiv wrist cut-354 points developed in different studies among children. Crouter et al. (9) cross-validated their 355

356 ActiGraph wrist cut-points using indirect calorimetry in an independent sample of 11-14 year-olds who completed 2h of unstructured physical activity. The authors reported that the 357 errors for estimated SB time were small (-8.6% - 2.5%) and not significantly different from 358 359 the criterion measure. However, traditional analyses that fail to reject the null hypothesis of similarity do not necessarily demonstrate that the cut-points meet an acceptable level of 360 accuracy (2). Therefore, testing the equivalence could be beneficial when examining the 361 362 clinical significance of potential errors. In our study, mean bias for estimated SB time from Crouter et al.'s cut-points were slightly larger, ranging from -7.2% to 11.5% in 5-8y and -363 364 1.7% to 16.8% in 9-12y. Equivalence testing indicated that only Crouter<sub>VA/ROC</sub> in 9-12y was equivalent to direct observation, although the classification accuracy for Crouter et al.'s cut-365 points across both age groups was only fair (ROC-AUC = 0.73 - 0.79). This suggests that, 366 367 although errors may appear small, they might still be meaningful and misclassification of SB and non-SB may cancel each other out. Other methodological differences between our study 368 and that of Crouter et al. (9), such as the younger age range of participants in our study could 369 370 have contributed to the differences in findings, because younger and older children potentially engage in and move between sedentary and non-sedentary behaviors differently 371 (17). Furthermore, the use of different criterion measures might have also contributed to the 372 differences in measurement errors. (17) 373

Kim et al. (19) used a protocol of 12 randomly selected semi-structured activities to develop ActiGraph wrist cut-points (Kim<sub>VA</sub> and Kim<sub>VM</sub>) in a sub-sample of 7-13 year-olds (n = 49), and also provided results for the Evenson ActiGraph hip cut-point ( $\leq$ 25c/15s, n = 125) against which wrist cut-points could be compared. Although ROC-AUC values were not reported for the hip-worn ActiGraph, sensitivity (Se: true positive rate) for the wrist cutpoints (Se: 93.0 – 94.3%) was similar to the hip cut-point (Se = 93.7%), whereas specificity (Sp: true negative rate) for the wrist cut-points (Sp: 79.9 – 83.5%) was lower than the hip cut381 point (Sp = 92.5%) for classifying SB, suggesting that the hip-worn ActiGraph was slightly more accurate for classifying non-SB activities. However, the current study found that the 382 classification accuracy for Kim et al.'s ActiGraph wrist cut-points and the ActiGraph hip cut-383 384 point was similar in both age groups. Cut-point approaches for hip-mounted monitors cannot reliably distinguish between standing still and SB, because SB is classified based on lack of 385 movement, resulting in non-SB activities with minimal lower body movement being 386 misclassified as SB. Because our study included transitions between activities, which likely 387 involved standing with minimal movement, as well as a standing "classroom activity", the 388 389 likelihood of misclassifying non-SB as SB by the hip-worn ActiGraph was higher than in Kim et al.'s (19) protocol. In contrast, Kim et al. (19) indicated that most instances of 390 misclassification of non-SB by the hip monitor occurred during a hand weight exercise 391 392 involving minimal trunk and lower body movement. As such, our findings suggest that wrist cut-points may have similar limitations to hip cut-points in misclassifying standing still as 393 SB. 394

395 In relation to wrist GENEActiv SB cut-points, Rowlands et al. (28) compared 396 Phillips<sub>SVM</sub> for the non-dominant wrist with the ActiGraph hip cut-point (Evenson:  $\leq 25c/15s$ ) in a sample of free-living 10-12 year-olds and reported that estimates of habitual SB time 397 were 9.6% lower for the GENEActiv wrist cut-point compared to the ActiGraph hip cut-398 point, however, we found that the estimates of these cut-points were similar. The difference 399 in study designs may have contributed to these contrasting findings. However, our results 400 showed larger misclassification of SB by Phillips<sub>SVM</sub> compared to the hip-worn ActiGraph, 401 and therefore precision for classifying SB and estimates at the individual level might be lower 402 than group-level estimates. 403

404 Although some cut-points in the current study appear to provide reasonably accurate 405 estimates of SB time, the ROC-AUC values indicate that classification accuracy was only 406 categorised as fair or good. For example, group level estimates of SB time from Kim<sub>VM</sub> and Kim<sub>VA</sub> were equivalent or almost equivalent to direct observation and mean biases were 407 smaller than that observed for the hip-worn ActiGraph and activPAL3<sup>TM</sup>, however ROC-408 AUC values were lower than activPAL3<sup>TM</sup> and similar to the ActiGraph hip cut-point. In 9-409 12y, the cut-points Crouter<sub>VA/ROC</sub> and Kim<sub>VA</sub> were equivalent to DO and estimates of SB time 410 were more accurate than the hip-worn ActiGraph and similar to activPAL3<sup>TM</sup>. However, 411 although classification accuracy for KimvA was good, classification accuracy for 412 Crouter<sub>VA/ROC</sub> was only fair and lower than both activPAL3<sup>TM</sup> and the hip-worn ActiGraph. 413 414 A possible explanation is that SB as estimated by wrist cut-points was misclassified as non-SB in some activities. For instance, the highest percentage of misclassified SB epochs (AG: 415 0.4%-7.3%, GA: 1.4%-5.7%) was found during the coloring activity in 5-8y, which requires 416 417 the child to use the hand, and so wrist monitors might record counts high enough to be misclassified as non-SB. In contrast, standing still while writing on a white board resulted in 418 the highest percentage of misclassified epochs during non-SB activities for the non-dominant 419 420 hand (5-8y: AG, 6.7%-9.7%, GA: 8.1%-8.6%; 9-12y: AG, 6.1%-9.0%, GA: 7.7%-8.3%), because the wrist monitors recorded low activity counts on this hand and misclassified 421 epochs during the task as SB. Misclassification of SB and non-SB for wrist cut-points may 422 cancel each other out, resulting in seemingly accurate group-level estimates of SB time. Hip-423 placed monitors on the other hand seem to overestimate SB time at the group level, due to the 424 425 misclassification of standing still as SB. The results of this study suggest that, while hipbased cut-points that typically misclassify standing still as SB, wrist cut-points exhibit some 426 misclassification of non-SB as SB and vice-versa. Progress on alternative approaches, such as 427 428 those utilising machine learning (15, 27, 33) is therefore required, but until such strategies are widely available, the use of the most accurate ActiGraph and GENEActiv wrist cut-points for 429 estimating SB is recommended. 430

431 ActiGraph wrist cut-points developed with 60s epochs seemed to perform better for estimating SB time at the group level and the absolute number of SB breaks, 432 and exhibited higher classification accuracy and compared to cut-points developed with 5s or 433 434 1s epochs. This could be explained by a higher number of data points when using shorter epochs, resulting in a higher chance of misclassification. The lower classification accuracy 435 with shorter epochs might have contributed to the lower performance of the GENEActiv 436 wrist cut-points as they were developed with 1 s data. This is in contrast to the common use 437 of short epochs for accurately capturing sporadic and intermittent bursts of high-intensity 438 439 physical activity in children (3). Previous studies have evaluated the effect of epoch length in free-living school-aged children using ActiGraph hip data and showed that time spent in SB 440 441 decreases when longer epochs are applied (1, 25). A possible explanation is that very short 442 periods (e.g. 1-5s) of standing relatively still might be fairly common in children, resulting in 443 non-SB being misclassified as SB using short epochs. In contrast, when using 60s epochs, standing still would need to occur for almost all of a 60s period for this to be misclassified as 444 445 SB, and it is possible that this is less common than short periods of standing still among children. Although most ActiGraph wrist cut-points designed for 5s epochs over-estimated 446 447 SB in our analyses, Crouter<sub>VA/ROC</sub> and Crouter<sub>VM/ROC</sub> under-estimated SB in 5-8y and exhibited similar accuracy as those for 60s epochs in 9-12y, and so the combination of epoch 448 and cut-point is likely to be important. Nevertheless, our findings indicate that the most 449 450 accurate SB wrist cut-points were designed for 60s epochs, which has implications for fieldbased applications. In studies of free-living children, estimates of both SB and physical 451 activity are often desirable. If data are reduced using short epochs such as 5s to estimate 452 453 physical activity, the most accurate SB cut-points for 5s epochs could be applied, such as Crouter et al.'s CrouterVA/ROC or CrouterVM/ROC (9) for ActiGraph and PhillipssvM (26) or 454 Schaefer et al.'s (29) for GENEActiv. Although these cut-points exhibited lower 455

456 classification accuracy than the most accurate 60s wrist cut-points and the ActiGraph hip cut-457 point, group-level estimates of SB time were more accurate than the ActiGraph hip cut-point.

A unique strength of the study was that several currently available wrist cut-points for 458 459 ActiGraph and GENEActiv were evaluated simultaneously, against a criterion measure and common alternative objective measures of SB. Another strength was that data from the entire 460 activity protocol in our study were analysed including transitions between activities, with the 461 aim to also include data of behaviors outside of structured activities. Additionally, the wide 462 age range of the sample allowed for analyses across two age groups. However, because the 463 study protocol predominantly included structured activities completed in a laboratory setting, 464 465 the findings should be confirmed under free-living conditions.

In summary, the use of the most accurate ActiGraph and GENEActiv wrist-based activity monitor cut-points for estimating SB can be applied in free-living children with similar confidence as the hip-based ActiGraph cut-point ( $\leq 25c/15s$ ), although alternative approaches may be needed to achieve the generally higher accuracy of thigh-based approaches such as activPAL3<sup>TM</sup>.

471

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## 484 Conflict of Interest

The authors have no conflict of interest to declare. The results of the present study do not constitute endorsement by the American College of Sports Medicine. The results are presented clearly, honestly, and without fabrication, falsification, or inappropriate data manipulation.

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#### **Supplemental Digital Content**

Supplemental Digital Content 1.docx Supplemental Digital Content 2.docx Supplemental Digital Content 3.docx Supplemental Digital Content 4.tif Supplemental Digital Content 5.docx

**Figure 1.** 95% equivalence test for accelerometry-based estimated time spent in sedentary behaviors in 5-8 year-olds.

Legend Figure 1: Times estimated by wrist-worn ActiGraph and wrist-worn GENEActiv cutpoints are equivalent to direct observation if 90% confidence intervals lie entirely within the equivalence region of direct observation.VA: vertical axis; VM: vector magnitude; SVM: gravity-subtracted signal vector magnitude; ROC: developed using receiver operating curve analysis; Regression: developed using regression analysis.

**Figure 2.** 95% equivalence test for accelerometry-based estimated time spent in sedentary behaviors in 9-12 year-olds.

Legend Figure 2: Times estimated by wrist-worn ActiGraph and wrist-worn GENEActiv cutpoints are equivalent to direct observation if 90% confidence intervals lie entirely within the equivalence region of direct observation. VA: vertical axis; VM: vector magnitude; SVM: gravity-subtracted signal vector magnitude; ROC: developed using receiver operating curve analysis; Regression: developed using regression analysis.

**Supplemental Digital Content 4.** 95% equivalence test for accelerometry-based estimated time spent in sedentary behaviors for the dominant wrist in a) 5-8 year-olds and b) 9-12 year-olds.

Legend Supplemental Digital Content 4: Times estimated by wrist-worn ActiGraph and wrist-worn GENEActiv cut-points are equivalent to direct observation if 90% confidence intervals lie entirely within the equivalence region of direct observation. VA: vertical axis; VM: vector magnitude; SVM: gravity-subtracted signal vector magnitude; ROC: developed using receiver operating curve analysis; Regression: developed using regression analysis.

# Table 1 Sedentary wrist cut-points

|           |                     | Outcome   |                             |                       |   |           |
|-----------|---------------------|-----------|-----------------------------|-----------------------|---|-----------|
| Monitor   | Author              | variable  | Abbreviation                | Sample                | Activities                              | Cut-point |
| ActiGraph | Chandler et al. (4) | Vertical  | Chandler <sub>VA/2015</sub> | n = 45                | Resting, enrichment, walking,           | <161c/5s  |
|           |                     | axis      |                             | Range = $8-12y$       | playground, splash pad, swimming,       |           |
|           |                     |           |                             | Mean age = 9.0y       | endurance run                           |           |
|           |                     |           |                             | 49% boys, 51% girls   |   |           |
|           |                     | Vector    | ChandlervM                  |                       |   | <305c/5s  |
|           |                     | Magnitude |                             |                       |   |           |
|           | Chandler et al.     | Vertical  | Chandler <sub>VA/2016</sub> | n = 167 (calibration: | Reading books, playing/sorting cards,   | <202c/5s  |
|           | (personal           | axis      |                             | n = 100)              | cutting and pasting from magazines,     |           |
|           | communication)      |           |                             | Range = 5-11y         | playing board games, eating a snack,    |           |
|           |                     |           |                             | Mean age = 8.0y       | playing games on a tablet, watching TV, |           |
|           |                     |           |                             | 58% boys, 42% girls   | and writing with a pencil, walking      |           |

| Crouter et al. (8) | Vertical  | Crouterva/ROC             | n = 181           | One out of four structured activity       | ≤35c/5s        |
|--------------------|-----------|---------------------------|-------------------|---|----------------|
|                    | axis      |                           | Range = $8-15y$   | routines including free-living activities |                |
|                    |           |                           | Mean age = 12.0y  | such as: resting, reading, watching TV,   |                |
|                    |           |                           | 53.6% boys, 46.4% | walking, running, computer games,         |                |
|                    |           |                           | girls             | cleaning, playing wall ball, soccer       |                |
|                    |           | Crouterv <sub>A/REG</sub> |                   |   | ≤105c/5s       |
|                    | Vector    | Crouterv <sub>M/ROC</sub> |                   |   | $\leq 100c/5s$ |
|                    | Magnitude |                           |                   |   |                |
|                    |           | Croutervm/REG             |                   |   | ≤275c/5s       |
| Kim et al. (21)    | Vertical  | Kim <sub>VA</sub>         | n = 49            | Set of 12 activities such as: reading,    | ≤1756c/60s     |
|                    | axis      |                           | Range = $7-13y$   | watching TV, walking, running, playing    |                |
|                    |           |                           | Mean age = 10.1y  | catch, basketball, stationary cycling     |                |
|                    |           |                           | 40.8% boys, 59.2% |   |                |
|                    |           |                           | girls             |   |                |
|                    | Vector    | Kim <sub>VM</sub>         |                   |   | ≤3958c/60s     |
|                    | Magnitude |                           |                   |   |                |

| GENEActiv | Phillips et al. (30) | SVMgs | Phillipssvm | n = 44            | Lying supine, seated DVD viewing,       | Right: <6gs, |
|-----------|----------------------|-------|-------------|-------------------|---|--------------|
|           |                      |       |             | Range = $8-14y$   | active computer games (boxing), using a | left: <7gs   |
|           |                      |       |             | Mean age = 10.9y  | Nintendo Wii, slow walking, brisk       |              |
|           |                      |       |             | 40.9% boys, 59.1% | walking, slow                           |              |
|           |                      |       |             | girls             | running and a medium run                |              |
|           | Schaefer et al. (35) | SVMg  | Schaefersvm | n = 24 children   | Resting, colouring, Lego® building, Wii | ≤0.19g       |
|           |                      |       |             | Range = $6-11y$   | Sports® games, treadmill walking,       |              |
|           |                      |       |             | Mean age $= 9.2y$ | jogging, running                        |              |
|           |                      |       |             | 54.2% boys, 45.8% |   |              |
|           |                      |       |             | girls             |   |              |
|           |                      |       |             |                   |   |              |

Notes Table 1: VA: vertical axis; VM: vector magnitude; c: counts; s: seconds; SVMg/gs: gravity-subtracted signal vector magnitude; g: gravity; gs: g · seconds; ROC: developed using receiver operating curve analysis; Regression: developed using regression analysis

 Table 2. Participant characteristics

|                         | 5-8y          | 9-12y         | Total            |
|-------------------------|---------------|---------------|------------------|
|                         | (n=25)        | (n=32)        | (n=57)           |
| Age (y)                 | $7.0 \pm 1.2$ | $10.9\pm1.2$  | $9.2\pm2.3$      |
| Sex                     |               |               |                  |
| Boys (n)                | 11 (44.0%)    | 17 (53.1%)    | 28 (49.1%)       |
| Girls (n)               | 14 (56.0%)    | 15 (46.9%)    | 29 (50.9%)       |
| Height (cm)             | $123.0\pm8.9$ | $146.0\pm9.2$ | $135.9 \pm 14.6$ |
| Body mass (kg)          | $24.1\pm4.0$  | $39.4\pm9.9$  | $32.7\pm10.9$    |
| BMI percentile          | $52.8\pm24.3$ | $53.5\pm31.9$ | $53.2\pm28.6$    |
| Overweight ( <i>n</i> ) | 2 (8.0%)      | 5 (15.6%)     | 7 (12.3%)        |
| Obese (n)               | -             | 2 (6.6%)      | 2 (3.5%)         |
| Race                    |               |               |                  |
| Caucasian ( <i>n</i> )  | 24 (96.0%)    | 30 (93.8%)    | 54 (94.7%)       |
| Asian ( <i>n</i> )      | 1 (4.0%)      | 2 (6.2%)      | 3 (5.3%)         |

Characteristics of the participants are presented as mean  $\pm$  SD, distributions of the sample are

presented in numbers (n) and percentages.

**Table 3** Agreement analysis of accelerometry-based estimations of sedentary behavior

 compared to direct observation.

|                    | Cut-point                   | Mean bias (%) | 95% LoA      | Slope p-value |
|--------------------|-----------------------------|---------------|--------------|---------------|
| ActiGraph wrist    | Crouter <sub>VA/ROC</sub>   |               |              |               |
| (vertical axis)    | 5-8y                        | 7.2           | -19.4 - 33.9 | 0.367         |
|                    | 9-12y                       | 1.7*          | -22.5 - 25.9 | 0.677         |
|                    | Crouter <sub>VA/REG</sub>   |               |              |               |
|                    | 5-8y                        | -7.6          | -30.4 - 15.2 | 0.673         |
|                    | 9-12y                       | -10.9         | -33.1 - 11.3 | 0.770         |
|                    | Chandler <sub>VA/2015</sub> |               |              |               |
|                    | 5-8y                        | -15.4         | -36.5 - 5.6  | 0.975         |
|                    | 9-12y                       | -19.0         | -42.1 - 4.1  | 0.726         |
|                    | Chandler <sub>VA/2016</sub> |               |              |               |
|                    | 5-8y                        | -20.5         | -41.0 - 0.0  | 0.966         |
|                    | 9-12y                       | -29.6         | -65.9 - 6.6  | 0.306         |
|                    | Kim <sub>VA</sub>           |               |              |               |
|                    | 5-8y                        | 6.5           | -20.2 - 33.1 | 0.718         |
|                    | 9-12y                       | 2.5*          | -22.9 - 27.9 | 0.892         |
| ActiGraph wrist    | Crouter <sub>VM/ROC</sub>   |               |              |               |
| (vector magnitude) | 5-8y                        | 11.5          | -16.8 - 39.8 | 0.323         |
|                    | 9-12y                       | 5.3           | -22.5 - 33.2 | 0.752         |
|                    | Crouter <sub>VM/REG</sub>   |               |              |               |
|                    | 5-8y                        | -11.0         | -35.2 - 13.1 | 0.436         |
|                    | 9-12y                       | -16.8         | -44.6 - 10.9 | 0.563         |
|                    |                             |               |              |               |

|                         | ChandlervM              |       |              |       |
|-------------------------|-------------------------|-------|--------------|-------|
|                         | 5-8y                    | -14.4 | -38.5 - 9.7  | 0.401 |
|                         | 9-12y                   | -20.8 | -49.8 - 8.1  | 0.542 |
|                         | Kim <sub>VM</sub>       |       |              |       |
|                         | 5-8y                    | -4.1* | -28.4 - 20.1 | 0.522 |
|                         | 9-12y                   | -13.3 | -43.7 - 17.1 | 0.454 |
| GENEActiv wrist         | Phillipssvm             |       |              |       |
| (signal vector          | 5-8y                    | -16.8 | -29.6 - 3.9  | 0.744 |
| magnitude)              | 9-12y                   | -17.8 | -47.3 - 11.6 | 0.737 |
|                         | Schaefer <sub>SVM</sub> |       |              |       |
|                         | 5-8y                    | -9.6  | -33.0 - 13.8 | 0.957 |
|                         | 9-12y                   | -12.6 | -37.6 - 12.3 | 0.898 |
| activPAL3 <sup>TM</sup> | 5-8y                    | 12.6  | -14.7 - 39.8 | 0.122 |
|                         | 9-12y                   | 1.4*  | -11.0 - 13.9 | 0.442 |
| ActiGraph hip           | 5-8y                    | -15.8 | -37.2 - 5.7  | 0.204 |
| (vertical axis)         | 9-12y                   | -17.8 | -39.5 - 3.9  | 0.260 |

Notes Table 3: LoA: limits of agreement; VA: vertical axis; VM: vector magnitude; SVM: gravity-subtracted signal vector magnitude; c: counts; s: seconds; g: gravity; gs:  $g \cdot$  seconds. Mean bias was calculated as: measured SB time – estimated SB time; a positive value indicates underestimation; a negative value indicates overestimation. \*Significantly equivalent to direct observation (p < 0.05).

|                 | Cut-point                   | Se % | 95% CI      | Sp % | 95% CI      | ROC-AUC | 95% CI      |
|-----------------|-----------------------------|------|-------------|------|-------------|---------|-------------|
| ActiGraph wrist | Crouterva/ROC               |      |             |      |             |         |             |
| (vertical axis) | 5-8y                        | 82.0 | 81.5 - 82.5 | 73.6 | 73.0 - 74.1 | 0.78    | 0.77 - 0.78 |
|                 | 9-12y                       | 72.1 | 71.7 - 72.6 | 76.5 | 76.0 - 77.0 | 0.74    | 0.74 - 0.75 |
|                 | Crouter <sub>VA/REG</sub>   |      |             |      |             |         |             |
|                 | 5-8y                        | 81.9 | 81.4 - 82.4 | 76.3 | 75.8 - 76.8 | 0.79    | 0.79 - 0.80 |
|                 | 9-12y                       | 83.3 | 82.8 - 83.7 | 66.5 | 66.0 - 67.0 | 0.75    | 0.75 - 0.75 |
|                 | Chandler <sub>VA/2015</sub> |      |             |      |             |         |             |
|                 | 5-8y                        | 86.2 | 85.7 - 86.6 | 72.2 | 71.7 - 72.7 | 0.79    | 0.79 - 0.80 |
|                 | 9-12y                       | 87.0 | 86.6 - 87.4 | 62.1 | 61.6 - 62.6 | 0.75    | 0.74 - 0.75 |
|                 | Chandler <sub>VA/2016</sub> |      |             |      |             |         |             |
|                 | 5-8y                        | 89.0 | 88.6 - 89.4 | 68.8 | 68.2 - 69.3 | 0.79    | 0.79 - 0.79 |
|                 | 9-12y                       | 89.4 | 89.0 - 89.8 | 58.8 | 57.5 - 58.5 | 0.74    | 0.73 - 0.74 |
|                 | Kim <sub>VA</sub>           |      |             |      |             |         |             |
|                 | 5-8y                        | 87.8 | 86.2 - 89.3 | 83.7 | 81.8 - 85.4 | 0.86    | 0.85 - 0.87 |
|                 | 9-12y                       | 89.5 | 88.0 - 90.8 | 83.2 | 81.5 - 84.8 | 0.86    | 0.85 - 0.87 |
| ActiGraph wrist | Crouter <sub>VM/ROC</sub>   |      |             |      |             |         |             |
| (vector         | 5-8y                        | 83.2 | 82.7 - 83.6 | 71.0 | 70.4 - 71.6 | 0.77    | 0.77 - 0.78 |
| magnitude)      | 9-12y                       | 73.0 | 72.5 - 73.4 | 73.6 | 73.0 - 74.1 | 0.73    | 0.73 - 0.74 |
|                 | Crouter <sub>VM/REG</sub>   |      |             |      |             |         |             |
|                 | 5-8y                        | 83.2 | 82.7 - 83.7 | 73.6 | 73.1 - 74.1 | 0.78    | 0.78 - 0.79 |
|                 | 9-12y                       | 83.5 | 83.1 - 84.0 | 62.3 | 61.8 - 62.8 | 0.73    | 0.73 - 0.73 |
|                 |                             |      |             |      |             |         |             |
|                 |                             |      |             |      |             |         |             |

 Table 4 Classification accuracy of accelerometry-based estimations of sedentary behavior.

|                         | Chandler <sub>VM</sub>  |    |      |             |      |             |      |             |
|-------------------------|-------------------------|----|------|-------------|------|-------------|------|-------------|
|                         | 5-8                     | 8y | 84.8 | 84.3 - 85.3 | 71.5 | 71.0 - 72.1 | 0.78 | 0.78 - 0.79 |
|                         | 9-12                    | 2y | 84.8 | 84.4 - 85.3 | 59.6 | 59.1 - 60.2 | 0.72 | 0.72 - 0.73 |
|                         | Kim <sub>VM</sub>       |    |      |             |      |             |      |             |
|                         | 5-8                     | 8y | 93.6 | 92.3 - 94.7 | 77.0 | 74.9 - 79.0 | 0.85 | 0.84 - 0.86 |
|                         | 9-12                    | 2y | 93.5 | 92.3 - 94.5 | 71.3 | 69.3 - 73.2 | 0.82 | 0.81 - 0.83 |
| GENEActiv wrist         | Phillips <sub>SVM</sub> |    |      |             |      |             |      |             |
| (signal vector          | 5-8                     | 8y | 87.5 | 87.4 - 87.7 | 72.9 | 72.7 - 73.0 | 0.80 | 0.80 - 0.80 |
| magnitude)              | 9-12                    | 2y | 86.8 | 86.7 - 87.0 | 73.3 | 73.1 - 73.4 | 0.80 | 0.80 - 0.80 |
|                         | Schaefer <sub>SVM</sub> |    |      |             |      |             |      |             |
|                         | 5-8                     | 8y | 82.6 | 82.4 - 82.7 | 75.4 | 75.2 - 75.6 | 0.79 | 0.79 - 0.79 |
|                         | 9-12                    | 2y | 83.6 | 83.4 - 83.7 | 75.1 | 74.9 - 75.2 | 0.79 | 0.79 - 0.79 |
| activPAL3 <sup>TM</sup> | 5-8                     | 8y | 97.9 | 97.8 - 98.0 | 87.0 | 86.9 - 87.2 | 0.92 | 0.92 - 0.93 |
|                         | 9-12                    | 2y | 97.7 | 97.6 - 97.8 | 95.9 | 95.8 - 96.0 | 0.97 | 0.97 - 0.97 |
| ActiGraph hip           | 5-8                     | 8y | 92.7 | 92.1 - 93.3 | 76.3 | 75.4 - 77.2 | 0.85 | 0.84 - 0.85 |
| (vertical axis)         | 9-12                    | 2y | 93.6 | 93.0 - 94.1 | 75.9 | 75.0 - 76.7 | 0.85 | 0.84 - 0.85 |

Notes Table 4: Se: sensitivity; Sp: specificity; CI: confidence intervals; ROC-AUC: area

under the receiver operating curve; VA: vertical axis; VM: vector magnitude; SVM: gravity-

subtracted signal vector magnitude; c: counts; s: seconds; g: gravity; gs: g  $\cdot$  seconds.









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