# Using Accelerometers in Youth Physical Activity Studies: A Review of Methods 

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#### Abstract

BACKGROUND: In 2005, investigators convened by the National Cancer Institute recommended development of standardized protocols for accelerometer use and reporting decision rules in articles. A literature review was conducted to document accelerometer methods and decision rule reporting in youth physical activity articles from 2005-2010.

METHODS: Nine electronic databases identified 273 articles that measured physical activity and/or sedentary behavior using the most-used brand of accelerometer [Actigraph]. Six key methods were summarized by age group (preschool, children, and adolescents) and trends over time were examined.

RESULTS: Studies using accelerometers more than doubled from 2005-2010. Methods included 2 ActiGraph models, 6 epoch lengths, 6 non-wear definitions, 13 valid day definitions, 8 minimum wearing day thresholds, 12 moderate-intensity physical activity cut points, and 11 sedentary cut points. Child studies showed the most variation in methods and a trend toward more variability in cut points over time. Decision rule reporting improved, but only $54 \%$ of papers reported on all methods.

CONCLUSION: The increasing diversity of methods used to process and score accelerometer data for youth precludes comparison of results across studies. Decision rule reporting is inconsistent, and trends indicate declining standardization of methods. A methodological research agenda and consensus process are proposed.


## INTRODUCTION

Because of the worldwide increase in overweight and obesity in youth, there is a growing interest in the promotion of physical activity in these age groups. However, to draw meaningful conclusions about physical activity prevalence and outcomes of interventions, valid, reliable, and feasible measures are needed. Parent or self-report measures of physical activity are commonly used and can provide useful information about the context of physical

[^0]activity, but these methods are limited by biased reporting and low validity. ${ }^{1,2}$ Consequently, objective methods, especially accelerometers, to assess physical activity in children and adolescents are becoming increasingly used. Several reviews concluded that accelerometers provide an accurate, reliable, and practical objective measure of physical activity in children and adolescents. ${ }^{3-6}$ The feasibility of accelerometer use in large studies is illustrated by their use in a nationally representative sample of the United States population, aged 6 years and above, in the National Health and Nutrition Examination Survey (NHANES). ${ }^{7}$

Nonetheless, there are recognized methodological challenges related to accelerometer use and they were outlined in a special issue of Medicine and Science in Sports and Exercise (2005), 'Gaps and Challenges in the Science of Accelerometry'. Ward and colleagues ${ }^{8}$ made recommendations for future research and best practices for accelerometer use. An important recommendation was for researchers to state their methodologic 'decision rules' (i.e. choice of epoch length for recording data, criteria for valid days and number of wearing days, etc.) in articles. A clear description of these decision rules can allow comparison among studies and facilitate the analysis process. Moreover, Ward et al. ${ }^{8}$ called for development of common practices and guidelines when using and scoring accelerometers with children and adolescents. Other researchers like Rowlands ${ }^{6}$ and Trost and colleagues ${ }^{9}$ also emphasized the need for standardized protocols for accelerometer use.

The recommendations published by Ward et al. ${ }^{8}$ in 2005 formed the basis of the present review, with the goal of documenting the evolution of accelerometer methods in children and adolescent studies from 2005-2010. As a first aim, we examined which methods (accelerometer model, epoch length, non-wear time, valid days, minimum number of valid wear days, and cut points) were reported and whether there was a trend for researchers to apply more standardized accelerometer protocols. Secondly, we investigated whether there has been an increase in reporting the specific 'decision rules' in accelerometer studies since 2005. To achieve these aims, we conducted a detailed review of the accelerometer methods in published physical activity studies in preschoolers (<6 years), children (6-11 years), and adolescents (12-18 years).

## METHOD

The present review focused on six key methodological issues related to accelerometer data collection and scoring: accelerometer model, epoch length, definition of non-wear time within a day, definition of a valid day, required number of valid wear days, and the choice of cut points for various intensities of physical activity and sedentary behavior.

## Accelerometer model

Numerous accelerometer models are commercially available, but a systematic review concluded that the ActiGraph (Pensacola, FL) had the largest body of evidence to support its use ${ }^{10}$ and was the most commonly used accelerometer in physical activity research. Therefore, the review was limited to studies using the ActiGraph. In 2005, a new model of ActiGraph (the GT1M) was developed and its comparability with the older model (7164) is still being examined. Some studies have shown comparability between models in moderate-to-vigorous physical activity (MVPA), ${ }^{11-13}$ while others have shown differences in overall
counts and on the lower end of the spectrum (i.e., sedentary and light activity). ${ }^{11}$ The newer ActiGraph requires a higher acceleration to record a nonzero count than the older 7164 models ${ }^{14}$ so the comparability of data across ActiGraph models remains uncertain.

## Epoch length

The epoch is the amount of time over which activity counts are integrated and recorded, and it affects estimates of moderate-to-vigorous physical activity in children. ${ }^{15-17}$ Because of the limited memory capacities of earlier accelerometer models, a 1-minute epoch has been the most commonly used, but shorter epochs appear to more accurately record the intermittent, short bursts of physical activity common in young people. ${ }^{5,9}$

## Processing data

Accelerometers produce large data sets that have grown more complex with the introduction of 3-axis models. Although software programs for screening and scoring accelerometer data are now available (MeterPlus (www.meterplussoftware.com), NHANES SAS program (http://riskfactor.cancer.gov/tools/nhanes_pam), Kinesoft (www.kinesoft.org)), the specific procedures for processing data remain important concerns and affect outcomes. For example, one issue is how researchers define overall 'wear time,' which is important because non-compliance with data collection protocols is common. There is a sequence of decisions that define 'wear time': (a) definition of non-wear time within a day, (b) definition of a valid day, and (c) number of valid wear days for a record to be considered sufficiently reliable and representative of typical behavior. These data processing decisions have the potential to affect sample sizes and physical activity estimates. ${ }^{18}$

Non-wear time within a day.-Non-wear time is typically identified by summing the number of consecutive ' 0 ' counts per minute (cpm), and 'wear time' is then calculated by subtracting non-wear time from total possible time. However, it is important to differentiate between ' 0 ' counts that are due to: 1) wearing but being sedentary, which can result in ' 0 ' counts, and 2) true not wearing, either per instructions (sleeping, swimming, etc.) or due to poor compliance with the wearing protocol. To complicate this issue, sporadic non-zero counts can occur within strings of ' 0 ' counts due either to small movements by the person wearing the accelerometer or by incidental movement during non-wear periods (e.g., jostled while on the nightstand). Some non-wear algorithms allow for a small number of non-zero counts during non-wear time (e.g., up to 2 consecutive minutes $<100 \mathrm{cpm}$ ). ${ }^{7}$

Definition of a valid day.-A valid day is typically defined by a minimum number of wearing hours but can be determined in other ways such as calculating study-specific ratios (e.g., $70 / 80$ rule where valid is $80 \%$ of a time period defined by $70 \%$ of the sample having data) ${ }^{19}$ or applying a minimum and maximum counts per day threshold (e.g., $<10,000$ and $>20,000,000$ excluded). ${ }^{20}$ The definition might be different for weekdays and weekends and may also differ by age. Ward and colleagues ${ }^{8}$ suggested that adolescents need more daily wear time to be representative of usual activity than children, for example. The more wear time required per day, the greater the reduction in valid days and sample sizes. ${ }^{21}$

Minimum number of valid wear days.-The final decision in defining overall wear time is the number of valid wearing days required to represent 'usual' activity. Recommendations typically range from 3 to 10 days ${ }^{3,22}$ and reliability estimates differ by age and sex. ${ }^{23-24}$ Ward and colleagues ${ }^{8}$ suggested that 7 days might be a reasonable standard for all ages. It is recommended that at least one weekend day is required to obtain reliable estimates. ${ }^{6,9,25}$ The number of wear days required also impacts sample sizes. Some studies accept fewer days and use imputation or probability methods to maximize sample sizes, ${ }^{7,19}$ while other studies apply a more stringent requirement for wear days and place a greater emphasis on boosting compliance rates. ${ }^{26-27}$

## Cut points

Moderate-to-vigorous physical activity (MVPA): A proliferation of published thresholds or cut points to translate accelerometer counts into minutes of physical activity has produced an ongoing debate about which cut points to use in research. The choice of MVPA cut points has a tremendous impact on study comparability, and numerous studies have shown large differences in physical activity prevalence depending on the choice of cut points. ${ }^{3,5,28-34}$ Cut points can vary based on the results of studies that have "calibrated" accelerometers by defining counts per minute in relation to physical activity intensity. Calibration studies have been conducted in laboratories and field settings and have used a wide variety of methods. ${ }^{35}$ At a 4 MET intensity (i.e., 4 times resting energy expenditure), recommended counts per minute have ranged from 1400 to $3600 .{ }^{25,36-37}$ Another source of variation is the selection of MET definitions of MVPA, with common definitions ranging from 3 to 4.6 METs. ${ }^{25,36,38}$ To add complexity, some calibration studies recommended agespecific cut points, ${ }^{25,36,39-40}$ and others used the same cut points for all ages. 34-35,37-38,41-42

Sedentary behavior: Sedentary behavior has been identified as a chronic disease risk factor that is independent of physical activity. ${ }^{43}$ Low counts per minute from accelerometry can be used to measure sedentary time. ${ }^{38,41-42}$ Similar to the issues with MVPA cut points, numerous cut points have been created to classify sedentary behavior. Two studies have shown that the choice of a sedentary cut point can change estimates by more than 4 hours per day in preschoolers. ${ }^{5,34}$

## Review Methods

An electronic search of studies published in 2005-2010 was conducted through EBSCOhost and PubMed using the following databases: MEDLINE, Academic Search Premier, CINAHL Plus with Full Text, ERIC, MAS Ultra - School Edition, PsycARTICLES, PsycEXTRA, PsycINFO and SPORTDiscus. The literature search used any of the following keywords to capture accelerometer data collection: 'accelerometer', 'accelerometers', 'accelerometry', 'CSA', 'activity meter', 'MTI', 'actigraph', OR 'activity monitor' in combination with (using the Boolean term AND) any of the following keywords to represent physical activity: 'physical activity', 'MVPA', 'intensity', 'threshold', sedentary', 'moderate', 'vigorous', 'cut points', 'cutpoints’, 'cut-points', OR ‘METs’.

Inclusion criteria included a) studies reporting accelerometer-based physical activity or sedentary outcomes, b) studies of youth aged 0-18 years, and c) full text English language publications. Exclusion criteria included a) studies not using the ActiGraph accelerometer (Pensacola, FL; www.theactigraph.com), b) studies of adults >18 yrs of age, c) studies not reporting ambulatory movement (e.g., sleep studies), d) methodological papers, review papers, editorials, and comments, and e) studies with less than 1 complete day of accelerometer monitoring (e.g., school recess studies).

The initial literature search yielded 3020 articles. After applying an age criterion of $0-18$ years and removing 6 duplicate references, 573 articles remained. These abstracts were reviewed for inclusion before obtaining the full text articles. Exclusion details are outlined in Figure 1. After excluding 300 articles ( 264 based on reviewing the abstract and 36 after a complete review of the article), 273 were deemed suitable for this literature review.

Articles were abstracted by 2 reviewers and discrepancies were resolved by a third reviewer. The following information was extracted from each paper: study characteristics (e.g., authors, year, study name, study aims, age), sample size, ActiGraph model, epoch length, wear time definitions (i.e., non-wear time within a day, number of valid hours, minimum number of wear days required, number of weekend days required), cut point for moderate physical activity, cut point for sedentary behavior, and other relevant methods. If any of the above information was missing from the articles, the variable was coded as 'missing'. When authors referenced other papers for accelerometer methods, the referenced articles were reviewed and if the methods were not reported, the variable was coded as 'missing'. When methods were described in an unclear way, they were also coded as 'missing'. In some cases, the reference did not match reported cut point values. These were flagged for incorrect reference but the reported value was retained (not coded as 'missing').

Results were summarized for the whole age range and according to age group: preschoolers (<6 yrs or specific reference to "preschool"), children (6-11 yrs or specific reference to elementary or primary school), and adolescents (12-18 yrs or specific reference to secondary, middle, or high school). When the age range spanned categories, mean age or mid-point age (if mean was not available) was used to determine the age category. Papers were sorted by study name and when more than one paper from the same study was discovered, the methods were compared. The studies describing identical methods or using the same reference for methods were grouped together as one 'study' and included only once in the summary table (Table 1). Incomplete methods were filled in from same-study papers where feasible to obtain the most complete report possible. The most recent reference within the same-study papers was used for the year of publication. Studies that published papers at different stages of the study (e.g., TAAG: Trial for Activity in Adolescent Girls), or analyzed data from different cohorts (e.g., EYHS: European Youth Heart Study), were grouped together by participant characteristics. For example, within the TAAG set of papers, there were 3 'studies' (included 3 times in the summary table): 6th graders, $8^{\text {th }}$ graders, and $6^{\text {th }} \& 8^{\text {th }}$ graders combined. Groupings were also made within studies when different cut points were used. For example, within the EYHS set of papers, there were 6 'studies': 9 yr olds (Freedson cut points), ${ }^{25,36} 9$ yr olds (EYHS cut points), ${ }^{44-45} 9 \& 15 \mathrm{yr}$ olds (Freedson
cut points), $9 \& 15 \mathrm{yr}$ olds (Treuth cut points), ${ }^{38} 9 \& 15 \mathrm{yr}$ olds (EYHS cut points), and $9 \&$ 15 yr olds (counts only).

Papers were coded by publication year and divided into 3 groups: 2005-2006, 2007-2008, and 2009-2010. Because the selection of cut points has created the most controversy in the field and has consistently been shown to impact the comparability of results, we plotted the distribution of the most commonly used thresholds by year to examine whether researchers' choices have become more homogeneous over time (Figure 2 and Figure 3). The frequencies of 'missing' methods were also plotted to examine whether reporting on the key issues improved since 2005 (Figure 4). In addition to examining each method separately, a 'reporting' score was calculated for each article; number of methods reported divided by the total number of relevant methods, out of 6 possible. Reporting scores were plotted by publication year (Figure 5). Methods not relevant to an article were not included in the denominator (e.g., an article reporting only activity counts would not have a 'cut points' variable in the denominator).

## RESULTS

The results of the literature review are presented in the Review Table (see Supplemental Appendix for Review Table and references). A total of 273 articles ( 25 preschool, 140 child and 108 adolescent) were included in this review. The distribution of articles by year from 2005-2010 was $27,37,46,55,62$ and 46, respectively.

After grouping papers from the same studies (as described above), it was determined that the 273 identified articles actually represented 183 studies ( 21 preschool, 94 child, and 68 adolescent), which were used as the basis for the summary of the key methodological issues (Table 1). The key findings are outlined below.

## Year of publication

Thirty-eight of the studies in Table 1 were published in 2005-2006, 60 in 2007-2008, and 85 in 2009-2010. While increases in accelerometer studies were seen in all age groups, the largest increase was seen in child studies with more than a threefold increase from 14 to 47 from 2005-2006 to 2009-2010, respectively.

## Accelerometer model

Since 2005, two ActiGraph models were used: the older 7164 model (previously referred to as the 'CSA'), and the newer GT1M. The majority of studies across all age groups used the older models. The GT1M first appeared in articles in 2007, with about $7 \%$ of studies reporting using it. This increased to $36 \%$ of studies in 2010. About $23 \%$ of child studies used the GT1M, while only $9.5 \%$ and $11.8 \%$ of preschool and adolescent studies, respectively, used this newer model. It is notable that about $20 \%$ of preschool and adolescent studies did not report which ActiGraph model was used.

## Epoch length

Six different epochs were used, ranging from 2s to 60 s (seconds). The majority of the studies in children and adolescents used a 60s epoch ( $66.0 \%$ and $63.2 \%$ respectively). There was a trend toward using shorter epochs in preschoolers. In preschool studies, an equal number used 15 s and $60 \mathrm{~s}(42.9 \%$ each $)$. In child studies, the second most common epoch was 10s ( $9.6 \%$ ), and in adolescent studies the second most common was 30s (13.2\%). Across the child studies, 6 epochs were used, while preschool and adolescent studies used 4 epochs. Most of the studies not reporting epoch length refer to analyzing 'counts per minute' so it could be assumed they used a 60 second epoch. Adolescent studies were the most likely not to report epoch length ( $16.2 \%$ ).

## Non-wear time within a day

Six definitions of 'non-wear time' were reported, ranging from 10-180 minutes of consecutive zero counts. Three definitions (10, 20 and 60 minutes) were used in preschool studies with similar occurrence. In child and adolescent studies, 10- and 20-minute strings of zeros were the most common. Child studies showed the most variation in determining nonwear time ( 5 definitions), and adolescent studies used 4 definitions. Non-wear time within a day was the most likely method not to be reported, with $66.7 \%, 48.9 \%$, and $42.6 \%$ of preschool, children, and adolescent studies, respectively, not reporting this.

## Definition of a valid day

Determination of a 'valid day' was highly variable, with 13 definitions used. Most studies (110 of 183) used a number of valid hours but a few (16 of 183) used counts or ratios of time (e.g., $80 \%$ of average wearing time) to define a valid day. Preschool studies used 7 definitions with 6 and 10 valid hours being the most common ( $14.3 \%$ each). Child studies showed the most variability with 12 different methods reported and a range from $<6$ to $\geq 12$ valid hours. About $8 \%$ of child studies used a different definition for weekdays and weekends, and using ratios or counts criteria was more common in child studies (about $6 \%$ each) than in other age groups. Eight and 10 valid hours were the most common ( $10.6 \%$ and $21.3 \%$ respectively). Adolescent studies showed the least variability with 5 definitions. The range of valid hours was 8 to $\geq 12$, with about $6 \%$ using a ratio or counts criteria. The most commonly used were 8 and 10 valid hours ( $13.2 \%$ and $44.1 \%$ respectively). About $24 \%$ of preschool and child studies, and $27 \%$ of adolescent studies, did not report a 'valid day' definition.

## Minimum number of wear days

Eight thresholds were used to define the 'minimum number of wear days' for inclusion in analyses. Three and 4 days were the most common in all age groups, used in $56 \%$ preschool studies, $68 \%$ child studies, and $70 \%$ adolescent studies. Preschool studies used 6 thresholds, child studies used all 8 thresholds, and adolescent studies used 5 thresholds. The minimum number of wearing days was not reported in $23.8 \%$ of preschool, $17.0 \%$ of children, and $17.6 \%$ of adolescent studies. As with other methods, child studies showed the most variability with at least one study using every definition between 1 and 10 or more days.

Weekends: The majority of studies in all age groups did not require a weekend day for inclusion in analyses ( $61.9 \%$ preschool, $51.1 \%$ child, and $66.2 \%$ of adolescent studies), but $30.9 \%$ of child studies required one weekend day compared to about $14 \%$ of preschool and adolescent studies. Very few studies ( $<3 \%$ ) required 2 weekend days.

## Cut points

Moderate-to-Vigorous Physical Activity (MVPA): The MVPA cut point showed the most variability, with 12 sets of cut points producing 14 values that ranged from 400 to 3600 cpm (lower threshold for moderate-intensity) across all age groups. In preschoolers, 5 cut points were used that ranged from 614-3200 cpm. The Sirard age-specific cut points (2460$3564 \mathrm{cpm} ; 38.1 \%$ of studies) ${ }^{39}$ were the most common, followed by Pate ( $1680 \mathrm{cpm} ; 19 \%$ ), ${ }^{46}$ and Puyau ( $3200 \mathrm{cpm} ; 19 \%$ )..$^{42}$ These 3 most commonly used cut points accounted for $76.1 \%$ of preschool studies. Child studies showed the most variability with 11 cut points that ranged from 400 to 3600 cpm . The 4 most common cut points that accounted for a majority of studies were Freedson youth (614-3500 cpm -- all MET definitions combined; 32.6\% of studies), ${ }^{25,36}$ Puyau ( $3200 \mathrm{cpm} ; 13 \%$ ), EYHS ( $2000 \mathrm{cpm} ; 10.9 \%$ ) ${ }^{44-45}$ and Treuth ( 1160 \& 3000 cpm -- all MET definitions combined; $9.8 \%) .{ }^{38}$ Nine percent of child studies did not use cut points but used 'counts' instead, and $8 \%$ either reported results based on more than one cut point or made up their own. In adolescent studies, 8 cut points were used and, as with child studies, the Freedson youth cut points were most common (614-3500 cpm -- all MET definitions combined; $38.5 \%$ of studies), followed by Puyau ( 3200 cpm ) and EYHS ( 2000 cpm ) at $10.8 \%$ each, and Treuth ( 1160 and $3000 \mathrm{cpm}-$ - all MET definitions combined; $9.2 \%$ ). MVPA cut points were not reported in $3.3 \%$ of children and $6.2 \%$ of adolescent studies. All preschool studies reported the MVPA cut point.

Sedentary behavior: Sedentary behavior was measured in $95 \%$ of preschool, $40.4 \%$ of child, and $47.1 \%$ of adolescent studies included in this review. Across all age groups, 11 sedentary cut points were reported ranging from 9 to 1259 cpm (upper limits). In preschoolers, 4 sedentary cut points were used with the most common being Sirard (1204$1259 \mathrm{cpm} ; 35 \%$ of studies), ${ }^{39}$ Reilly ( $1099 \mathrm{cpm} ; 30 \%$ ), ${ }^{47}$ and Pate ( $151 \mathrm{cpm} ; 15 \%$ ). ${ }^{46}$ Child studies used 9 sedentary cut points with the most common being Treuth/Evenson ( 100 cpm ; $26.3 \%$ of studies), ${ }^{38,41}$ and Puyau ( 799 cpm$)^{42}$ and EYHS ( 499 cpm$)^{44-45}$ at $21.1 \%$ each. Five sedentary cut points were used in adolescent studies with the most common being Treuth/Evenson (100 cpm; 46.9\% of studies), Puyau (799 cpm; 25\%) and EYHS (499 cpm; $12.5 \%$ ). Similar to other methods, there was more variability in child studies than in preschool or adolescent studies. Sedentary cut points were the least likely not to be reported (5\% of preschool, $2.6 \%$ of child, and $3.1 \%$ of adolescent studies).

## Trends from 2005-2010

MVPA cut points: MVPA cut points were tracked by year to identify any trends. The graphed results for children and adolescents are shown in Figures 2 and 3, respectively. The trends in preschool cut points were not graphed because there have been no changes since 2008 when the Sirard ${ }^{39}$ and Pate ${ }^{46}$ values replaced the Freedson youth, ${ }^{25,36}$ Freedson adult, 48 and Puyau ${ }^{42}$ values as the only preschool cut points in use.

In child studies, there has been an increase in the number of cut points used, from 5 in 20052006, to 11 in 2009-2010. With the introduction of new cut points, the percent of studies using the Freedson youth, ${ }^{25,36}$ Freedson adult, ${ }^{48}$ and Puyau ${ }^{42}$ cut points decreased, while the percent using Treuth, ${ }^{38}$ EYHS, ${ }^{44-45}$ and Mattocks ${ }^{37}$ increased. However, in 2009-2010, the Freedson youth cut points still were the most commonly used ( $28.9 \%$ of studies), followed by the 'other' category ( $17.8 \%$ ), and the EYHS cut points (15.6\%).

In adolescent studies, there has not been a clear increase in the number of cut points used since 2005, but the distributions changed as new cut points were introduced and others became less common. The percent of studies using the Freedson adult ${ }^{48}$ and Puyau ${ }^{42}$ decreased while the percent using Treuth ${ }^{38}$ and Freedson youth ${ }^{25,36}$ increased. The Freedson youth cut points were the most commonly used in 2009-2010 (41.4\% of studies), followed by Treuth ( $20.7 \%$ ), and the EYHS cut points ( $17.2 \%$ ).

Methods Reporting: Figure 4 displays the percent of papers that did NOT report each key variable (i.e., 'missing' information). Four variables (accelerometer model, non-wear definition, valid hours, and cut points) showed improvements in reporting, identified by a decreasing percent of non-reporting, while epoch length showed an increase in non-reporting and 'valid days' stayed about the same. The non-wear definition (i.e., minutes of consecutive zero counts) remained the most likely variable not to be reported, but it showed the sharpest decline in non-reporting from $65.6 \%$ in 2005-2006 to $30.6 \%$ in 2009-2010. Non-reporting of cut points declined from $10.9 \%$ to $4.6 \%$ making cut points the least likely to be missing in 2009-2010. There was an increase in studies not reporting on epoch length, making epoch length among the most common variables not to be reported in recent years along with valid hours and minimum number of days (about $13 \%$ each).

Figure 5 displays the percent of articles with a 'complete reporting' score, defined as reporting on $100 \%$ of relevant methods, and the percent of articles with a 'poor reporting' score, defined as reporting on $50 \%$ or fewer methods. In 2005-2006, $21.9 \%$ of papers reported on all methods, which more than doubled to $53.7 \%$ in 2009-2010. 'Poor reporting' declined from $18.8 \%$ in 2005-2006 to $11.1 \%$ in 2009-2010. The mean "percent of key methods reported" scores increased from $74.6 \%$ to $85.3 \%$ between 2005-2006 and 20092010, respectively.

## DISCUSSION

Objectively measured physical activity using accelerometers provides many advantages over self-reports, particularly among youth, ${ }^{2}$ but there are numerous challenges in applying the technology. As accelerometers are used more in research and in national prevalence studies that provide a basis for public health planning, ${ }^{7}$ it becomes more important to derive results that justify high confidence. The results of the present review of 183 studies indicated a continuing lack of consensus among researchers on the methods used to collect, process, and score accelerometer data from children and adolescents.

In 2005, investigators convened by the National Cancer Institute recommended the development of more standardized methods for accelerometer studies and consistent
reporting of "decision rules". ${ }^{8}$ Although there has been a large increase in the number of studies using accelerometers with children and adolescents from 2005 to 2010, methods have become more diverse, so results are less comparable. The variability in methods was greater for children than for preschoolers or adolescents. Though reporting of decision rules has improved, in 2009-2010 slightly more than half of published studies reported all major methodological decision rules.

The present review was limited to ActiGraph accelerometers, which are used most commonly. Two models of ActiGraphs were used, and though there is growing evidence among adults of differences in sensitivity, ${ }^{13-14}$ it is unclear how model differences affect interpretation of data from children. Many studies did not report the model, and it is not clear how data from the two models should be interpreted differently.

Technological advances in accelerometry have allowed researchers to collect even richer data and address previous device limitations, such as limited memory capacity, but these advances may introduce additional challenges. New models of ActiGraphs allow for the collection of data of multiple axes and store raw data with the epoch being defined post-data collection. These new capabilities create more powerful tools, but they produce more complex data for which methodological guidelines are lacking. Thus, advancing technology creates more opportunities for methodological discrepancies and difficulties interpreting results.

The length of epochs at which accelerometer data are summarized is particularly important for children, whose activity levels change frequently. Estimated time in vigorous physical activity is inversely related to epoch length, resulting in an underestimation when longer epochs are used. ${ }^{53}$ Unfortunately, epoch length was one of the most common not-reported decision rules, and non-reporting increased over time. As the technology has allowed, there was a strong trend toward using epochs shorter than 60s, increasing from $0 \%$ of studies in 2005 to $45 \%$ in 2010 . However, it has been suggested that physical activity outcomes using shorter ( 5,15 , and 30 seconds) vs longer ( 60 second) epochs are not comparable in some age groups. ${ }^{54}$

Different decision rules for defining non-wearing time further reduce comparability across studies, affecting number of valid days, sample sizes, and particularly, estimates of sedentary time. ${ }^{55}$ Colley et al. ${ }^{21}$ found the percentage of their sample having at least 4 valid days of data ranged from $38 \%$ to $84 \%$ when comparing non-wear definitions of 10 minutes of consecutive zero counts to 60 minutes. In this review, criteria ranged from 10 to 180 minutes and the majority of studies used 10 or 20 minutes. Esliger ${ }^{56}$ reported that 20 minutes of zeroes was most appropriate for youth and though it would seem unlikely for a child to be absolutely still (no movement recorded) for more than 10 or 20 consecutive minutes, there are few data to inform a criterion for non-wearing time for children. Non-wear times were the least reported decision rules in studies, though there was substantial improvement in reporting over time.

Criterion for defining a valid day of accelerometry ranged from 6 to 12 hours of wear time. A minimal daily wearing time of 10 hours, which was seen in $28 \%$ of studies, has been
recommended for children and adolescents. ${ }^{57-58}$ Some researchers are developing their own definitions as the number in use increased from 6 in 2005 to 12 in 2010; thus, results are becoming less comparable. One quarter of studies did not report on this decision rule. A best practice recommendation is to define valid hours before data collection and screen data immediately for compliance so there is the possibility to ask the participant to re-wear if needed.

Criteria used for defining number of sufficient days of wearing time directly affect sample size and reliability of estimates of habitual physical activity. ${ }^{3}$ Criteria ranged from 1 to 10 or more days with a fair number ( $18 \%$ ) of studies not reporting this decision rule and no improvements seen over time. There appears to be a rough consensus for a 7-day monitoring protocol to achieve a minimum of 4 valid days of monitoring including one weekend day. ${ }^{3,8-9}$ However, many researchers have not adopted this guideline. Some researchers use imputational or probability methods to deal with missing data, ${ }^{7,19}$ and others focus on boosting compliance via phone/texting, incentives, visual reminders (e.g., stickers), wear time logs, and asking participants to re-wear the accelerometer to meet the criterion. ${ }^{9,59-60}$

The diversity of cut points used to define MVPA may have the most severe consequences for clear interpretation of findings and ability to compare across studies. The number of cut points used has increased since 2005. Trost refers to the plethora of choices as "the cut point conundrum". ${ }^{61}$ Wide variation in calibration study methods has led to cut points that range from 9 to 1259 cpm (as the upper threshold) for sedentary behavior and 400 to 3600 cpm (as the lower threshold) for moderate intensity activity. To highlight the potential for confusion, the most commonly used set of cut points has a lower MVPA value ( 705 cpm for 7 year olds) ${ }^{25,36}$ than one of the most commonly used sedentary cut point in children's studies (799 cpm). ${ }^{42}$ The choice of cut points can drastically affect the results, ${ }^{5,28-29,31-34}$ with physical activity prevalence rates ranging from $100 \%$ to $8.7 \%$ in one study depending on whether Freedson youth or Puyau cut points were used. ${ }^{30}$

One of the drivers of the wide range of cut points used is the lack of consensus as to what MET value defines MVPA in youth. The US physical activity guidelines define the lower limit of moderate physical activity as 3 METs for all ages, ${ }^{62}$ but an influential calibration study conducted for the TAAG study identified 4.6 METs as the limit, ${ }^{38}$ and NHANES adopted 4.0 METs for national prevalence estimates. ${ }^{7}$ In analyses of TAAG data, the prevalence of meeting guidelines was $88 \%$ using 3 METs for adolescents, compared to only $<1 \%$ using 4.6 METs. ${ }^{33}$ The lack of consensus in methods is preventing acceptable interpretation of accelerometer results and undermining the value of using objective measures.

## A Methodological Research Agenda

The good news of increasing use of accelerometers for objectively measuring physical activity in youth is counterbalanced by the bad news of the chaos in methodology that is getting worse over time. Though nurturing creativity among investigators searching for effective methods is important, we propose that it is now time to develop a consensus on protocols for collecting, processing, scoring, and reporting accelerometer data for children and adolescents. The current situation is producing data that can neither be interpreted
confidently nor compared across studies, and this is unacceptable given the public health importance of youth physical activity. The recent introduction of a new generation of accelerometers providing raw data makes the need for consensus protocols even more urgent. Current data are not a sufficient basis for selecting the most promising protocols, because few studies have compared multiple approaches to the key decision rules. Thus, a research agenda devoted to developing an evidence base on accelerometer methodology decision rules is needed. There are some recent examples of studies working toward this goal.

Trost and colleagues ${ }^{63}$ conducted a validation study in 206 5-15 year olds comparing 5 common cut points using $\mathrm{VO}_{2}$ as the criterion measure during 12 activities. They found that cut point values $\geq 3000 \mathrm{cpm}^{37-38}$ defining MVPA $\geq 4$ METs were not supported. Using receiver operator characteristic (ROC) curve analysis, the Evenson cut points ${ }^{41}$ showed the best classification at all intensities (e.g., 2296 cpm for moderate physical activity), followed by Freedson 4 METs. ${ }^{25,36}$ Similar to what Treuth ${ }^{38}$ and Evenson ${ }^{41}$ found, the 100 cpm sedentary cut point showed excellent classification accuracy. In contrast, the Puyau ${ }^{42}$ cut point for sedentary time ( $<800 \mathrm{cpm}$ ) showed fair classification accuracy. The Trost et al. ${ }^{63}$ study seems to be a strong basis for selecting cut points, but it was not designed to resolve controversies regarding MET values and other decision rules.

We propose a research agenda and process to establish at least an interim consensus on accelerometer methodology and reporting standards for studies of youth. This process should be led by the National Institutes of Health or Institute of Medicine, with guidance from a panel of measurement experts. These are the critical features of a research agenda and consensus process.

- The most critical need is to reach consensus on MET values for MVPA, so that definitive youth physical activity prevalence rates can be established. Relating physical activity levels, based on various MET values, to disease risk biomarkers is one evidence-based approach to selecting MET definitions for MVPA.
- Since the trend is toward using shorter epoch lengths, studies should be conducted to determine MET-based cut points using very short epoch lengths (e.g., 1 sec ) that provide data that are comparable to longer epoch lengths.
- To identify the best approach to selecting accelerometer cut points, an expert panel should review methods used to establish existing cut points, then design a definitive study on which to base final recommendations. A definitive calibration study should include youth from a wide age range to determine whether agespecific cut points are needed. This is an active controversy in the field. ${ }^{5,63}$ Calibration studies should be conducted using various epoch lengths
- A similar process should be used to design definitive studies to inform decision rules on epoch length, non-wear definition, definition of a valid day, and number of valid days.
- NIH or another funding body should hold a competition to conduct studies based on the expert panel's recommendations. Once the results are ready, the expert
panel and study investigators should jointly make recommendations about methodologic decision rules for youth accelerometer studies.
- The consensus decision rules should be made generally available and communicated directly to relevant journal editors. They could be recommended like CONSORT and STROBE reporting standards. An important goal is to increase comparability in describing MVPA, sedentary behavior, and prevalence rates. One approach would be to require authors to use the consensus protocol and reporting standards as the default, then investigators could use and report additional methods or decision rules for specific purposes.
- Ideally the studies would be designed to create decision rules that would apply to the ActiGraph models used in the 183 studies summarized in the present paper as well as the GT3X+ model that provides raw data. It is essential that investigators know how to score raw data so they are comparable to results obtained from earlier models.
- Studies should concurrently examine other commonly used accelerometers and develop methods for creating comparable physical activity and sedentary behavior estimates across multiple brands of accelerometers.
- Recommendations should be formally reviewed every 5 years.


## Supplementary Material

Refer to Web version on PubMed Central for supplementary material.

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Articles retrieved for more detailed evaluation: $\quad n=573$

| Studies excluded: | $n=300$ |
| :--- | :--- |
| No children, or no methods reported |  |
| for children: | $\mathrm{n}=56$ |
| Not ActiGraph accelerometer: | $\mathrm{n}=131$ |
| Studies not measuring ambulatory movement: <br> Studies with <1 complete wearing days (e.g., | $\mathrm{n}=19$ |
| recess studies, reviews, methods papers): | $\mathrm{n}=94$ |

No children, or no methods reported
for children:
$\mathrm{n}=56$
Not ActiGraph accelerometer:
$\mathrm{n}=94$

| Relevant articles for inclusion: | $\boldsymbol{n}=\mathbf{2 7 3}$ |
| :--- | :---: |
| Preschool (ages 2-5 years): | $\mathrm{n}=25$ |
| Children (ages 6-11 years): | $\mathrm{n}=140$ |
| Adolescents (ages 12-18 years): | $\mathrm{n}=108$ |

FIGURE 1.
Results of the literature search


* includes allMET values associated with cut point
** includes Welk 2005, Trost 1998, Metcalf 2002, Krishnaveni2009, used more than 1, and used own cut point
FIGURE 2.
Trends in accelerometer cut points (MVPA) reported in children's studies from 2005-2010


[^1]FIGURE 3.
Trends in accelerometer cut points (MVPA) reported in adolescent studies from 2005-2010


FIGURE 4.
Methods not reported in papers from 2005-2010 (\% of papers not reporting)

${ }^{\text {a }}$ calculated as \# of key methods reported/\#total relevant methods
${ }^{\mathrm{b}}$ article reported on all (100\%) of key methods
${ }^{\text {c }}$ article reported on $50 \%$ or less key methods
FIGURE 5.
Trends in percent of youth accelerometer papers with "complete" versus "poor" reporting scores ${ }^{\text {a from 2005-2010 }}$
Summary of key methodological issues from a review of 183 youth accelerometer studies from 2005-2010.

|  | All youth studies ( $\mathrm{n}=183$ ) \% (n) | Preschool studies ( $\mathrm{n}=21$ ) \% (n) | Children studies ( $\mathrm{n}=94$ ) \% (n) | Adolescent studies ( $\mathrm{n}=68$ ) \% (n) |
| :---: | :---: | :---: | :---: | :---: |
| Year of publication |  |  |  |  |
| 2005-2006 | 20.8 (38) | 30.0 (6) | 14.9 (14) | 26.5 (18) |
| 2007-2008 | 32.8 (60) | 30.0 (6) | 35.1 (33) | 30.9 (21) |
| 2009-2010 | 46.4 (85) | 40.0 (9) | 50.0 (47) | 42.6 (29) |
| Actigraph model |  |  |  |  |
| 7164 | 67.8 (124) | 71.4 (15) | 66.0 (62) | 69.1 (47) |
| GT1M | 17.5 (32) | 9.5 (2) | 23.4 (22) | 11.8 (8) |
| Model not specified (e.g., 'Actigraph') | 14.8 (27) | 19.0 (4) | 10.6 (10) | 19.1 (13) |
| Epoch (seconds) |  |  |  |  |
| 2 | 2.2 (4) | 0.0 (0) | 4.3 (4) | 0.0 (0) |
| 5 | 4.9 (9) | 9.5 (2) | 6.4 (6) | 1.5 (1) |
| 10 | 5.5 (10) | 0.0 (0) | 9.6 (9) | 1.5 (1) |
| 15 | 7.7 (14) | 42.9 (9) | 2.1 (2) | 4.4 (3) |
| 30 | 7.7 (14) | 4.8 (1) | 4.3 (4) | 13.2 (9) |
| 60 | 62.3 (114) | 42.9 (9) | 66.0 (62) | 63.2 (43) |
| Missing | 9.8 (18) | 0.0 (0) | 7.4 (7) | 16.2 (11) |
| Non-wear time within a day (consecutive minutes of ' 0 ' counts) ${ }^{a}$ | ( $n=181$ ) |  | $(n=92)$ |  |
| 10 | 17.1 (31) | 9.5 (2) | 17.4 (16) | 19.1 (13) |
| 15 | 1.7 (3) | 0.0 (0) | 3.3 (3) | 0.0 (0) |
| 20 | 22.1 (40) | 9.5 (2) | 20.7 (19) | 27.9 (19) |
| 30 | 5.0 (9) | 0.0 (0) | 3.3 (3) | 8.8 (6) |
| 60 | 5.0 (9) | 14.3 (3) | 6.5 (6) | 0.0 (0) |
| 180 | 0.6 (1) | 0.0 (0) | 0.0 (0) | 1.5 (1) |
| Missing | 48.6 (88) | 66.7 (14) | 48.9 (45) | 42.6 (29) |
| Definition of a valid day (number of valid wear hours) |  |  |  |  |
| $<6$ | 2.7 (5) | 9.5 (2) | 3.2 (3) | 0.0 (0) |


|  | All youth studies ( $\mathrm{n}=183$ ) \% (n) | Preschool studies ( $\mathrm{n}=21$ ) \% (n) | Children studies ( $\mathrm{n}=94$ ) \% (n) | Adolescent studies ( $\mathrm{n}=68$ ) \% <br> (n) |
| :---: | :---: | :---: | :---: | :---: |
| 6 | 3.8 (7) | 14.3 (3) | 4.3 (4) | 0.0 (0) |
| 6.7 | 0.5 (1) | 4.8 (1) | 0.0 (0) | 0.0 (0) |
| 8 | 11.5 (21) | 9.5 (2) | 10.6 (10) | 13.2 (9) |
| 8.1-9.9 | 4.9 (9) | 4.8 (1) | 8.5 (8) | 0.0 (0) |
| 10 | 29.0 (53) | 14.3 (3) | 21.3 (20) | 44.1 (30) |
| 10.1-11.9 | 0.5 (1) | 0.0 (0) | 1.1 (1) | 0.0 (0) |
| 212 | 3.3 (6) | 0.0 (0) | (2) | 5.9 (4) |
| 10 on weekdays, 8 on weekend days | 2.2 (4) | 0.0 (0) | 4.3 (4) | 0.0 (0) |
| 12 on weekdays, 10 on weekend days | 1.1 (2) | 0.0 (0) | 2.1 (2) | 0.0 (0) |
| 10 on weekdays, $60 \%$ mean weekend WT | 0.5 (1) | 0.0 (0) | 1.1 (1) | 0.00 ) |
| Ratio or \% (e.g., $80 \%$ of average WT, $70 / 80$ rule ${ }^{b}$ ) | 5.5 (10) | 4.8 (1) | 6.4 (6) | 4.4 (3) |
| Counts criteria (e.g., $\langle 10,000$ and $>20,000,000=$ invalid day) | 3.3 (6) | 0.0 (0) | 5.3 (5) | 1.5 (1) |
| Accelerometer worn during predefined moments and valid hours | 2.7 (5) | 9.5 (2) | 3.2 (3) | 0.0(0) |
| not used (e.g., school hours only) |  |  |  |  |
| Unclear or other | 2.7 (5) | 0.0 (0) | 3.2 (3) | 2.9 (2) |
| Varied by purpose of analyses ${ }^{c}$ | 1.1 (2) | 4.8 (1) | 0.0 (0) | 1.5 (1) |
| Missing | 24.6 (45) | 23.8 (5) | 23.4 (22) | 26.5 (18) |
| Minimum number of wear days to be included in analyses |  |  |  |  |
| 1 | 1.1 (2) | 0.0 (0) | 2.1 (2) | 0.0 (0) |
| 2 | 6.6 (12) | 4.8 (1) | 9.6 (9) | 2.9 (2) |
| 3 | 28.4 (52) | 19.0 (4) | 29.8 (28) | 29.4 (20) |
| 4 | 26.8 (49) | 23.8 (5) | 26.6 (25) | 27.9 (19) |
| 5 | 7.1 (13) | 0.0 (0) | 5.3 (5) | 11.8 (8) |
| 6 | 1.1 (2) | 4.8 (1) | 1.1 (1) | 0.0 (0) |
| 7 | 4.4 (8) | 9.5 (2) | 4.3 (4) | 2.9 (2) |
| 10 or more | 1.1 (2) | 4.8 (1) | 1.1 (1) | 0.0 (0) |
| Varied by purpose of analyses ${ }^{c}$ | 5.5 (10) | 9.5 (2) | 3.2 (3) | 7.4 (5) |
| Missing | 18.0 (33) | 23.8 (5) | 17.0 (16) | 17.6 (12) |


|  | All youth studies ( $\mathrm{n}=183$ ) \% (n) | Preschool studies ( $\mathrm{n}=21$ ) \% (n) | Children studies ( $\mathbf{n}=\mathbf{9 4}$ ) \% (n) | Adolescent studies ( $\mathrm{n}=68$ ) \% (n) |
| :---: | :---: | :---: | :---: | :---: |
| 0 | 57.9 (106) | 61.9 (13) | 51.1 (48) | 66.2 (45) |
| 1 | 23.0 (42) | 14.3 (3) | 30.9 (29) | 14.7 (10) |
| 2 | 2.7 (5) | 4.8 (1) | 2.1 (2) | 2.9 (2) |
| Varied by purpose of analyses ${ }^{c}$ | 0.5 (1) | 0.0 (0) | 1.1 (1) | 0.0 (0) |
| Missing | 15.8 (29) | 19.0 (4) | 14.9 (14) | 16.2 (11) |
| Cut point for MVPA (counts/min) ${ }^{\text {d }}$ | ( $n=178$ ) | ( $n=21$ ) | ( $n=92$ ) | ( $n=65$ ) |
| 400 (Krishnaveni) ${ }^{49}$ | 0.6 (1) | 0.0 (0) | 1.1 (1) | 0.0 (0) |
| 614-2274 (Freedson youth 3METs, 6-18 years $\left.{ }^{e}\right)^{36}$ | 29.2 (52) | 9.5(2) | 29.3 (27) | 35.4 (23) |
| 1160 (Treuth, 3METs) ${ }^{33}$ | 1.7 (3) | 0.0(0) | 2.2 (2) | 1.5 (1) |
| 1400-3500 (Freedson youth, 4METs, 6-18 years ${ }^{\text {e }}$ ) ${ }^{36}$ | 2.8 (5) | 0.0 (0) | 3.3 (3) | 3.1 (2) |
| 1680 (Pate) ${ }^{46}$ | 2.2 (4) | 19.0(4) | 0.0 (0) | 0.0 (0) |
| 1952 (Freedson adult, 3 METs) ${ }^{48}$ | 5.6 (10) | 4.8 (1) | 4.3 (4) | 7.7 (5) |
| 2000 (European Youth Heart Study) ${ }^{44-45}$ | 9.6 (17) | 0.0 (0) | 10.9 (10) | 10.8 (7) |
| 2172 (Welk) ${ }^{35}$ | 1.1 (2) | 0.0 (0) | 2.2 (2) | 0.0 (0) |
| 2460-3564 (Sirard, 3-5 years) ${ }^{39}$ | 4.5 (8) | 38.1 (8) | 0.0 (0) | 0.0 (0) |
| 2500 (Metcalf) ${ }^{50}$ | 1.1 (2) | 0.0 (0) | 2.2 (2) | 0.0 (0) |
| 3000 (Treuth, 4.6METs) ${ }^{38}$ | 6.7 (12) | 0.0 (0) | 7.6 (7) | 7.7 (5) |
| 3200 (Puyau) ${ }^{42}$ | 12.9 (23) | 19.0(4) | 13.0 (12) | 10.8 (7) |
| 3581/3600 (Mattocks, 4METs) ${ }^{37}$ | 1.7 (3) | 0.0 (0) | 2.2 (2) | 1.5 (1) |
| Energy expenditure equation (Trost) ${ }^{40}$ | 2.8 (5) | 0.0 (0) | 2.2 (2) | 4.6 (3) |
| More than 1, used own cut point | 7.3 (13) | 4.8 (1) | 7.6 (7) | 7.7 (5) |
| Used counts only (no cut points) | 6.2 (11) | 4.8 (1) | 8.7 (8) | 3.1 (2) |
| Missing | 3.9 (7) | 0.0 (0) | 3.3 (3) | 6.2 (4) |
| Cut point for sedentary time (counts/min) ${ }^{f}$ | ( $n=90$ ) | ( $n=20$ ) | $(n=38)$ | ( $n=32$ ) |
| 9 (Krishnaveni) ${ }^{49}$ | 1.1 (1) | 0.0 (0) | 2.6 (1) | 0.0 (0) |
| 100 (Treuth, Evenson) 38,41 | 28.9 (26) | 5.0 (1) | 26.3 (10) | 46.9 (15) |
| 151 (Pate) ${ }^{46}$ | 3.3 (3) | 15.0 (3) | 0.0 (0) | 0.0 (0) |

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## $\mathrm{WT}=$ wearing time

MET $=$ Metabolic Equivalent Task
${ }^{a}$ Only studies where accelerometer was worn for a whole day were included.
 for inclusion in data analysis.
${ }^{c}$ In instances where the cohort and stage of study were the same but methods varied, these were noted as 'method varying by analysis or purpose'

$e_{\text {Includes Dowda, }}{ }^{52}$ Trost, ${ }^{25}$ and Freedson 36 references, and reference without the MET value specifically stated.



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[^1]:    * includes all MET values as sociated with cut point
    ** includes Trost 1998, used more than 1 cut point, and used own cut point

