

Accuracy of Accelerometers for Measuring Physical Activity and Levels of Sedentary Behavior in Children: A Systematic Review

Journal of Primary Care & Community Health
Volume 10: 1–8
© The Author(s) 2019
Article reuse guidelines:
sagepub.com/journals-permissions
DOI: 10.1177/2150132719874252
journals.sagepub.com/home/jpc



Brian A. Lynch¹ , Tara K. Kaufman¹, Tamim I. Rajjo¹, K. Mohammed², Seema Kumar¹, M. Hassan Murad¹, Natalie E. Gentile¹, Gabriel A. Koepp³, Shelly K. McCrady-Spitzer¹, and James A. Levine⁴

Abstract

Objectives: This systematic review evaluated the accuracy of triaxial and omnidirectional accelerometers for measuring physical activity and sedentary behavior in children. **Design:** Systematic review of the literature. **Methods:** We comprehensively searched several databases for studies published from January 1996 through June 2018 that reported diagnostic accuracy measures in children and adolescents (age 3-18 years) and compared accelerometers with energy expenditure using indirect calorimetry. **Results:** We included 11 studies that enrolled 570 participants. All studies used indirect calorimetry as the reference standard. Across the studies, median sensitivity ranged from 46% to 96% and median specificity ranged from 71% to 96%. Median area under the curve ranged from 69% to 98%. **Conclusions:** Accuracy measures were greatest when detecting sedentary behavior and lowest when detecting light physical activity. Accuracy was higher when the accelerometer was placed on the hip compared with the wrist. The current evidence suggests that triaxial and omnidirectional accelerometers are accurate in measuring sedentary behavior and physical activity levels in children.

Keywords

adolescents, energy expenditure, exercise, pediatrics, sensitivity, specificity

Introduction

Physical activity is necessary to promote optimal physical and emotional health in children. The Centers for Disease Control and Prevention recommend policies and social-physical environments that promote lifelong physical activity.¹ The National Association for Sport and Physical Education recommends at least 60 minutes of daily moderate to vigorous physical activity.² Sedentary behavior, defined by postural position (lying, reclining, or sitting down) and energy expenditure ≤ 1.5 metabolic equivalents (METs), is a unique behavior construct that can affect health outcomes.³⁻⁵ Thus, it is important to have consistent, reliable, and cost-effective methods of measuring sedentary behavior and physical activity levels in observational and experimental studies.

In the past 20 years, the ability to quantify activity levels has markedly improved by using accelerometers. Historically, physical activity was measured by questionnaires or interviews that were prone to recall bias.^{6,7} Indirect calorimetry is a criterion standard method of measuring

energy expenditure.^{6,8} Energy expenditure can be expressed as oxygen consumption, carbon dioxide production, or METs. A MET is defined as the amount of oxygen consumed while at rest and is equal to 3.5 mL O₂ per kg body weight \times minutes.⁹ MET value cutoffs are different in children as compared to adults because of known physiologic/developmental differences.¹⁰ The cutoff levels for sedentary (< 1.5 METs), light (1.5-3 METs), moderate (3-6 METs), and vigorous (> 6 METs) physical activity is one approach

¹Mayo Clinic, Rochester, MN, USA

²Department of Pediatrics, University of Minnesota, Minneapolis, MN, USA

³Division of Research Administrative Services, Mayo Clinic, Scottsdale, AZ, USA

⁴Fondation Ipsen, Paris, France

Corresponding Author:

Brian A. Lynch, Department of Pediatric and Adolescent Medicine, Mayo Clinic, 200 First Street SW, Rochester, MN 55905, USA.

Email: lynch.brian@mayo.edu



Creative Commons Non Commercial CC BY-NC: This article is distributed under the terms of the Creative Commons Attribution-NonCommercial 4.0 License (<http://www.creativecommons.org/licenses/by-nc/4.0/>) which permits non-commercial use,

reproduction and distribution of the work without further permission provided the original work is attributed as specified on the SAGE and Open Access pages (<https://us.sagepub.com/en-us/nam/open-access-at-sage>).

used to categorize activity levels in children, although MET thresholds are not consistently defined across studies.¹¹

Many wearable devices can be used to monitor physical activity and sedentariness.¹² Those containing triaxial accelerometers, such as GENEActive, Actigraph, and RT3, measure acceleration in 3 orthogonal axes whereas omnidirectional accelerometers such as MiniMitter and Actical assess acceleration in multiple directions but are most sensitive to movement in the vertical plane.¹³ Modern accelerometers generally incorporate microelectromechanical systems (MEMS) accelerometer chips. Although MEMS-based accelerometers are used in efficient and cost-effective wearable devices for measuring daily physical activity and sedentary behavior,¹⁴ there is substantial variability in how accelerometers are used, where they are positioned on the body, the type of accelerometer used, and the setting for use (eg, school vs sport).

The systematic reviews that initially demonstrated effectiveness were published before 2010 and studied uniaxial and biaxial accelerometers that are not used in contemporary studies. It is important to understand whether modern accelerometers accurately measure physical activity levels and sedentary behavior because a recent review showed that most of the daily physical activity of children is not captured accurately with accelerometers.¹⁵ The objective of this study was to summarize the available evidence in a systematic review to determine the accuracy of triaxial and omnidirectional accelerometers in measuring physical activity and sedentary behavior in children.

Methods

This systematic review was reported according to the Preferred Reporting Items for Systematic Reviews and Meta-Analyses (PRISMA) statement.¹⁶

We included studies that targeted children and adolescents (age ≤ 18 years) and compared triaxial and omnidirectional accelerometers with energy expenditure determined through indirect calorimetry and reported validity or accuracy measures with sensitivity and specificity. We excluded studies that used a correlation analysis because of variation in the techniques used and the inability to pool data results. We excluded studies of specific populations with limited physical activity (eg, children with asthma, motor disability, cerebral palsy). Studies enrolling overweight and obese children were eligible.

We conducted a comprehensive, English-language search of the following databases from January 1996 through June 2018: Medline In-Process and Other Non-Indexed Citations, MEDLINE, EMBASE, Cochrane Central Register of Controlled Trials, Cochrane Database of Systematic Reviews, and Scopus. The search strategy was designed and conducted by a medical reference librarian with input from the study authors. We used a controlled

vocabulary, supplemented with keywords, to search for the concepts of accelerometer usage and childhood obesity. Online Appendix A shows the full search strategy.

We used an online reference management system (DistillerSR; Evidence Partners, Inc) to conduct the review. Two authors (B.L., T.K., S.K., or N.G.) independently reviewed titles and abstracts for eligibility and further screened the full text of the included articles in duplicate. Disagreements were resolved by a third author (B.L. or J.L.).

We extracted the following variables from each study: primary author, year of publication, country of study, study design, baseline characteristics of the study population, location of the accelerometer on the body, comparison test, and outcomes reported.

To assess the risk of bias and applicability of diagnostic accuracy, we used the Quality Assessment of Diagnostic Accuracy Studies tool.¹⁷ We assessed the following domains: patient selection, index test, reference standard, and flow and timing. Each item was investigated via yes/no signaling questions. For example, in the assessment of patient selection (“Could the selection of patients have introduced bias?”) we answered the following questions: *Was a consecutive or random sample of patients enrolled? Was a case-control design avoided? Did the study avoid inappropriate exclusions? If the answers were “yes,” the item of patient selection was categorized as having low risk of bias. If any were answered “no,” the item was categorized as having high risk of bias.* The “unclear” category was used only when insufficient data were reported to permit a judgment.

We summarized sensitivity, specificity, and area under the curve (AUC) values across studies with the median and interquartile range of diagnostic accuracy measures. We were unable to conduct a meta-analysis with a bivariate model because the included studies did not report sufficient data for analysis (a 2×2 diagnostic table).

Results

We identified 921 studies through the database search and other resources. After screening titles and abstracts, 37 were deemed eligible for full-text retrieval. We excluded 26 studies (some for multiple reasons) that did not use triaxial or omnidirectional accelerometers ($n = 2$), did not compare findings with indirect calorimetry ($n = 10$), did not use defined activity level cutoffs ($n = 4$), or did not report the accuracy results with sensitivity or specificity ($n = 20$). Eleven studies were included in the final analysis (Figure 1), and the studies are summarized in Table 1.^{13,18-27}

All studies used indirect calorimetry as the reference standard, with intensity level cutoffs as follows: sedentary, <1.5 METs; light activity, 1.5 to 3.0 METs; moderate activity, 3.1 to 6.0 METs; and vigorous activity, >6.0 METs. Hager et al¹⁹ combined levels of moderate-vigorous at 6.1

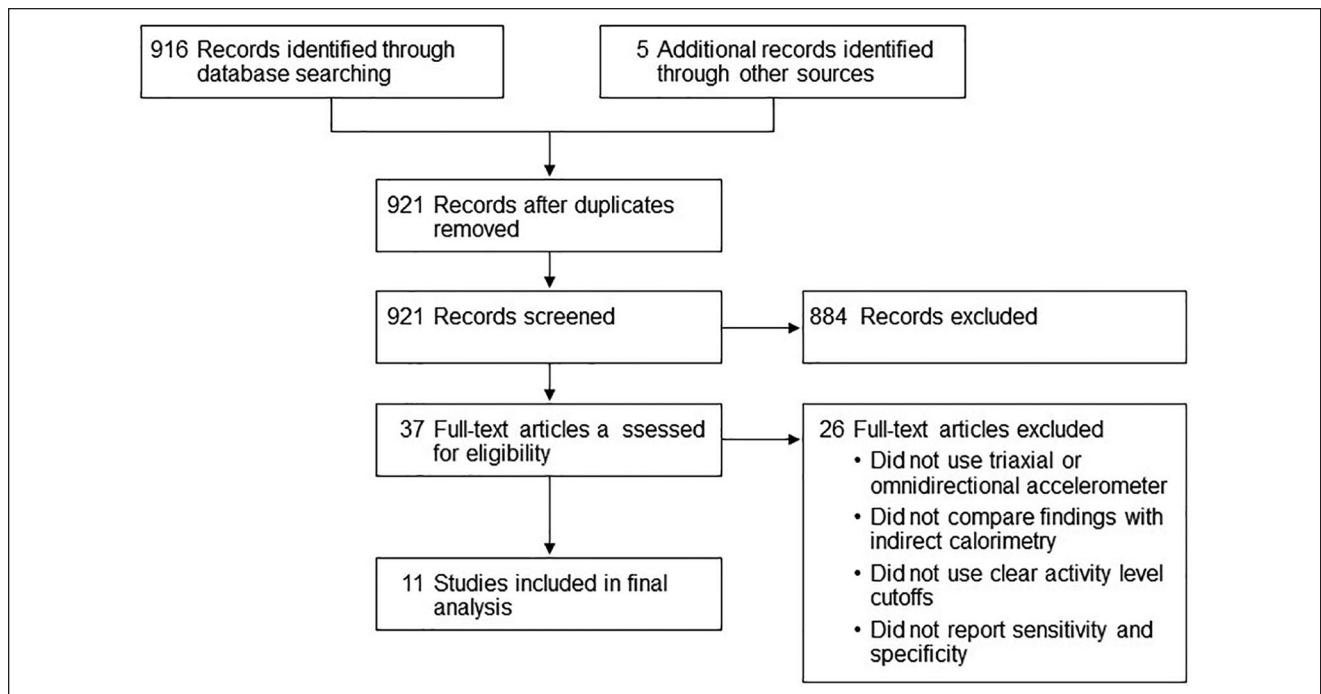


Figure 1. Study selection flow diagram.

METs. Chu et al²⁶ and Roscoe et al¹⁸ set sedentary and light activity levels at <2 METs and 2 to 3 METs, respectively).

The accelerometers' sensitivity, specificity, and AUC in detecting sedentary, light, moderate, and vigorous activity by attachment site are shown in Table 2. The AUC was reported in only 8 studies.^{18-23,25,27} Median sensitivity ranged from 46% to 98%, median specificity ranged from 71% to 96%, and median AUC ranged from 69% to 98%. Diagnostic accuracy measures were highest for sedentary and lowest for light activity.

Diagnostic accuracy measures were slightly lower with wrist placement and higher with hip placement. Limited data were available to perform subgroup analysis by participant age or accelerometer type.

The overall risk of bias of the 11 studies was high (online Appendix B). For applicability to clinical practice, most studies had a high risk of bias in terms of patient selection but were considered to have a low risk of bias in terms of the reference standard (criterion standard) and index test (here, the different levels of activity). For example, 5 studies did not describe their sampling process, which may introduce bias when interpreting the results of experiments.^{13,22,23,25,27}

Discussion

This systematic review shows that triaxial and omnidirectional accelerometers accurately categorize sedentary behavior and physical activity in children when using energy expenditure, as measured by indirect calorimetry, as

the reference standard. Our review was unique in that it focused on triaxial and omnidirectional accelerometers, used indirect calorimetry as the reference standard, and used outcomes that determined the sensitivity and specificity for predicting activity intensity levels. Accelerometers were most accurate when placed on the hip (compared with wrist placement), were most accurate for detecting sedentary behavior, and were least accurate for detecting light activity.

Multiple reviews published before 2010 concluded that accelerometer use was reasonably feasible, gave reproducible findings, and provided valid measures of physical activity levels in children, plus no brand of accelerometer was shown to be strongly superior to others.²⁸⁻³¹ A recent review evaluated the validity of accelerometers to estimate energy expenditure against doubly-labeled water and noted greater inter- and intradevice variability than we report¹⁵; in that review, the correlation coefficient (between the accelerometers and physical activity energy expenditure) ranged from 0.17 to 0.85 (median, 0.37) and the study included uniaxial and biaxial accelerometers.¹⁵ Their review implies that most daily physical activity of children is not captured by accelerometers. Our results differed in that we found that accelerometers were reasonably accurate in detecting physical activity-level categories.

The findings of this review were consistent with previous systematic reviews that showed that accelerometers can accurately detect sedentary behavior in children and adolescents.³² A review of 5 studies reported that when

Table 1. Characteristics of Included Studies.

Age and Gender of Participants	Type of Accelerometer ^a	Study Description ^b	Comparison	Study (Country)
Wrist placement				
Age, 4-5 y 8 girls, 13 boys	GENEActive (dominant and nondominant wrist)	5 min lying supine, 5 min playing with Lego, 4 min at 2.5 km/h, 4 min at 3.4 km/h, 4 min at 4.3 km/h, 4 min at 5.4 km/h	Indirect calorimetry	Roscoe et al, 2017 ¹⁸ (United Kingdom)
Age, 5-8 y 6 girls, 9 boys	GENEActive (nondominant wrist)	5 min per activity: lying, sitting, playing with toys, slow walk, medium walk, fast walk, medium run	Gas calorimetry	Duncan et al, 2016 ²⁵ (United Kingdom)
Age, 6-11 y 13 girls, 11 boys	GENEActive (wrist)	6 min rest, coloring, playing with LEGOS, Nintendo Wii tennis, Nintendo Wii boxing, walking at 2 speeds, jogging, running	Indirect calorimetry	Schaefer et al, 2014 ²⁷ (United States)
Age, 8-15 y 84 girls, 97 boys	Actigraph GT3X or GT3X+ (dominant wrist)	2 days (minimum of 24 h and maximum of 2 wk between the 2 days) Day 1, determined resting metabolic rate; day 2, monitored 1 activity routine Activities (each lasted 8 min): Nintendo Wii, slow walking, sweeping, Dance Dance Revolution, television, self-paced running	Gas calorimetry ^c	Crouter et al, 2015 ²⁰ (United States)
Hip or waist placement				
Age, 10-15 y 39 girls, 40 boys	Actigraph GT3X, RT3, Actical (all waist)	20 minutes of rest, then 5 min of activity Activities: watching a video, writing, playing a videogame, standing, light walk, moderate walk, volleyball, running, soccer, basketball, jump rope	Gas calorimetry (portable metabolic system)	Romanzini et al, 2012 ²¹ (Brazil)
Age, 12-16 y 12 girls, 19 boys	Actigraph GT3X (right hip)	10 min per activity, interspersed with 5-min breaks: resting, treadmill walking or running at 3, 5, 7, and 9 km/h, repeated sit-stands (30/min)	Gas calorimetry ^d Vector magnitude activity counts	Santos-Lozano et al, 2013 ²² (Spain)
Age, 3-5 y 11 girls, 7 boys	MiniMitter Actical (right hip)	Watching a movie, walking at 3 speeds, 20 min of free play	Gas calorimetry ^c	Pfeiffer et al, 2006 ²⁴ (United States)
Age, 7-18 y 18 girls, 14 boys	MiniMitter Actiwatch (right hip), MiniMitter Actical (right hip)	Basal metabolic rate, 20 min playing Nintendo, 20 min using a computer, 10 min cleaning, 12 min aerobics, 10 min basketball, 7 min slow walk, 7 min fast walk, 7 min jog	Room respiration calorimetry	Puyau et al, 2004 ¹³ (United States)
Age, 8-12 y 17 girls, 18 boys	RT3 (right hip)	20 min rest, 10 min sit, 10 min stand, 1 min at 2 km/h, 1 min at 4 km/h, 1 min at 6 km/h, 1 min at 8 km/h, increase speed until exhaustion	Gas calorimetry ^e	Chu et al, 2007 ²⁶ (China)
Ankle placement				
Age, 10-14 y 24 girls	Actical (random ankle)	Energy expenditure measured in 10 prescribed activities	Gas calorimetry ^c	Hager et al, 2015 ¹⁹ (United States)
Multiple site placement				
Age, 8-14 y 26 girls, 18 boys	GENEA (3 units): 1 on each wrist and 1 on the right hip	10 min lying, then 3 min of each activity: sitting, active Nintendo Wii games, slow walk, brisk walk, slow run, medium run	Gas calorimetry	Phillips et al, 2013 ²³ (United States)

^aManufacturer information is as follows: Actical and Actiwatch, Philips Respironics; GENEA and GENEActive, Activinsights Ltd; GT3X, Actigraph; RT3, Stayhealthy Inc.

^bAll studies reported outcomes of energy expenditure, sensitivity, and specificity.

^cCosmed portable metabolic system.

^dOxycon Pro Metabolic cart.

^eOxycon Mobile.

Table 2. Diagnostic Accuracy Measures, Based on Activity Intensity and Accelerometer Site.

Validity Measure	Level of Activity	Accelerometer Site	Median	IQR ^a	
Sensitivity	Sedentary	Hip	0.98	0.96-0.98	
		Wrist	0.95	0.92-0.96	
	Light	Hip	0.83	0.80-0.86	
		Wrist	0.46	0.28-0.63	
	Moderate	Hip	0.92	0.89-0.97	
		Wrist	0.88	0.84-0.90	
		Ankle	0.91	—	
	Vigorous	Hip	0.93	0.97-0.98	
		Wrist	0.91	0.83-0.96	
Ankle		0.91	—		
Specificity	Sedentary	Hip	0.96	0.94-0.98	
		Wrist	0.93	0.88-0.96	
	Light	Hip	0.71	0.31-0.83	
		Wrist	0.71	0.63-0.78	
	Moderate	Hip	0.88	0.79-0.92	
		Wrist	0.83	0.73-0.84	
		Ankle	0.84	—	
	Vigorous	Hip	0.72	0.51-0.85	
		Wrist	0.85	0.81-0.87	
		Ankle	0.84	—	
	AUC	Sedentary	Hip	0.98	0.97-0.99
			Wrist	0.97	0.96-0.97
Light		Hip	0.80	—	
		Wrist	0.69	0.66-0.73	
Moderate		Hip	0.98	0.83-0.99	
		Wrist	0.91	0.86-0.93	
		Ankle	0.87	—	
Vigorous		Hip	0.92	0.67-0.94	
		Wrist	0.94	0.94-0.96	
		Ankle	0.87	—	

Abbreviations: AUC, area under the curve; IQR, interquartile range.

^aIQR is not reported when only 1 study was completed.

accelerometers were validated against direct observation, metabolic monitoring, and energy expenditure by calorimetry, accelerometers had greater than 80% sensitivity and specificity for detecting sedentary behavior.³² Our study showed even higher sensitivity and specificity (>95% for hip and wrist locations) for detecting sedentary behavior. There are multiple potential reasons why our study showed improved accuracy for detecting sedentary behavior, including the use of a standard definition of sedentary behavior (≤ 1.5 METs⁴), comparing only to indirect calorimetry, and using a consistent outcome measurement (sensitivity and specificity). Accelerometers offer the benefit of quantifying sedentary behavior in free-living conditions but most, especially with wrist placement, cannot differentiate well between various sedentary behaviors such as lying, reclining, or sitting.³³ A number of factors should be considered when choosing an accelerometer, including type, placement site, and data-gathering rate. Although

most accelerometers used to measure physical activity levels are based on MEMS chips, they differ in performance and locations of attachment.^{14,34} Low-amplitude movement (nonexercise activity) is ideally detected with an accelerometer with a low *g*-force setting (~1-2 *g*).³⁴ Most movement amplitudes can be detected with a *g*-force setting up to 6,³⁵ but high-intensity movements can be detected only with a high *g* setting (up to 10 *g*).^{34,36} Raw accelerometer *g*-force data can be converted to activity counts, but studies vary in the cutoff points used to define different levels of physical activity.^{37,38} Another factor that impedes comparison of accelerometers is the lack of standardized methods for cleaning, processing, analyzing, and describing accelerometer data.²⁸

As described by Dadlani et al,³⁴ and Ziebart et al,³⁶ the rate at which the accelerometer gathers data is an important consideration. For example, a brief burst of activity (eg, a short sprint) may not be detected by a device that records

movement data only every 10 seconds. However, when data are collected frequently, noise and interference signals become concerns because data acquisition must occur rapidly and the volume of data also will be high. Furthermore, such a device would require high data storage capacity, which increases costs.³⁴

Although the current proliferation of wearable activity-tracking devices suggests that monitors can be placed on the wrist or ankle, our study and others do not confirm the reliability when devices are placed in those locations. A study by Tudor-Locke et al³⁹ found that the hip attachment site outperformed the wrist site for visually counted steps. In addition, Rosenberger et al⁴⁰ showed greater sensitivity and specificity with hip placement compared with wrist placement for detecting movement. One study included in our systematic review directly compared hip versus wrist location and found that the hip-mounted monitor had higher criterion and concurrent validity compared with the wrist.²³ However, some evidence suggests that children may be more compliant with wrist placement than hip placement.^{41,42} Our systematic review did not assess compliance, but it should be evaluated in future studies.

There appears to be a paradox in the use of accelerometers that is unique to children. In adults, triaxial accelerometers are reliable because most adult movement is based on walking and output correlates with velocity. However, in children, active movement is more difficult to measure. When a child is sedentary, such as when watching television, their movement levels are so low that a triaxial accelerometer can accurately and precisely detect the lack of activity; but when children move (eg, during play or going to school), their body movements are more sporadic, volatile, and disorganized compared with those of adults. Thus, measurements of movement in children are less valid during periods of activity than when they are sedentary.

We acknowledge many limitations associated with reviewing literature on accelerometer use in children. First, we included only studies that reported sensitivity and specificity and excluded those that used regression analysis; this design limited the number of studies included in the systematic review but facilitated comparison of diagnostic measures. Because of the small number of included studies, we were unable to compare different brands of accelerometers or different age groups such as preschool versus adolescent. Second, energy expenditure was measured by different methods of indirect calorimetry, and this inconsistency may have resulted in variability in outcomes. Third, we were unable to obtain raw data to pool for a meta-analysis and instead completed a systematic review. Use of a standard repository for accelerometer data would mitigate these limitations in future studies and allow for pooled analyses.⁴³ Fourth, we evaluated the validity of accelerometers in laboratory settings, which may overestimate energy expenditure compared with free-living settings.^{44,45} However, children in

our included studies participated in activities that are currently prevalent and popular, including playing video games, watching movies, and playing team sports. Last, most of the studies included in this review had a high risk of bias, methodologic limitations, and considerable heterogeneity.

This review and the prior studies raise a number of considerations that can improve our knowledge regarding the accuracy of modern accelerometers in detecting physical activity and sedentary behavior. First, the development of a shared data repository would improve our ability to evaluate different types of accelerometers, assess different age groups, and complete meta-analyses with pooled data. Second, it is important that standard comparison outcomes, such as MET levels using indirect calorimetry, are used consistently in validation studies. Third, evaluation of compliance, durability, and usability should be included in future studies.

Conclusion

The accuracy of triaxial and omnidirectional accelerometers appears to be greatest when detecting sedentary behavior and least when detecting light physical activity; this distinction is important because most of a child's daily activity is within this range. Hip accelerometer placement is more accurate than wrist placement for measuring activity. Triaxial and omnidirectional accelerometers accurately measure physical activity and sedentary behavior and can be used in observational and experimental studies.

Declaration of Conflicting Interests

The author(s) declared no potential conflicts of interest with respect to the research, authorship, and/or publication of this article.

Funding

The author(s) received no financial support for the research, authorship, and/or publication of this article.

ORCID iD

Brian A. Lynch  <https://orcid.org/0000-0003-4155-7182>

Supplemental Material

Supplemental material for this article is available online.

References

1. Centers for Disease Control and Prevention. *Guidelines for School and Community Programs to Promote Lifelong Physical Activity Among Young People*. Atlanta, GA: US Department of Health and Human Services, Public Health Service, Centers for Disease Control and Prevention; 1997.
2. Office of Disease Prevention and Health Promotion, US Department of Health and Human Services. 2008 Physical

- activity guidelines for Americans. <https://health.gov/paguidelines/guidelines/>. Accessed November 13, 2018.
3. Tremblay MS, LeBlanc AG, Kho ME, et al. Systematic review of sedentary behaviour and health indicators in school-aged children and youth. *Int J Behav Nutr Phys Act*. 2011;8:98.
 4. Tremblay MS, Aubert S, Barnes JD, et al. Sedentary Behavior Research Network (SBRN)—terminology consensus project process and outcome. *Int J Behav Nutr Phys Act*. 2017;14:75.
 5. van Ekris E, Altenburg TM, Singh AS, Proper KI, Heymans MW, Chinapaw MJ. An evidence-update on the prospective relationship between childhood sedentary behaviour and biomedical health indicators: a systematic review and meta-analysis. *Obes Rev*. 2016;17:833-849.
 6. Adamo KB, Prince SA, Tricco AC, Connor-Gorber S, Tremblay M. A comparison of indirect versus direct measures for assessing physical activity in the pediatric population: a systematic review. *Int J Pediatr Obes*. 2009;4:2-27.
 7. Chinapaw MJ, Mokkink LB, van Poppel MN, van Mechelen W, Terwee CB. Physical activity questionnaires for youth: a systematic review of measurement properties. *Sports Med*. 2010;40:539-563.
 8. Hills AP, Mokhtar N, Byrne NM. Assessment of physical activity and energy expenditure: an overview of objective measures. *Front Nutr*. 2014;1:5.
 9. Jette M, Sidney K, Blumchen G. Metabolic equivalents (METs) in exercise testing, exercise prescription, and evaluation of functional capacity. *Clin Cardiol*. 1990;13:555-565.
 10. Lyden K, Keadle SK, Staudenmayer J, Freedson P, Alhassan S. Energy cost of common activities in children and adolescents. *J Phys Act Health*. 2013;10:62-69.
 11. Heil DP, Brage S, Rothery MP. Modeling physical activity outcomes from wearable monitors. *Med Sci Sports Exerc*. 2012;44(1 suppl 1):S50-S60.
 12. Sanders JP, Loveday A, Pearson N, et al. Devices for self-monitoring sedentary time or physical activity: a scoping review. *J Med Internet Res*. 2016;18:e90.
 13. Puyau MR, Adolph AL, Vohra FA, Zakeri I, Butte NF. Prediction of activity energy expenditure using accelerometers in children. *Med Sci Sports Exerc*. 2004;36:1625-1631.
 14. Godfrey A, Conway R, Meagher D, O'Leighin G. Direct measurement of human movement by accelerometry. *Med Eng Phys*. 2008;30:1364-1386.
 15. Sardinha LB, Judice PB. Usefulness of motion sensors to estimate energy expenditure in children and adults: a narrative review of studies using DLW. *Eur J Clin Nutr*. 2017;71:331-339.
 16. Moher D, Liberati A, Tetzlaff J, Altman DG; PRISMA Group. Preferred reporting items for systematic reviews and meta-analyses: the PRISMA statement. *PLoS Med*. 2009;6:e1000097.
 17. Whiting PF, Rutjes AW, Westwood ME, et al. QUADAS-2: a revised tool for the quality assessment of diagnostic accuracy studies. *Ann Intern Med*. 2011;155:529-536.
 18. Roscoe CMP, James RS, Duncan MJ. Calibration of GENEActiv accelerometer wrist cut-points for the assessment of physical activity intensity of preschool aged children. *Eur J Pediatr*. 2017;176:1093-1098.
 19. Hager ER, Treuth MS, Gormely C, Epps L, Snitker S, Black MM. Ankle accelerometry for assessing physical activity among adolescent girls: tThreshold Determination, Validity, Reliability, and Feasibility. *Res Q Exerc Sport*. 2015;86:397-405.
 20. Crouter SE, Flynn JI, Bassett DR Jr. Estimating physical activity in youth using a wrist accelerometer. *Med Sci Sports Exerc*. 2015;47:944-951.
 21. Romanzini M, Petroski EL, Reichert FF. Accelerometers thresholds to estimate physical activity intensity in children and adolescents: a systematic review. *Rev Brasil Cineantropometr Desempenho Hum*. 2012;14:101-113.
 22. Santos-Lozano A, Santin-Medeiros F, Cardon G, et al. Actigraph GT3X: validation and determination of physical activity intensity cut points. *Int J Sports Med*. 2013;34:975-982.
 23. Phillips LR, Parfitt G, Rowlands AV. Calibration of the GENEActiv accelerometer for assessment of physical activity intensity in children. *J Sci Med Sport*. 2013;16:124-128.
 24. Pfeiffer KA, McIver KL, Dowda M, Almeida MJ, Pate RR. Validation and calibration of the Actical accelerometer in preschool children. *Med Sci Sports Exerc*. 2006;38:152-157.
 25. Duncan MJ, Wilson S, Tallis J, Eyre E. Validation of the Phillips et al. GENEActiv accelerometer wrist cut-points in children aged 5-8 years old. *Eur J Pediatr*. 2016;175:2019-2021.
 26. Chu EY, McManus AM, Yu CC. Calibration of the RT3 accelerometer for ambulation and nonambulation in children. *Med Sci Sports Exerc*. 2007;39:2085-2091.
 27. Schaefer CA, Nigg CR, Hill JO, Brink LA, Browning RC. Establishing and evaluating wrist cutpoints for the GENEActiv accelerometer in youth. *Med Sci Sports Exerc*. 2014;46:826-833.
 28. De Vries SI, Van Hirtum HW, Bakker I, Hopman-Rock M, Hirasings RA, Van Mechelen W. Validity and reproducibility of motion sensors in youth: a systematic update. *Med Sci Sports Exerc*. 2009;41:818-827.
 29. Rowlands AV. Accelerometer assessment of physical activity in children: an update. *Pediatr Exerc Sci*. 2007;19:252-266.
 30. Freedson P, Pober D, Janz KF. Calibration of accelerometer output for children. *Med Sci Sports Exerc*. 2005;37(11 suppl):S523-S530.
 31. Trost SG, McIver KL, Pate RR. Conducting accelerometer-based activity assessments in field-based research. *Med Sci Sports Exerc*. 2005;37(11 suppl):S531-S543.
 32. Lubans DR, Hesketh K, Cliff DP, et al. A systematic review of the validity and reliability of sedentary behaviour measures used with children and adolescents. *Obes Rev*. 2011;12:781-799.
 33. Hurter L, Fairclough SJ, Knowles ZR, Porcellato LA, Cooper-Ryan AM, Boddy LM. Establishing raw acceleration thresholds to classify sedentary and stationary behaviour in children. *Children (Basel)*. 2018;5:E172.
 34. Dadlani V, Levine JA, McCrady-Spitzer SK, Dassau E, Kudva YC. Physical activity capture technology with potential for incorporation into closed-loop control for type 1 diabetes. *J Diabetes Sci Technol*. 2015;9:1208-1216.
 35. Morrow MM, Hurd WJ, Fortune E, Lugade V, Kaufman KR. Accelerations of the waist and lower extremities over a range of gait velocities to aid in activity monitor selection for field-based studies. *J Appl Biomech*. 2014;30:581-585.
 36. Ziebart C, Giangregorio LM, Gibbs JC, Levine IC, Tung J, Laing AC. Measurement of peak impact loads differ between

- accelerometers—effects of system operating range and sampling rate. *J Biomech.* 2017;58:222-226.
37. Bornstein DB, Beets MW, Byun W, McIver K. Accelerometer-derived physical activity levels of preschoolers: a meta-analysis. *J Sci Med Sport.* 2011;14:504-511.
 38. Kim Y, Beets MW, Welk GJ. Everything you wanted to know about selecting the “right” Actigraph accelerometer cut-points for youth, but . . . : a systematic review. *J Sci Med Sport.* 2012;15:311-321.
 39. Tudor-Locke C, Barreira TV, Schuna JM Jr. Comparison of step outputs for waist and wrist accelerometer attachment sites. *Med Sci Sports Exerc.* 2015;47:839-842.
 40. Rosenberger ME, Haskell WL, Albinali F, Mota S, Nawyn J, Intille S. Estimating activity and sedentary behavior from an accelerometer on the hip or wrist. *Med Sci Sports Exerc.* 2013;45:964-975.
 41. Fairclough SJ, Noonan R, Rowlands AV, Van Hees V, Knowles Z, Boddy LM. Wear compliance and activity in children wearing wrist- and hip-mounted accelerometers. *Med Sci Sports Exerc.* 2016;48:245-253.
 42. Tudor-Locke C, Barreira TV, Schuna JM Jr, et al. Improving wear time compliance with a 24-hour waist-worn accelerometer protocol in the International Study of Childhood Obesity, Lifestyle and the Environment (ISCOLE). *Int J Behav Nutr Phys Act.* 2015;12:11.
 43. Corder K, Sharp SJ, Atkin AJ, et al. Age-related patterns of vigorous-intensity physical activity in youth: The International Children’s Accelerometry Database. *Prev Med Rep.* 2016;4:17-22.
 44. de Graauw SM, de Groot JF, van Brussel M, Streur MF, Takken T. Review of prediction models to estimate activity-related energy expenditure in children and adolescents. *Int J Pediatr.* 2010;2010:489304.
 45. Crouter SE, Churilla JR, Bassett DR Jr. Estimating energy expenditure using accelerometers. *Eur J Appl Physiol.* 2006;98:601-612.