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# Guide to the Assessment of Physical Activity: Clinical and Research Applications A Scientific Statement From the American Heart Association 

Scott J. Strath, PhD, Chair; Leonard A. Kaminsky, PhD, Co-Chair; Barbara E. Ainsworth, PhD, MPH, FAHA; Ulf Ekelund, PhD; Patty S. Freedson, PhD;<br>Rebecca A. Gary, RN, PhD; Caroline R. Richardson, MD; Derek T. Smith, PhD; Ann M. Swartz, PhD; on behalf of the American Heart Association Physical Activity Committee of the Council on Lifestyle and Cardiometabolic Health and Cardiovascular, Exercise, Cardiac Rehabilitation and Prevention Committee of the Council on Clinical Cardiology, and Council on Cardiovascular and Stroke Nursing

Approximately 60 years ago, the foundational works of Jeremy Morris and colleagues showed that the incidence of coronary heart disease in bus conductors who climbed up and down stairs of double-deck buses collecting tickets and in postal carriers who delivered the mail on foot was lower than that of the relatively inactive bus drivers or postal office workers who spent most of their occupational time sitting. ${ }^{1,2}$ Since then, numerous other investigators have confirmed the strong link between physical activity and health in a variety of populations. ${ }^{3}$ The accumulation of evidence connecting physical activity to health led the American Heart Association to include physical inactivity as a major risk factor for coronary artery disease in $1992 .{ }^{4}$ A recent report characterized the impact of physical inactivity as similar to that of smoking in relation to the burden of noncommunicable diseases worldwide. ${ }^{5}$ The deleterious effects of physical inactivity are associated with many of the most common chronic diseases and conditions, including heart disease, type 2 diabetes mellitus, hypertension, obesity, osteoporosis, depression, and breast and colorectal cancers. ${ }^{5,6}$ In the United States, chronic diseases cause 7 in 10 deaths and account for $\approx 75 \%$ of all healthcare spending. ${ }^{7}$ Chenoweth and Leutzinger ${ }^{8}$ used data from direct medical expenditures, workers' compensation, and productivity loss to calculate that in 2003, the financial impact of physical inactivity for all US adults was $\approx \$ 251$ billion.

A physically active lifestyle is 1 of the top 10 health indicators for Americans in the Healthy People 2020 objectives ${ }^{9}$ and is 1 of the 7 goals listed for ideal cardiovascular health in the 2020 American Heart Association Impact Goals. ${ }^{10}$ In September 2012, the Global Cardiovascular Disease Taskforce, which comprises an international panel of experts in cardiovascular and noncommunicable disease communities, released a joint communication that set a goal of a $10 \%$ relative reduction in the prevalence of insufficient physical activity, which is 1 of the top 4 evidenced-based global targets to reduce noncommunicable disease. ${ }^{11}$

The first public health recommendations for physical activity in the United States were released in 1995, ${ }^{12}$ and these were followed by additional and updated recommendations in $1996^{3}$ and 2007. ${ }^{13,14}$ In 2008, the body of evidence culminated in the first-ever federal guidelines for physical activity. ${ }^{6}$ These guidelines simplified the message for the general public concerning health-enhancing levels of physical activity and included the following recommendations: (1) Adults should avoid inactivity (ie, some physical activity is better than none); (2) substantial health benefits are obtained from accumulating, in bouts of $\geq 10$ minutes, 150 minutes per week of moderate-intensity or 75 minutes per week of vigorous-intensity aerobic activity, or an equivalent combination of both; (3) additional and more extensive health benefits are obtained by increasing aerobic physical activity to 300 minutes per

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week at moderate intensity or 150 minutes per week at vigorous intensity or an equivalent combination of both; and (4) muscle-strengthening activities of moderate to high intensity should be performed $\geq 2$ days per week.

Despite the well-established individual benefit of leading a physically active lifestyle and the broader public health impact of reducing chronic disease risk and premature mortality, too many US adults are insufficiently physically active. Estimates of adult physical activity levels and prevalence vary. For example, data from the 2005 National Health Interview Survey reported $31 \%$ of US adults obtained regular physical activity (defined as $\geq 30$ minutes of moderate-intensity physical activity on 5 days of the week or $\geq 20$ minutes of vigorousintensity physical activity on 3 days of the week ${ }^{15}$; however, the 2007 Behavioral Risk Factor Surveillance System telephone survey suggested $49 \%$ of US adults were obtaining the same recommended amount of physical activity. ${ }^{16}$ These survey-derived findings differ from the 2003-2004 National Health and Nutritional Examination Survey's accelerometerbased assessment that reported $<5 \%$ of adults were regularly active (defined as having accumulated $\geq 30$ minutes of moderate or greater intensity activity in $\geq 8-10$-minute bouts during a day on $\geq 5$ days of 1 week). ${ }^{17}$ These discrepancies highlight the need for routine and consistent assessment of physical activity in research and clinical settings to improve risk factor identification, minimize physical inactivity, and further advance our understanding of the health-related impact. Understandably, research versus clinical setting differences present unique challenges to the routine assessment of physical activity, but there are numerous tools (subjective and objective) available to both settings that may make such assessment feasible and sustainable.

Recently, subjective (eg, self-report) ${ }^{18}$ and objective (eg, accelerometer) measurement ${ }^{19}$ methods for assessing physical activity were reviewed. Although these reports provide evidenced-based appraisals and application information for the methods reviewed, they do not provide clear recommendations for use. At present, there is little information available to guide the selection of a physical activity assessment method that is appropriate for the wide variety of potential applications. Consider an example in which a clinician desires to assess physical activity as a health indicator, similar to the standard assessments made for all other cardiovascular disease risk factors. The assessment of physical activity is needed to allow the clinician to provide specific recommendations for patients identified as insufficiently active. In selecting the appropriate physical activity assessment method, several questions must be considered, such as the physical activity dimensions and domains that are desired, the number of patients who will be assessed, the costs, the personnel requirements, and how quickly the results are needed. In different settings, the same underlying questions could be used to guide the selection of the best measurement tool that is feasible, practical, sensitive enough to detect change, and sustainable in those settings.

With the documented health benefits of a physically active lifestyle as its guiding principle, this scientific statement recommends that physical activity be assessed regularly, as are the other major risk factors. The primary objectives of this
statement are to (1) provide the rationale for the importance of assessing physical activity, (2) explain key concepts involved in the assessment of physical activity, and (3) provide an overview of options for assessment of physical activity available to clinicians and researchers. A decision matrix is presented as a tool to guide the selection of the best physical activity assessment method based on specific needs of clinicians and researchers.

## Key Concepts for Understanding Physical Activity Assessment

## Physical Activity

Before one considers units of measure in physical activity assessment, assessment options/tools, their inherent strengths and weaknesses, and other practical considerations that inform best-practice recommendations, it is necessary to define key concepts, starting with the definition of physical activity. The most popular and widely cited definition of physical activity was published by Caspersen and colleagues in 1985. ${ }^{20}$ Physical activity was defined as "any bodily movements produced by skeletal muscles that result in energy expenditure." This term is commonly used as an abbreviation for healthenhancing physical activity. Other iterations of this definition have been proposed and used; however, most are a derivation of the definition by Caspersen et al. ${ }^{200 r t}$

Physical activity can either be classified as structured or incidental. Structured physical activity or exercise is planned, purposeful activity undertaken to promote health and fitness benefits. ${ }^{20}$ Incidental physical activity is not planned and usually is the result of daily activities at work, at home, or during transport.

## Dimensions and Domains of Physical Activity

The 4 dimensions of physical activity include (1) mode or type of activity, (2) frequency of performing activity, (3) duration of performing activity, and (4) intensity of performing activity. Table 1 identifies, defines, and contextualizes the 4 dimensions.

In addition to the dimensions of physical activity, the domains in which physical activity occurs are central to understanding the assessment of physical activity. This is particularly important when behavior change is the intended goal. Four common domains of physical activity are occupational, domestic, transportation, and leisure time. Table 2 presents this 4 -category classification schema with contextual definitions and examples.

Historically, approaches to promoting physical activity focused on leisure time physical activity, and assessment instruments were developed and validated accordingly; however, because health-enhancing physical activity may occur in any and all of these domains, assessment of total physical activity should capture each of the 4 domains. This is evident because a substitution effect can materialize; for instance, an increase in physical activity in one domain (eg, occupation) may be compensated by a decreased activity in another domain (eg, leisure time). Therefore, it becomes paramount that all domains be captured; otherwise the assessment of total physical activity will be incomplete.

Table 1. Physical Activity Dimensions: Mode, Frequency,
Duration, and Intensity

| Dimension | Definition and Context |
| :--- | :---: |
| Mode | Specific activity performed (eg, walking, gardening, cycling). <br> Mode can also be defined in the context of physiological and <br> biomechanical demands/types (eg, aerobic versus anaerobic <br> activity, resistance or strength training, balance and stability <br> training). |
| Frequency | Number of sessions per day or per week. In the context of health- <br> promoting physical activity, frequency is often qualified as <br> number of sessions (bouts) $\geq 10$ min in duration/length. |
| Duration | Time (minutes or hours) of the activity bout during a specified <br> time frame (eg, day, week, year, past month). <br> Rate of energy expenditure. Intensity is an indicator of the <br> metabolic demand of an activity. It can be objectively quantified <br> with physiological measures (eg, oxygen consumption, heart <br> rate, respiratory exchange ratio), subjectively assessed by <br> perceptual characteristics (eg, rating of perceived exertion, <br> walk-and-talk test), or quantified by body movement (eg, <br> stepping rate, 3-dimensional body accelerations). |
|  |  |

## Quantifying Units of Measure Indicative of Physical Activity Level

Physical activity results in an increase in energy expenditure above resting levels, and the rate of energy expenditure is directly linked to the intensity of the physical activity. The energy expended during physical activity is just 1 of the 3 components of total daily energy expenditure, as shown in Figure 1. Physical activity-related energy expenditure (PAEE) is the most variable portion of total daily energy expenditure.

Physical activities are commonly quantified by determining the energy expenditure in kilocalories or by using the metabolic equivalent (MET) of the activity. Another common method is to compute how much time a person spends in different physical activity intensity categories on a given day or over a given week.

## Kilocalories

One liter of oxygen consumption is approximately equal to 5 kcal of energy. ${ }^{21}$ Consider the example of a $70-\mathrm{kg}$ individual walking for 30 minutes at 4 mph , which results in an oxygen consumption of $1 \mathrm{~L} / \mathrm{min}$. For this 30 -minute walk, the individual would consume 30 L of oxygen. In

## Table 2. Physical Activity Domains

| Domain | Contextual Definition or Examples |
| :--- | :---: |
| Occupational | Work-related: involving manual labor tasks, walking, <br> carrying or lifting objects <br> Housework, yard work, child care, chores, self-care, <br> Domestic <br> shopping, incidental |
| Leisure time | Purpose of going somewhere: walking, bicycling, <br> climbing/descending stairs to public transportation, <br> standing while riding transportation <br> Discretionary or recreational activities: sports, <br> hobbies, exercise, volunteer work |



Figure 1. Components of typical total daily energy expenditure. Resting energy expenditure indicates the energy needed to maintain vital life functions during basal and sleeping conditions; physical activity-related energy expenditure, the energy needed to maintain movement demand above that of resting conditions; and thermic effect of food, the energy required for purposes of digestion and the breakdown of food stuff. Modified from McArdle et al. ${ }^{21}$
this example, the gross (including resting) energy expenditure would be $\approx 150 \mathrm{kcal}(30 \mathrm{~L} \times 5 \mathrm{kcal} / \mathrm{L})$. The net or PAEE would be $\approx 112.5 \mathrm{kcal}$ ( $30 \mathrm{~L} \times[5-1.25$ (resting kilocalories expenditure)] $\mathrm{kcal} / \mathrm{L}$ ). Daily PAEE would be the sum of all the different physical activities performed on a given day. Energy expenditure during ambulatory physical activity increases directly with the mass of the body being moved. For this reason, energy expenditure is sometimes expressed relative to body mass as kilocalories per kilogram of body mass per minute $\left(\mathrm{kcal} \cdot \mathrm{kg}^{-1} \cdot \mathrm{~min}^{-1}\right)$.

## Metabolic Equivalent

The MET is a common unit used to express exercise intensity. One MET represents the resting energy expenditure during quiet sitting and is commonly defined as 3.5 $\mathrm{mL} \mathrm{O} \mathrm{O}_{2} \cdot \mathrm{~kg}^{-1} \cdot \mathrm{~min}^{-1}$ or $\approx 250 \mathrm{~mL} / \mathrm{min}$ of oxygen consumed, which represents the average value for a standard $70-\mathrm{kg}$ person. METs can be converted to kilocalories (1 MET=1 $\mathrm{kcal} \cdot \mathrm{kg}^{-1} \cdot \mathrm{~h}^{-1}$ ). These values represent approximations, because factors of sex, age, and body composition will affect measures of resting energy expenditure, and thus, actual MET values may vary. ${ }^{21}$

Oxygen consumption increases with the intensity of physical activity. Thus, a simple approach to quantifying the intensity of physical activity is to use multiples of resting energy expenditure. For example, performing an activity that requires an oxygen consumption of $10.5 \mathrm{~mL} \mathrm{O} \mathrm{O}_{2} \cdot \mathrm{~kg}^{-1} \cdot \mathrm{~min}^{-1}$ is equal to 3 METs (ie, 3 times the resting level). Physical activity volume, or total physical activity level, can therefore be estimated by multiplying the dimensions of intensity, duration, and frequency over a given time period, typically 1 day or 1 week. For example, the total daily volume associated with the transportation domain for an individual who walked to and from work, each bout lasting 30 minutes and performed at an intensity of 3 METs, would be calculated as follows:

$$
\begin{aligned}
& 3 \text { METs (intensity) } \times 30 \mathrm{~min} \text { (duration) } \\
& \quad \times 2 \text { times per day }(\text { frequency })
\end{aligned}=\begin{aligned}
& 180 \mathrm{MET} \cdot \mathrm{~min}^{-1} \cdot \mathrm{~d}^{-1} \\
& \text { or } 3 \mathrm{MET} \cdot \mathrm{~h}^{-1} \cdot \mathrm{~d}^{-1}
\end{aligned}
$$

## Moderate- and Vigorous-Intensity Physical Activity

Perhaps one of the most common measures of interest from a physical activity assessment is simply the amount of time an individual spends in a specified physical activity intensity threshold range. For example, assessments frequently seek to determine whether an individual is meeting the 2008 physical activity guidelines for Americans ${ }^{6}$ of a cumulative 150 minutes per week of moderate-intensity physical activity or 75 minutes per week of vigorous-intensity physical activity. Moderateintensity and vigorous-intensity physical activity can be defined in both absolute and relative terms. Absolute intensity is determined by the external work performed, whereas relative intensity is determined relative to an individual's level of cardiorespiratory fitness ( $\mathrm{V}_{2}$ max). Standard definitions for both relative and absolute intensity are shown in Table 3. Walking, for instance, is often described as a moderate-intensity physical activity; however, the actual intensity for an individual may vary. In absolute terms, walking at a speed of $\approx 3 \mathrm{mph}$ is equivalent to 3 METs , which meets the criteria for moderate intensity. However, a difference can be noted when one compares individuals of different fitness levels (person A with a $\dot{\mathrm{V}}_{2}$ max of $17.5 \mathrm{~mL} \mathrm{O} \mathrm{O}_{2} \cdot \mathrm{~kg}^{-1} \cdot \mathrm{~min}^{-1}$ [5 METs] versus person B with a $\dot{\mathrm{V}}_{2} \mathrm{max}$ of $42 \mathrm{~mL} \mathrm{O}{ }_{2} \cdot \mathrm{~kg}^{-1} \cdot \mathrm{~min}^{-1}$ [12 METs]) walking together at a speed of 3 mph . From an absolute standpoint, both person A and person B are performing at the same absolute level of physical activity intensity ( 3 METs). From a relative standpoint, though, person A is performing at a hard-intensity level (walking at $60 \%$ of $\dot{V}_{2}$ max), whereas person $B$ is performing a light-intensity activity (walking at $25 \%$ of $\dot{\mathrm{Vo}}_{2}$ max).

## Available Methods of Assessing Physical Activity

There are 2 broad categories of methods available to assess physical activity: subjective methods and objective methods. Subjective methodologies rely on the individual either to record activities as they occur or to recall previous activities. Objective methodologies include all wearable monitors that directly measure 1 or more biosignals, such as acceleration, heart rate, or some other indicator of physical activity or energy expenditure, as they occur.

Table 3. Classification of Physical Activity Intensity

| Intensity | Relative Intensity |  |  | Absolute Intensity |  |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  | $\dot{\mathrm{V}}_{2} \max (\%)$ <br> Heart Rate <br> Reserve, \%* | Maximal Heart Rate, \% | RPE | Intensity | METs |
| Very light | <25 | $<30$ | <9 | Sedentary | 1-1.5 |
| Light | 25-44 | 30-49 | 9-10 | Light | 1.6-2.9 |
| Moderate | 45-59 | 50-69 | 11-12 | Moderate | 3.0-5.9 |
| Hard | 60-84 | 70-89 | 13-16 | Vigorous | $\geq 6.0$ |
| Very hard | $\geq 85$ | $\geq 90$ | $>16$ |  |  |
| Maximal | 100 | 100 | 20 |  |  |

METs indicates metabolic equivalents; RPE, rating of perceived exertion; and $\dot{V}_{2} \max$, maximal aerobic capacity.
${ }^{2} \%$ Heart rate reserve (HRR) formula=Maximal heart rate (HR)-resting HR=HRR; calculate HRR target by (HRR $\times \%$ value)+resting HR.

Modified from Physical Activity and Health: A Report of the Surgeon General. ${ }^{3(p 33)}$

## Subjective Methods of Assessing Physical Activity

Two types of subjective methods are used to assess physical activity: questionnaires and diaries/logs.

## Physical Activity Questionnaires

Physical activity questionnaires are used to identify the dimensions and domains of physical activity behaviors from either self-reported responses or interviews. Questionnaires vary in their detail, ranging from a few items that give a global overview of activity to a long, detailed quantitative history of activity over the past year or even a lifetime. Physical activity questionnaires are classified into 3 categories: global, recall, and quantitative history. Overall, validation studies of questionnaires show strong correlations and agreement with other construct criteria measures for vigorous-intensity physical activity, but they are generally less accurate for light- to mod-erate-intensity activities. ${ }^{22-24}$ Discriminant validation studies have shown that questionnaires are able to classify individuals in rank order according to activity level, ${ }^{25}$ so in other words, within a sample, they are able to discern who is less or more physically active. Table 4 provides an overview of some of the most commonly used global, recall, and quantitative history questionnaires, along with questionnaire characteristics and key references that provide validity information to help inform choice when considering a questionnaire as a physical activity assessment tool.

## Global Physical Activity Questionnaires

Global questionnaires provide a quick overview of a person's physical activity level. Global questionnaires are typically short ( 2 to 4 items) and are used to identify whether an individual meets a physical activity standard (eg, $150 \mathrm{~min} / \mathrm{wk}$ of moderate to vigorous physical activity) or to provide a classification (eg, active versus inactive). As a self-administered tool, global questionnaires are preferred in many clinical settings, epidemiological studies, and surveillance settings for their ease of administration, brevity, and ability to determine a physical activity score.

One example of a commonly used global questionnaire is the Exercise Vital Sign. This 2-item global questionnaire is used in electronic medical records to assess the minutes per week patients spent in moderate- or vigorous-intensity activity. Administration to nearly 2 million patients in a healthcare setting showed the questionnaire had good discriminant validity when the proportions of patients classified as inactive, insufficiently active, or sufficiently active were compared with national physical activity surveillance data. ${ }^{26}$

## Short Recall Physical Activity Questionnaires

Short recall physical activity questionnaires provide a quick assessment of the total volume of physical activity classified by dimension of intensity level or by domain. Short recalls often are used to determine the proportion of adults meeting national physical activity guidelines in surveillance and descriptive epidemiology settings ${ }^{45,71,72}$ and to identify physical activity behavior change in intervention studies. ${ }^{73}$ Types of activities surveyed include moderate- and vigorous-intensity categories or selected activities and behaviors such as walking, stair climbing, and sitting. Short recall physical activity questionnaires generally have from 7 to 12 items and can be

Table 4. Available Sample of Subjective Physical Activity Assessment Methods


Table 4. Continued

| Instrument | Number of Items | Administration Mode | Summary Score Unit | Dimensions Assessed* | Domains Assessed $\dagger$ | Setting | Population | Key References |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Kaiser PAQ <br> (KPAS) | 75 | Interviewer, self | Activity index (1-5), total activity index | 2, 3, 4 | 2, 3, 4, 6 | Community | Adults, women, pregnant women, white | 54, 55 |
| LOPAR |  | Interviewer | MET $\cdot \mathrm{h}^{-1} \cdot \mathrm{wk}^{-1}$ | 1, 2, 3 | 3, 4, 6 | Clinic | Adults | 56 |
| Pregnancy PAQ | 32 | Self | MET $\cdot{ }^{-1} \cdot \mathrm{wk}^{-1}$ | 2, 3 | 3, 4, 5, 6 | Community | Pregnant women, white, black, Hispanic | 57 |
| Seven-day PA Recall | 4-8 | Interviewer | MET $\cdot \mathrm{min}^{-1} \cdot \mathrm{wk}^{-1}$, MET $\cdot h^{-1} \cdot \mathrm{wk}^{-1}$ | 1, 2, 3 | 3, 4 | Community, clinic | Adults, older adults, children, adolescents, men, women, black, Asian, Hispanic | 23, 34, 37 |
| Yale PAQ (YPAS) | 25 | Interviewer | Activity index (kcal/wk), total time index (h/wk), summary index | 1, 2, 3, 6 | 1, 3, 6 | Clinic | Older adults, adults, men, women, white | 34, 58, 59 |
| Quantitative history |  |  |  |  |  |  |  |  |
| Friedenrich Lifetime Leisure | Varies | Interviewer | MET $\cdot h^{-1} \cdot w k^{-1}$, day, month, year | 1, 2, 3 | 3, 4, 6 | Recovery group | Adults, older adults, women, white, Asian | 60 |
| Minnesota LTPA | 63 | Interviewer | Total metabolic activity index | 4 | 3, 6 | Community, military | Older adults, adults, men, women, white, Spanish, black | $\begin{gathered} 34,35,43,58, \\ 61-65 \end{gathered}$ |
| Modifiable Activity Questionnaire | Varies | Interviewer, self | h/wk, <br> MET $\cdot h^{-1} \cdot \mathrm{wk}^{-1}$ | 2, 3, 4 | 3, 4 | Community | Adults, men, women, Native American, white, Iranian | 66-70 |
| Tecumseh Self- <br> Administered Occupational PAQ | $29$ | Self | Work activity units, transportation activity units, walking, bicycling, stair activity units | $6$ | $4$ | Community | Adults, men, women, white, black | 23, 37, 43, 61 |

Physical activity questionnaires represent a listing of commonly used measures; this does not represent an exhaustive list. -
ARIC indicates Atherosclerosis Risk in Communities; BRFSS, Behavioral Risk Factor Surveillance Survey; CARDIA, Cardiovascular Risk Development in Young Adults; CHAMPS, Community Healthy Activities Model Program for Seniors; EPIC, European Prospective Investigation Into Cancer and Nutrition; KPAS, Kaiser Physical Activity Survey; LOPAR, Low-level physical activity recall; LTPA, leisure-time physical activity; MET, metabolic equivalent; MS, multiple sclerosis; PA, physical activity; PAQ, physical activity questionnaire; and YPAS, Yale Physical Activity Survey.
*Dimensions assessed: 1=intensity, 2=frequency, 3=duration, 4=total physical activity, 5=meeting physical activity guidelines, and 6=energy expenditure.
$\dagger$ Domains assessed: $1=$ walking, $2=$ lifestyle, $3=$ leisure time, $4=0$ ccupational, $5=$ transportation, and $6=$ household.
self-administered or interviewer administered. A physical activity score can be a simple ordinal number, with higher numbers reflecting greater levels of activity, or a volume score computed by multiplying the frequency in sessions per week (or month), minutes per session, and intensity of the activity recalled. The intensity often is expressed as METs. The "Compendium of Physical Activities: Classification of Energy Costs of Human Physical Activities" ${ }^{34}$ was published in 1993, with updates in 2000 and 2011..$^{75,76}$ This publication provides a comprehensive list of physical activity MET values for use in scoring physical activity questionnaires. Once a MET value is obtained for a physical activity performed, an activity score can be computed. An example of a short recall physical activity questionnaire is the International Physical Activity Questionnaire. ${ }^{52}$

## Quantitative History Physical Activity Questionnaires

Quantitative history physical activity questionnaires are detailed surveys often performed over the past month or year
or over a lifetime. The questionnaires may contain 20 to 60 detailed questions and are usually interviewer administered. Quantitative history questionnaires generally are used in epidemiological studies to understand what types and intensities of physical activity contribute to mortality, as well as to examine various types of morbidities and health-enhancing behaviors. ${ }^{77-79}$ The value of using the quantitative history approach is its ability to obtain an estimate of one's physical activity volume during periods in the past that may be relevant to one's current health status. One example commonly used is the Bone Loading History Questionnaire, ${ }^{80}$ which is a recall of physical activities performed at various ages from childhood to the past year for determination of hip and spine weightbearing and bone-loading activities.

## Physical Activity Diaries/Logs

Diaries are often used to obtain a detailed hour-by-hour or activity-by-activity record of one's physical activity and sedentary behaviors. Researchers use diaries to evaluate the
psychometric properties of physical activity questionnaires and as an adjunct to objective monitoring. Diaries are completed by the user and can be in the form of a paper-andpencil booklet ${ }^{81}$ or a cell phone programmed to remind the user to enter information about current activities or activities performed in the past 1 to 4 hours. ${ }^{82}$ The type of information recorded varies but generally includes the time an activity started and stopped, a rating of intensity, and the mode/type of activity. The diaries can be scored by use of the "Compendium of Physical Activities." ${ }^{375}$ Physical activity diaries can also be used as part of an ecological momentary assessment ${ }^{83,84}$ to better understand social and physical contextual information. Such data are able to record significant features of the immediate situation and to examine how that situation affects physical activity behavior in that particular setting and moment in time. ${ }^{85}$

The Bouchard Physical Activity Record is a well-known physical activity log that has users identify 1 of 9 types of movement behaviors performed every 15 minutes. ${ }^{86}$ The activities are rated on a 1 to 9 scale that corresponds to a range of 1.0 to 7.8 METs. To score the log, the numbers are summed and multiplied by the assigned MET values, and estimations of energy expenditure per day ( $\mathrm{kcal} / \mathrm{kg}$ of body weight) can be derived. An example of another $\log$ is that of Ainsworth and colleagues, ${ }^{87}$ who developed and implemented a 7-page log (1 page for each day) that contained 48 items ( 7 resting/light intensity [ $<3.0 \mathrm{METs}$ ], 25 moderate intensity [3-6 METs], and 16 vigorous intensity [ $>6 \mathrm{METs}$ ]), organized by different physical activity domains.

Objective Methods of Assessing Physical Activity There are numerous methods available to objectively assess physical activity. For the purpose of this scientific statement, objective methods will be separated into the following categories: measures of energy expenditure, physiological measures, motion sensors, and assessment methods that combine more than one type of sensor.

## Measures of Energy Expenditure

## Indirect Calorimetry

Measuring energy expenditure by indirect calorimetry entails measurement of the ventilatory volume and the amounts of oxygen consumed and carbon dioxide produced. It is considered the reference, or criterion, method for measuring energy expenditure under controlled conditions (ie, in a laboratory).

The most commonly used form of indirect calorimetry employs an open-circuit system in which a person breathes either room air or a mixture of gases of known concentration and the expired amounts of oxygen and carbon dioxide are analyzed. Different types of open systems are available, including whole-body room calorimeters and computerized metabolic cart systems. Detailed reviews of the theory and assumptions underlying these methods are available elsewhere. ${ }^{88-90}$

## The Doubly Labeled Water Method

The doubly labeled water (DLW) method measures total energy expenditure in free-living individuals over a period of 1 to 3 weeks. The method was first used in humans in the early $1980 \mathrm{~s}^{91-93}$ and has contributed significantly to our
understanding of human energy expenditure. When combined with measurements of resting energy expenditure and the thermic effect of food, the DLW method can be used to calculate PAEE.

The basic principle of the DLW method relies on the difference in elimination rates between 2 stable isotopes, oxy-gen-18 $\left({ }^{18} \mathrm{O}\right)$ and deuterium ( $\left.{ }^{2} \mathrm{H}\right)$. Known quantities of these stable (nonradioactive) and completely safe isotopes are ingested as water. The isotopes are distributed in the body water pool, and labeled deuterium is eliminated from the body as water, whereas the labeled oxygen isotope $\left({ }^{18} \mathrm{O}\right)$ is eliminated as both water and carbon dioxide. Thus, the difference in elimination rate between these isotopes represents the carbon dioxide production over the measurement time. From the isotope disappearance curves, 4 parameters are deduced: the 2 pool sizes of ${ }^{2} \mathrm{H}$ and ${ }^{18} \mathrm{O}$ and the fractional rate constants of elimination for each of these isotopes. These variables are thereafter used to estimate carbon dioxide production over the measurement time. Detailed reviews of this method are available elsewhere. ${ }^{91-97}$

## Direct Observation

Direct observation entails a trained observer watching or video recording an individual who is partaking in physical activities to monitor and record them. ${ }^{98}$ This method of assessment can be used to generate important contextual information, and it thus permits an evaluation of the mode/type of physical activity, as well as when, where, and with whom it occurs. As a method of assessing physical activity, direct observation is more commonly used with children than with adults. ${ }^{99}$ Detailed overviews of the instrumentation available for direct observation can be found elsewhere. ${ }^{98,100}$ Common to most observational approaches is the use of small time intervals and a coded score of movement intensity, activity type or domain, $G A$ and the location in which the activity occurred.

## Physiological Measures

## Heart Rate Monitoring

The practicality and feasibility of this objective method for assessing physical activity have increased significantly with the development of small wrist-worn heart rate monitor receivers that are able to accept signals wirelessly from electrodes secured to a chest strap and to store data at high resolution for days. The principle underlying the use of heart rate as a measure of physical activity derives from the physiological connection that makes alterations in heart rate indicative of cardiorespiratory stress during movement of any sort, and thus during physical activity and exercise. Assessment of physical activity by use of heart rate is problematic at low-intensity levels of activity, because heart rate is also influenced by factors that cause sympathetic reactivity (eg, caffeine consumption, emotional state, temperature). Heart rate does, however, increase linearly and proportionately with the intensity of movement during moderate- to vigorous-intensity aerobic activity. ${ }^{101}$ However, one confounder is that activities that involve the use of upper-extremity musculature result in a higher heart rate response per given rate of total energy expenditure than activities performed primarily with the legs. Additionally, the heart rate response to changes in physical
activity is not immediately reflective of the energy demands. With both the onset of activity and the cessation of activity, there is a lag period. Therefore, heart rate may miss sporadic activity or overestimate the time spent in different intensities of activity during recovery. Measures of physical activity derived from heart rate monitoring are typically time spent in physical activities at different intensity levels (eg, moderate and vigorous intensity) and PAEE. The accuracy of estimating outcomes indicative of physical activity from heart rate monitoring is improved by calibrating an individual's heart rate and energy expenditure response (via oxygen consumption measurement) to different levels of activity, thus accounting for variation across individual heart rate response. ${ }^{101-104} \mathrm{To}$ overcome the necessity for individual calibration to estimate energy expenditure from heart rate monitoring, generalized approaches have been developed. One such approach is the use of estimates of energy expenditure from heart rate by use of multivariate predictive equations derived from group data in adults. ${ }^{101,105-107}$ Group-level analysis has been found to be satisfactory for some population groups. ${ }^{108}$

## Motion Sensors

Wearable devices that measure body motion can be used to assess physical activity and estimate energy expenditure. The most commonly used sensors for these purposes are accelerometers, which measure acceleration and movement,
and pedometers, which measure steps and can estimate distance walked. Both devices are popular tools for objective assessment of specific aspects of physical activity behavior. Tables 5 through 7 provide an overview of commonly used accelerometers, pedometers, and multiunit sensing devices, coupled with characteristics of each unit (eg, cost, memory, and recording time) and key references that provide validity information to help inform choice when considering motion sensors as a physical activity assessment tool.

## Accelerometers

Accelerometer sensors used to estimate physical activity provide a measure of accelerations of the body during movement and have the advantage of capturing frequency, duration, and intensity of physical movement in a time-stamped manner. Acceleration is measured in either 1 plane (usually vertical), 2 planes (vertical and mediolateral or vertical and anterior-posterior), or 3 planes (vertical, mediolateral, and anterior-posterior). ${ }^{209}$ The device is enclosed in a case and then attached to the body (either at the hip, ankle, wrist, or lower back), typically by a strap. Recent advances in microelectromechanical technology have reduced the cost and size of accelerometers significantly. Many accelerometers are now able to record high-resolution data, as well as store data for several weeks.

The use of accelerometers has increased dramatically in recent years, and this will likely continue with new

Table 5. Available Objective Methods to Assess Physical Activity: Accelerometers

|  | Actical | ActiGraph | ActivPAL | GENEActiv | Lifecorder Plus | RT3 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Size | $29 \times 37 \times 11 \mathrm{~mm}$ | $4.6 \times 3.3 \times 1.5 \mathrm{~cm}$ | $53 \times 35 \times 7 \mathrm{~mm}$ | $43 \times 40 \times 13 \mathrm{~mm}$ | $7.25 \times 4.2 \times 1.8 \mathrm{~cm}$ | $7.1 \times 5.3 \times 2.8 \mathrm{~cm}$ |
| Weight, g | 16 |  | 15 |  | 48 | 65 |
| Battery | CR2025 lithium | Rechargeable lithium | Rechargeable lithium | Rechargeable lithium | CR2032 lithium | AAA battery |
| Memory | 32 MB | - 512 MB | 16 MB | 500 MB | 28 kB | N/A |
| Recording time | Raw: 12 d; 1 s Steps: 194 d | Raw: 40 d at 30 Hz |  | $\begin{gathered} 45 \mathrm{~d} \text { at } 10 \mathrm{~Hz}, 7 \mathrm{~d} \text { at } \\ 100 \mathrm{~Hz} \end{gathered}$ | 7-d LCD display; 60-d internal memory | 3 h to 21 d |
| Modes for sampling | Raw + steps; 1, 2, 5, $15,30,60 \mathrm{~s}$ (counts) epochs | Raw acceleration | Raw acceleration | Raw acceleration | Steps, intensity 1 (low) to 9 (high), proprietary algorithm from raw acceleration | Counts |
| Interface | USB | USB | USB | USB | USB | USB with docking unit |
| Number of axes | Omnidirectional | Triaxial | Uniaxial | Triaxial | Uniaxial | Triaxial |
| Placement | Hip, wrist, ankle | Hip, wrist, ankle | Thigh | Wrist, ankle, hip, thigh, | Hip | Hip |
| Outcome measures | Physical activity energy expenditure, steps | Energy expenditure, steps, physical activity intensity, body position | Sitting/lying, standing time, steps, step rate, number of posture changes, MET hours, physical activity level | Physical activity, activity type, posture | Steps, moderate to vigorous physical activity, total energy expenditure | Energy expenditure, METs, activity counts |
| Software for data processing | Respironics Actiware 5 | Actilife 6 | activPAL 5.8 | GENEActivPC Software | Physical activity analysis software | RT3 Assist Software |
| Web site | http://www.philips. com/actical | http://www. theactigraph.com | http://www. paltechnologies.com | http://www.geneactiv. co.uk/ | http://www.suzukenkenz.com | http://www. stayhealthy.com |
| Cost | Monitor \$450; \$950 for monitor device, reader, and software | Monitor \$249; \$1249 <br> for monitor device, belt, and software | Monitor \$616; \$1386 for monitor device, software, and docking station | \$270 | \$129.95 | \$300 (Monitor currently being upgraded) |
| Key references | 109-118 | 19, 110, 119-146 | 147-158 | 159-162 | 163-172 | 110, 173-183 |

Accelerometers listed represent commonly used devices; this does not represent an exhaustive list.
LCD indicates liquid crystal display; MET, metabolic equivalent; N/A, information not readily available; and USB, universal serial bus.

Table 6. Available Objective Methods to Assess Physical Activity: Pedometers

|  | StepWatch | Omron (HJ-720ITC)* | New Lifestyles (NL-2000i)* | Yamax (CW 700)* |
| :---: | :---: | :---: | :---: | :---: |
| Size | $75 \times 50 \times 20 \mathrm{~mm}$ | $53 \times 15 \times 74 \mathrm{~mm}$ | $5.7 \times 1.9 \times 4.4 \mathrm{~cm}$ | $5.1 \times 1.9 \times 3.8 \mathrm{~cm}$ |
| Weight, g | 38 | 32 | 14 | 36 |
| Battery | Lithium | CR2032 | CR-20 | CR-2032 |
| Recording time | 2 mo | 41 d | 7-14 d | 7-14 d |
| Sensor | Accelerometer | Accelerometer | Accelerometer | Spring/lever |
| Placement | Ankle | Hip, pocket, chest | Hip | Hip |
| Outcome measures | Steps, gait parameters | Steps, aerobic steps, energy expenditure, distance | Steps, distance, energy expenditure | Steps, activity time, distance, energy expenditure |
| Connectivity | PC | PC/USB | None | None |
| Web site | http://www. orthocareinnovations.com/ | http://www.omronhealthcare. com | http://www.new-lifestyles.com | http://www.yamaxx.com |
| Cost | \$2000 | \$59 | \$70 | \$24 |
| Key references | 158, 184-188 | 163-165, 189-194 | 163-165, 194, 195 | 163-165, 183, 193-196 |

Pedometers listed represent commonly used devices; this does not represent an exhaustive list. Before selecting any pedometer for use, it is recommended to test the model. Walk at a slow, moderate, and fast pace and count steps over a 100- to 200-m course and compare pedometer steps to counted steps.

PC indicates personal computer; and USB, universal serial bus.
*There are numerous models available per manufacturer. Check the specifications for each model and select a model that provides the type of data needed. The price increases with more options.
applications such as the insertion of accelerometers into smart phones and other commonly used devices. Some of the most frequently used models that are available commercially are described in Tables 5 through 7. There are differences between and sometimes within accelerometer models, which have been reported elsewhere. ${ }^{109,119,173,210,211}$ The detailed technical specifications of accelerometers have also been described by Chen and Bassett. ${ }^{209}$

Accelerometer Data Transformation. The main data outcome from accelerometers is a recording of body acceleration and deceleration. This measurement, which is often referred to as raw accelerometer data, is typically recorded in units of acceleration due to gravity $(g)$ and expressed as acceleration in meters per second squared. This is then further transformed into other units. The most common unit of measure for accelerometers is the count, which can be

Table 7. Available Objective Methods to Assess Physical Activity: Multisensing Tools

| SenseWear |  | IDEEA | Actiheart |
| :---: | :---: | :---: | :---: |
| Size | 1-42\% $88 \times 56 \times 24 \mathrm{~mm}$ A |  | $32 \times 6 \mathrm{~mm}$ |
|  | Sensors: $1.8 \times 1.5 \times 3 \mathrm{~mm}$ |  |  |
| Weight, g | 82.2 | Recorder: 59 Sensor: 2 | 10 |
| Battery | Lithium polymer | AA battery | Rechargeable lithium |
| Memory |  | 200 MB | 512 kB |
| Recording time, d | 28 | 8 | 21 |
| Modes for sampling | Raw signals | Raw acceleration | Raw acceleration |
| Interface | USB | USB | USB |
| Number of axes | Triaxial | Biaxial | Uniaxial |
| Sensors | Triaxial accelerometer, galvanic skin temperature and response, heat flux sensing | 5 Biaxial accelerometers, hip-worn receiver | Uniaxial accelerometer and heart rate sensing |
| Placement | Upper arm | Chest, thigh, and feet simultaneously | Chest |
| Outcome measures | Energy expenditure; moderate- to vigorous-intensity time, steps, METs | Activity type, energy expenditure P | Physical activity energy expenditure, moderate- to vigorous-intensity time |
| Software for data processing | Online activity manager | Commercial software available from manufacturer | Commercial software available from manufacturer |
| Web site | http://sensewear.bodymedia.com | http://www.minisun.com/ h | http://www.camntech.com/products/ actiheart/actiheart-overview |
| Cost | \$149 or \$198 with display | \$4000 | \$1600 |
| Key references | 142, 197-202 | 203-205 | 206-208 |

Multisensing monitors listed represent commonly used devices; this does not represent an exhaustive list.
IDEEA indicates Intelligent Device for Energy Expenditure and Activity; MET, metabolic equivalent; and USB, universal serial bus.
expressed in different ways: counts per second, counts per minute, or summed as total counts per day. An accelerometer count is a derived unit or score that is largely dependent on the individual accelerometer, because the onboard functions of different accelerometers process the raw accelerometer data differently.

Accelerometer Data Converted to Meaningful Physical Activity Outcomes. For assessment of physical activity, accelerometers must be calibrated to translate monitor signals into energy expenditure units (ie, kilocalories or METs) or activity intensity categories. This operation results in either prediction equations or count thresholds that delineate a particular intensity of activity. The advantage of this approach is the ability to convert accelerometer values into physical activity outcomes such as kilocalories per week, METs per hour, or METS per minute, or how much time an individual spends in moderate- or vigorous-intensity physical activity. This latter outcome can be used to determine what percentage of a given population is meeting recommended physical activity guidelines. The different approaches to developing prediction equations or intensity count cut points from accelerometers have varied greatly within the literature, ${ }^{120-124}$ and these prediction equations are also sensor placement-site specific. Furthermore, equations derived from selected activities tend to be good at estimating those same activities. A detailed summary and analysis of many reported accelerometer prediction equations was reported by Lyden et al. ${ }^{110}$ It is paramount to understand that there is substantial variability in the prediction equations that have been developed (for instance, moderate-intensity activity ranges begin at points that range from $\approx 200$ to $>2000$ counts $/ \mathrm{min}$, depending on the reference source). An end user must critically examine how a prediction equation was derived, including the individuals and specific activities involved, and must understand the limitations of its use. For further discussion on this topic, see Matthew ${ }^{123}$ and Welk. ${ }^{212}$

The accelerometer signal is typically collected continuously over time, and with older processing techniques (eg, simple regression using counts), a substantial amount of accelerometer signal feature information is not used. ${ }^{125-127,213}$ Several groups ${ }^{128-130,159,214,215}$ have investigated how to extract and use more of the accelerometer signal using machinelearning algorithms to process data. These analyses provide detailed information about overall physical activity behavior, including time spent in different intensities of physical activity and activity type.

## Pedometers

The pedometer is typically a belt- or waistband-worn motion sensor that records movement during regular gait cycles. ${ }^{216}$ The outcome measure of movement is steps taken, so the pedometer is a device that is designed to measure walking behavior.

There are many commercially available pedometer models, and these are able to be categorized by features available. For instance, simple pedometers are largely able to quantify steps and estimate distance, whereas newer enhanced pedometers have a built-in time clock, memory function, and features to estimate time spent in different intensity
classifications, and some are able to upload data directly to a computer (Tables 5-7). The models available differ substantially in cost and accuracy and also vary by internal mechanism. Pedometers tend to have 1 of 3 commonly used internal mechanisms, either a spring-suspended lever arm, a horizontal beam, or a piezoelectric crystal. ${ }^{216}$ Several excellent studies exist that have performed comprehensive evaluations and comparisons of commercially available pedometers. ${ }^{163,164,196}$ In one study, Crouter et al ${ }^{163}$ examined the accuracy and precision of 10 pedometers in estimating steps, distance, and energy expenditure. Adult subjects walked on a treadmill at 5 different walking speeds while steps were observed and energy expenditure was measured via indirect calorimetry. These criterion data were compared with data displayed on the 10 pedometers. At the slowest walking speed ( $54 \mathrm{~m} / \mathrm{min}$ ), most pedometers underestimated steps. Above $80 \mathrm{~m} / \mathrm{min}$, observed steps and pedometer-measured steps were virtually identical for 6 models. Distance estimates were less accurate, and energy expenditure tended to be overestimated, which is a common finding from other investigations. ${ }^{165,216-218}$ Validation of step measurement has also been performed for overground walking (self-paced walking averaging $96.5 \mathrm{~m} / \mathrm{min}$ ), and for 3 of the most accurate models, the difference between observed steps and pedometer-measured steps was within $3 \%$. ${ }^{165}$

The piezoelectric pedometer is perhaps the most sensitive of the 3 types, and it is recommended for those who walk at slower paces. ${ }^{219}$ It has also been shown to be accurate across individuals of various body weights and waist circumferences. ${ }^{195}$ A newer direction for the use of pedometers is to assess the number of steps per minute that an individual performs. Some enhanced pedometers have built-in functions that attempt to distinguish between physical activity intensity levels, such as by distinguishing aerobic steps (walking $>60$ steps/min and walking for $>10$ minutes continuously) from nonaerobic steps (all other accumulated steps plus aerobic steps). Validation research specifically focusing on such enhanced features is currently lacking, although some investigations have begun to evaluate steps-per-minute thresholds and their comparability with physical activity intensity categories, with a threshold of 100 steps $/ \mathrm{min}$, for instance, equated with moderate-intensity physical activity. ${ }^{220-222}$ The use of pedometers to not only assess physical activity but also motivate behavior change through enhanced and wireless features is an exciting area of research and application as more products become available.

## Multisensing Assessment Methods

There are a few objective assessment devices that have combined multiple measurement parameters. Investigations have been performed to determine whether the validity of physical activity assessment could be improved by combining heart rate with other assessment techniques. For instance, the improved accuracy in predicting energy expenditure by combining individually calibrated heart rate monitoring with an accelerometer, compared with using either method separately, was first shown by Avons et al ${ }^{223}$ and refined by Haskell et al. ${ }^{224}$ Various analytical approaches have been used to combine heart rate monitoring and accelerometer measures: (1) The use of accelerometer data to differentiate between active


Note: 1=Physical activity questionnaires; 2=Physical activity logs/diaries; 3=Heart Rate Monitoring; 4=Pedometers; 5=Accelerometer; 6=Multi-unit Sensors; 7=Doubly Labeled Water
Figure 2. Decision matrix guide to selecting a physical activity (PA) measurement instrument.
and inactive periods of the day ${ }^{225,226}$; (2) the use of acceleration data at low and moderate levels of intensity and heart rate data at higher intensity levels ${ }^{227}$; and (3) differentiation between upper- and lower-body movement with the use of
multiple accelerometers. ${ }^{224,228-230}$ Branched equation modeling approaches have also been developed, and their validity was assessed during various activities in adults in the laboratory and against the DLW method in free-living adults. ${ }^{231,232}$

The results from the latter suggest that there is no mean bias between PAEE measured from combined heart rate and movement sensing and PAEE determined by the DLW method.

Another multisensing device uses 5 accelerometers that are secured to the chest, both thighs, and the bottom of the feet. This device time stamps physical activity and energy expenditure data and was the first commercially available device to use machine-learning algorithms to identify activity types ${ }^{203}$ and estimate energy expenditure. ${ }^{204}$ Other recent developments include prototype multisensor boards that combine a triaxial accelerometer and sensors to assess barometric pressure, humidity, temperature, light, and global positioning. These devices apply a trained naïve Bayes classifier to identify
activity type and estimate energy expenditure. ${ }^{215}$ Some commercially available devices have combined a biaxial accelerometer with sensors to assess heart rate, heat flux, and galvanic skin response. ${ }^{197}$ Validation work with such devices is promising. ${ }^{197,203,204,215}$

## Selecting a Physical Activity Assessment Method: A Decision Matrix

Because there are many choices available to assess physical activity, selecting a physical activity assessment method can be a challenging proposition. To guide the selection, a decision matrix was developed to provide a systematic approach to

Table 8. Strengths and Limitations to Objective and Subjective Methodologies

| Characteristics | Questionnaire | Diaries/Logs | Observation | Indirect Calorimetry | DLW | HR | Accelerometer | Pedometer | Multisensing Units |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Strengths | - Low cost <br> - Low burden <br> - Convenient/ easy <br> - Applicable to large numbers of individuals <br> - Single time point assessment <br> - Valid to assess structured physical activity <br> - Can <br> successfully rank into high/low categories <br> - Can assess different dimensions and domains | - Low cost <br> - Detailed information on dimension and domains <br> - Not subjected to memory or recall as much as other subjective methods <br> - Provides a good subjective measure of physical activity and energy expenditure | - No recall necessary <br> - Provides excellent contextual information <br> - Provides detailed information on dimensions and domains | - Highly accurate and reliable measure of physical activity and energy expenditure <br> - Suitable criterion measure of physical activity and energy expenditure | - "Gold standard" measure for total daily energy expenditure in free-living individuals <br> - Low burden to patients or participants | - Low burden for short periods <br> - Relatively inexpensive <br> - Relationships strong with moderate to vigorous intensity | - Concurrent measure of movement <br> - Provides detailed intensity, frequency, and duration data <br> - Can store data for weeks at a time <br> - Low burden <br> - Relatively inexpensive | - Low cost <br> - Low burden <br> - Easy data processing <br> - Applicable to large numbers of individuals <br> - Can also be used to motivate people | - Accuracy improved compared with single sensing assessments |
| Weaknesses | - Recall and social desirability bias can occur <br> - Needs to be population and culture specific <br> - Low validity for assessing incidental or lifestyle physical activity | - Very high burden on patients and participants <br> - Complex and time-consuming data reduction and analysis <br> - Similar to questionnaires, they should be population and culture specific | - High burden on the observer <br> - Training essential to successfully administer this technique <br> - Can alter individual behavior of the one being assessed | - Expensive <br> - High degree of technical expertise required <br> - Short time assessment only permissible | - Expensive <br> - Technical equipment and trained personnel required <br> - Measures of resting metabolic rate and thermic effect of food required to derive PAEE <br> - Unable to discern dimensions or domains | - Affected by nonactivity stimuli (emotion, medication, caffeine) <br> - Weak relationship at low end of intensity realm <br> - Subject to interference with signal | - Cannot <br> account for all activities, such as cycling, stair use, or activities that require lifting a load <br> - Upper-body activities neglected with hip or lower-back wear <br> - Data reduction, transformation, and processing take time | - Simple pedometers cannot measure intensity/ duration <br> - Cannot measure mode/type <br> - Not accurate for energy expenditure <br> - Depending on device, false steps can be recorded <br> - Some brands require user to write steps down | - Higher cost <br> - Increased burden of wear for some devices <br> - Depending on device, technical expertise is essential |

[^2]evaluating the different methods with consideration of a wide range of factors (Figure 2).

At each step of the decision matrix, a list of the method types that provide the desired outcomes is given. The selection process starts with identifying the specific outcome measure(s) required by the user (for example, is the person meeting the physical activity guidelines for Americans?). This first decision requires the user to have a clear understanding of the dimensions of physical activity that need to be measured to capture the desired outcome. The second step involves making a decision about what exactly needs to be described, or in other words, how the data will be used and quantified to answer the question at hand. Certainly the specific outcomes desired and the level of accuracy required will vary in different settings (clinical, research, or public health). Several more decisions are necessary to differentiate between the different methods. The choice of the best method is influenced by the number of people to be assessed and the requirements of the patients/participants. Additionally, the choice of method involves decisions based on resource availability (expense of tools and personnel), processing requirements (time and equipment), and the need to provide immediate feedback to the patients/participants. To guide these decisions, the user will first refer to Table 8 to evaluate strengths and weaknesses of the different method types.

The decision matrix will assist users in selecting the best method type(s) to meet their needs. Users are then directed to refer back to Tables 4 through 7 to compare the characteristics and features of the different subjective and objective options. Finally, users can evaluate the practical considerations for
different options by using Table 9 to narrow the choice ideally to one preferred method.

The following scenario was developed to provide an example of using the decision matrix guide to select a physical activity measurement method in one particular clinical setting. The same decision-making process can be used to select the best measurement tool for different settings as well, such as public health surveillance or physical activity behavioral change programs.

## Scenario: Screening Adults, in a Clinical Practice Setting, for Assessment of Health Risks Associated With Insufficient Physical Activity

A group of physicians in an internal medicine clinic is well aware of the health benefits of leading a physically active lifestyle and has adopted the 2020 American Heart Association Impact Goals for ideal cardiovascular health of the clinic's patients. ${ }^{10}$ In concert with these goals, the clinicians understand they need to assess the current physical activity levels of their patients. The physicians will use this information to identify patients who are not achieving sufficient levels of physical activity to maintain good health (ie, are at risk for coronary and metabolic diseases). For those identified as at risk, they will provide recommendations to increase their physical activity level. The clinicians value a method that can be implemented as part of a regular office visit, can be performed quickly within just a few minutes, and can be accomplished with limited resources.

Table 9. Practical Considerations for Use

| Questionnaire | Diaries/Logs Observation | Indirect Calorimetry | DLW | HR | Accelerometer | Pedometer | Multisensing Units |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| - What are the primary outcomes of the questionnaire? Do these match the desired information needed? <br> - How will the questionnaire be administered (face to face, telephone, by mail)? <br> - What is the time frame of the questionnaire (24 | - Clear - If more <br> instructions than one <br> are essential observer is <br> - Mechanisms used, need <br> to promote to train and <br> compliance establish <br> need to be interrater <br> considered, and <br> such as intrarater <br> prompts reliability <br> - Considerable  <br> time and  <br> effort are  <br> needed to  <br> reduce,  <br> clean, and  <br> analyze data  | - Systems require extensive calibration to ensure data integrity <br> - Portable systems are available and can measure for a few hours, but they are burdensome and can impact activities undertaken by patients or participants | Reliant on technical experts <br> - Reliant on measures of RMR and estimations of the TEF <br> - Patients required to collect urine samples | - Patients/ <br> participants may have sensitive skin <br> - Calibration requires technical expertise <br> - If individual calibration is used, may need prior physician consent | - Recommend 7 d of monitoring to obtain habitual physical activity profile <br> - Positioning of the monitor is paramount and needs to conform to the calibration study characteristics <br> - Record data in the highest resolution possible | - Similar to accelerometers, may need 7 d to assess <br> - Careful consideration to validity needed; cheaper brands prone to error <br> - If pedometer readings can be seen, likely to increase reactivity | - Need to wear for a number of days to obtain a physical activity profile |

hours, past week, month, year)?

- Is the questionnaire specific to the population under study?
- Is there any validity and reliability evidence to support use?
- How will data be reduced, cleaned, and analyzed?

Use of the decision matrix in this scenario would proceed as follows:

Steps 1 and 2: What is the primary outcome desired? What needs to be described?

- Outcome needed: determining whether the patient is meeting the criteria of the physical activity guidelines $(\geq 150$ $\mathrm{min} / \mathrm{wk}$ of moderate-intensity or $\geq 75 \mathrm{~min} / \mathrm{wk}$ of vigor-ous-intensity aerobic physical activity, or an equivalent combination of moderate- and vigorous-intensity aerobic activity). Thus, the following dimensions of physical activity need to be assessed: intensity, duration, and frequency.

The decision matrix lists the following physical activity assessment methods as possibilities:

- Questionnaires, logs/diaries, heart rate monitors, accelerometers, or multiunit sensors

Steps 3, 4, and 5: How many patients will be assessed? What are the cost considerations? What can be expected of the patient?

- Number of patients: A conservative estimate is 20 patients per day for each physician within the clinic (ie, a "high" number).
- Cost considerations: The clinic has limited resources; thus, the method chosen needs to be inexpensive. At present, reimbursement for this measurement is not common, so no additional resources are expected.
- Patient burden: The clinicians expect the patient to be able to perform the assessment as part of the office check-in time at their regularly scheduled appointment. The method thus needs to take $<5$ minutes.

The decision matrix lists the following physical activity assessment method as a possibility:

Table 4, that can produce the desired outcome (to meet physical activity guidelines) and can be completed by the patient in the office setting in a short period of time. For this purpose, a global questionnaire designed to discern physical activity guideline compliance would be ideal. Two questionnaires meet these criteria: the Exercise Vital Sign ${ }^{26}$ and the Activity Vital Sign. ${ }^{39}$ The clinicians should then evaluate these 2 options with respect to their strengths and weaknesses (Table 8) and the practical considerations for their use (Table 9). In this scenario, the major factors driving the decision were the feasibility and resource issues involved in collecting data with very limited resources on a large number of patients in a short period of time. This led to the clear choice of using a simple, inexpensive questionnaire method over the other 4 methods listed after steps 1 and 2 that would also produce the desired outcome. After reviewing the key references pertinent to these 2 measurement options, the clinicians are satisfied that their choice will suffice as a screening tool to identify patients who are insufficiently active.

The selection of the physical activity assessment method in this scenario was determined by the factors involved for this group of clinicians. However, if any of the factors were different, such as if more time or resources were available or if a method with a higher level of accuracy was desired, the decision reached would be different. For example, if time for completion was increased from 2 to 3 minutes to $\approx 10$ minutes, one option that could be considered would be to use one of the short recall methods listed in Table 4 that also produce the desired outcome of deducing compliance with physical activity recommendations. Alternatively, if greater accuracy was required, greater resources were available, and the information was not needed the same day, then the clinicians could decide to use an objective accelerometer device, which is likewise able to produce the desired outcome of assessing compliance with national physical activity recommendations.

- Questionnaires

Steps 6, 7, and 8: What are the clinic personnel requirements? How complex and time consuming is the data processing? When are the data needed?

- Personnel needed: Because no additional resources are expected, the assessment must be performed by existing staff within the clinic.
- Data processing requirements: The data processing requirements must be simple so that the assessment results can be calculated easily by existing personnel.
- Timeliness of results: The clinicians desire to have this information available when they meet with the patient on the same day to allow for counseling, as needed, to increase physical activity levels.

The decision matrix lists the following physical activity assessment method as a possibility:

## - Questionnaires

In this scenario, after working through steps 1 to 9 of the decision matrix, it appears the best choice for physical activity assessment would be to use a questionnaire method. The clinicians would then review the options available, as shown in

In summary, the decision matrix provides a systematic approach to guide the selection of physical activity assessment methods. Setting-specific requirements are used at each step in the process to differentiate between assessment types.

## Summary

The deleterious health consequences of physical inactivity are vast, and they are of paramount clinical and research importance. Risk identification, benchmarks, efficacy, and evaluation of physical activity behavior change initiatives for clinicians and researchers all require a clear understanding of how to assess physical activity.

In the present report, we have provided a clear rationale for the importance of assessing physical activity levels, and we have documented key concepts in understanding the different dimensions, domains, and terminology associated with physical activity measurement. The assessment methods presented allow for a greater understanding of the vast number of options available to clinicians and researchers when trying to assess physical activity levels in their patients or participants.

The primary outcome desired is the main determining factor in the choice of physical activity assessment method. In combination with issues of feasibility/practicality, the availability of resources, and administration considerations, the
desired outcome guides the choice of an appropriate assessment tool. The decision matrix, along with the accompanying tables, provides a mechanism for this selection that takes all of these factors into account. Clearly, the assessment method adopted and implemented will vary depending on circumstances, because there is no single best instrument appropriate for every situation.

In summary, physical activity assessment should be considered a vital health measure that is tracked regularly over time.

All other major modifiable cardiovascular risk factors (diabetes mellitus, hypertension, hypercholesterolemia, obesity, and smoking) are assessed routinely. Physical activity status should also be assessed regularly. Multiple physical activity assessment methods provide reasonably accurate outcome measures, with choices dependent on setting-specific resources and constraints. The present scientific statement provides a guide to allow professionals to make a goal-specific selection of a meaningful physical activity assessment method.

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## Writing Group Disclosures

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| Ann M. Swartz | University of WisconsinMilwaukee | None | None | None | None | None | None | None |
| Derek T. Smith | University of Wyoming | None | None | None | None | President and founder of HealtheBridge LLC, a Webbased software development company (unpaid) $\dagger$ | None | None |

This table represents the relationships of writing group members that may be perceived as actual or reasonably perceived conflicts of interest as reported on the Disclosure Questionnaire, which all members of the writing group are required to complete and submit. A relationship is considered to be "significant" if (1) the person receives $\$ 10000$ or more during any 12 -month period, or $5 \%$ or more of the person's gross income; or (2) the person owns $5 \%$ or more of the voting stock or share of the entity, or owns $\$ 10000$ or more of the fair market value of the entity. A relationship is considered to be "modest" if it is less than "significant" under the preceding definition.
*Modest.
$\dagger$ Significant.

## Reviewer Disclosures

| Reviewer | Employment | Research Grant | Other Research Support | Speakers' Bureau/ Honoraria | Expert Witness | Ownership Interest | Consultant/ Advisory Board | Other |
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| David Bassett | University of Tennessee | $\mathrm{NIH} \dagger$ | None | Physical Activity and Public Health Course (CDCfunded course)* | None | None | None | None |
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*Modest.
$\dagger$ Significant.

## References

1. Heady JA, Morris JN, Kagan A, Raffle PA. Coronary heart disease in London busmen: a progress report with particular reference to physique. Br J Prev Soc Med. 1961;15:143-153.
2. Morris JN, Heady JA, Raffle PA, Roberts CG, Parks JW. Coronary heartdisease and physical activity of work. Lancet. 1953;265:1111-1120.
3. US Department of Health and Human Services. Physical Activity and Health: A Report of the Surgeon General. Atlanta, GA: US Department of Health and Human Services, Centers for Disease Control and Prevention, National Center for Chronic Disease Prevention and Health Promotion; 1996.
4. Fletcher GF, Balady G, Blair SN, Blumenthal J, Caspersen C, Chaitman B, Epstein S, Froelicher ES, Froelicher VF, Pina IL, Pollock ML. Statement on exercise: benefits and recommendations for physical activity programs for all Americans: a statement for health professionals by the Committee on Exercise and Cardiac Rehabilitation of the Council on Clinical Cardiology, American Heart Association. Circulation. 1996;94:857-862.
5. Lee IM, Shiroma EJ, Lobelo F, Puska P, Blair SN, Katzmarzyk PT; Lancet Physical Activity Series Working Group. Effect of physical inactivity on major non-communicable diseases worldwide: an analysis of burden of disease and life expectancy. Lancet. 2012;380:219-229.
6. US Department of Health and Human Services. Physical Activity Guidelines Advisory Committee Report, 2008. Washington, DC: US Department of Health and Human Services; 2008. http://www.health.gov/ paguidelines/report/. Accessed February 14, 2013.
7. National Center for Chronic Disease Prevention and Health Promotion. Chronic Diseases: The Power to Prevent, the Call to Control: At a Glance, 2009. Atlanta, GA: Centers for Disease Control and Prevention; 2009. Report No. CS123157.
8. Chenoweth D, Leutzinger J. The economic cost of physical inactivity and excess weight gain in American adults. J Phys Act Health. 2006;3:148-163.
9. US Department of Health and Human Services. Healthy People Web site. http://www.healthypeople.gov. Accessed February 14, 2013.
10. Lloyd-Jones DM, Hong Y, Labarthe D, Mozaffarian D, Appel LJ, Van Horn L, Greenlund K, Daniels S, Nichol G, Tomaselli GF, Arnett DK, Fonarow GC, Ho PM, Lauer MS, Masoudi FA, Robertson RM, Roger V, Schwamm LH, Sorlie P, Yancy CW, Rosamond W; on behalf of the American Heart Association Strategic Planning Task Force and Statistics Committee. Defining and setting national goals for cardiovascular health promotion and disease reduction: the American Heart Association's Strategic Impact Goal through 2020 and beyond. Circulation. 2010;121:586-613.
11. Smith SC Jr, Collins A, Ferrari R, Holmes DR Jr, Logstrup S, McGhie DV, Ralston J, Sacco RL, Stam H, Taubert K, Wood DA, Zoghbi WA. Our time: a call to save preventable death from cardiovascular disease (heart disease and stroke). Circulation. 2012;126:2769-2775.
12. Pate RR, Pratt M, Blair SN, Haskell WL, Macera CA, Bouchard C, Buchner D, Ettinger W, Heath GW, King AC, Kriska A, Leon AS, Marcus BH, Morris J, Paffenbarger RS Jr, Patrick K, Pollock ML, Rippe JM, Sallis

J, Wilmore JH. Physical activity and public health: a recommendation from the Centers for Disease Control and Prevention and the American College of Sports Medicine. JAMA. 1995;273:402-407.
13. Haskell WL, Lee IM, Pate RR, Powell KE, Blair SN, Franklin BA, Macera CA, Heath GW,Thompson PD, BaumanA.Physical activity and public health: updated recommendation for adults from the American College of Sports Medicine and the American Heart Association. Circulation. 2007;116:1081-1093.
14. Nelson ME, Rejeski WJ, Blair SN, Duncan PW, Judge JO, King AC, Macera CA, Castaneda-Sceppa C. Physical activity and public health in older adults: recommendation from the American College of Sports Medicine and the American Heart Association. Circulation. 2007;116:1094-1105.
15. Schoenborn CA, Adams PE. Health behaviors of adults: United States, 2005-2007. Vital Health Stat 10. 2010;(245):1-132.
16. Centers for Disease Control and Prevention. US physical activity characteristics. 2013. http://www.cdc.gov/physicalactivity/data/index.html. Accessed February 14, 2013.
17. Troiano RP, Berrigan D, Dodd KW, Mâsse LC, Tilert T, McDowell M. Physical activity in the United States measured by accelerometer. Med Sci Sports Exerc. 2008;40:181-188.
18. Bowles HR. Measurement of active and sedentary behaviors: closing the gaps in self-report methods. J Phys Act Health. 2012;9:S1-S4.
19. Freedson P, Bowles HR, Troiano RP, Haskell W. Assessment of physical activity using wearable monitors: recommendations for monitor calibration and use in the field. Med Sci Sports Exerc. 2012;44(suppl 1):S1-S4.
20. Caspersen CJ, Powell KE, Christenson GM. Physical activity, exercise, and physical fitness: definitions and distinctions for health-related research. Public Health Rep. 1985;100:126-131.
21. Katch VL, McArdle WD, Katch FI. Energy expenditure during rest and physical activity. In: McArdle WD, Katch FI, Katch VL. Essentials of Exercise Physiology. 4th ed. Baltimore, MD: Lippincott Williams \& Wilkins; 2011:237-262.
22. Ainsworth BE, Richardson MT, Jacobs DR, Leon AS, Sternfeld B. Accuracy of recall of occupational physical activity by questionnaire. J Clin Epidemiol. 1999:219-227.
23. Jacobs DR Jr, Ainsworth BE, Hartman TJ, Leon AS. A simultaneous evaluation of 10 commonly used physical activity questionnaires. Med Sci Sports Exerc. 1993;25:81-91.
24. Strath SJ, Bassett DR Jr, Swartz AM. Comparison of the College Alumnus Questionnaire physical activity index with objective monitoring. Ann Epidemiol. 2004;14:409-415.
25. Wareham NJ, Rennie KL. The assessment of physical activity in individuals and populations: why try to be more precise about how physical activity is assessed? Int J Obes Relat Metab Disord. 1998;22(suppl 2):S30-S38.
26. Coleman KJ, Ngor E, Reynolds K, Quinn VP, Koebnick C, Young DR, Sternfeld B, Sallis RE. Initial validation of an exercise "vital sign" in electronic medical records. Med Sci Sports Exerc. 2012;44:2071-2076.
27. Cust AE, Smith BJ, Chau J, van der Ploeg HP, Friedenreich CM, Armstrong BK, Bauman A. Validity and repeatability of the EPIC physical activity
questionnaire: a validation study using accelerometers as an objective measure. Int J Behav Nutr Phys Act. 2008;5:33.
28. InterAct Consortium. Validity of a short questionnaire to assess physical activity in 10 European countries. Eur J Epidemiol. 2012;27:15-25.
29. Godin G, Shephard RJ. A simple method to assess exercise behavior in the community. Can J Appl Sci. 1985;10:141-146.
30. Godin G, Jobin J, Bouillon J. Assessment of leisure time exercise behavior by self-report: a concurrent validity study. Can J Publ Health. 1986;77:359-362.
31. Gionet NJ, Godin G. Self-reported exercise behavior of employees: a validity study. J Occup Med. 1989;31:969-973.
32. Miller DJ, Freedson PS, Kline GM. Comparison of activity levels using the Caltrac accelerometer and five questionnaires. Med Sci Sports Exerc. 1994;26:376-382.
33. Gosney JL, Scott JA, Snook EM, Motl RW. Physical activity and multiple sclerosis: validity of self-report and objective measures. Fam Community Health. 2007;30:144-150.
34. Bonnefoy M, Normand S, Pachiaudi C, Lacour JR, Laville M, Kostka T. Simultaneous validation of ten physical activity questionnaires in older men: a doubly labeled water study. J Am Geriatr Soc. 2001;49:28-35.
35. Albanes D, Conway JM, Taylor PR, Moe PW, Judd J. Validation and comparison of eight physical activity questionnaires. Epidemiology. 1990;1:65-71.
36. Ainsworth BE, Jacobs DR Jr, Leon AS. Validity and reliability of selfreported physical activity status: the Lipid Research Clinics questionnaire. Med Sci Sports Exerc. 1993;25:92-98.
37. Ainsworth BE, Jacobs DR Jr, Leon AS, Richardson MT, Montoye HJ. Assessment of the accuracy of physical activity questionnaire occupational data. J Occup Med. 1993;35:1017-1027.
38. Jacobs DR Jr, Hahn LP, Haskell WL, Pirie P, Sidney S. Validity and reliability of short physical activity history: CARDIA and the Minnesota Heart Health Program. J Cardiopulm Rehabil Prev. 1989;9:448-459.
39. Greenwood JL, Joy EA, Stanford JB. The Physical Activity Vital Sign: a primary care tool to guide counseling for obesity. J Phys Act Health. 2010;7:571-576.
40. Topolski TD, LoGerfo J, Patrick DL, Williams B, Walwick J, Patrick MB. The Rapid Assessment of Physical Activity (RAPA) among older adults. Prev Chronic Dis. 2006;3:A118.
41. Mayer CJ, Steinman L, Williams B, Topolski TD, LoGerfo J. Developing a Telephone Assessment of Physical Activity (TAPA) questionnaire for older adults. Prev Chronic Dis. 2008;5:A24.
42. Sallis JF, Haskell WL, Wood PD, Fortmann SP, Rogers T, Blair SN, Paffenbarger RS Jr. Physical activity assessment methodology in the FiveCity Project. Am J Epidemiol. 1985;121:91-106.
43. Walsh MC, Hunter GR, Sirikul B, Gower BA. Comparison of self-reported with objectively assessed energy expenditure in black and white women before and after weight loss. Am J Clin Nutr. 2004;79:1013-1019.
44. Oliveria SA, Kohl HW 3rd, Trichopoulos D, Blair SN. The association between cardiorespiratory fitness and prostate cancer. Med Sci Sports Exerc. 1996;28:97-104.
45. Yore MM, Ham SA, Ainsworth BE, Kruger J, Reis JP, Kohl HW 3rd, Macera CA. Reliability and validity of the instrument used in BRFSS to assess physical activity. Med Sci Sports Exerc. 2007;39:1267-1274.
46. Stein AD, Lederman RI, Shea S. The Behavioral Risk Factor Surveillance System questionnaire: its reliability in a statewide sample. Am J Public Health. 1993;83:1768-1772.
47. Shea S, Stein AD, Lantigua R, Basch CE. Reliability of the Behavioral Risk Factor Survey in a triethnic population. Am J Epidemiol. 1991;133:489-500.
48. Strath SJ, Bassett DR Jr, Ham SA, Swartz AM. Assessment of physical activity by telephone interview versus objective monitoring. Med Sci Sports Exerc. 2003;35:2112-2118.
49. Stewart AL, Mills KM, King AC, Haskell WL, Gillis D, Ritter PL. CHAMPS physical activity questionnaire for older adults: outcomes for interventions. Med Sci Sports Exerc. 2001;33:1126-1141.
50. Giles K, Marshall AL. Repeatability and accuracy of CHAMPS as a measure of physical activity in a community sample of older Australian adults. J Phys Act Health. 2009;6:221-229.
51. Bull F, Maslin TS, Armstrong T. Global Physical Activity Questionnaire (GPAQ): nine country reliability and validity study. J Phys Act Health. 2009;6:790-804.
52. Craig CL, Marshall AL, Sjostrom M, Bauman AE, Booth ML, Ainsworth BE, Pratt M, Ekelund U, Yngve A, Sallis JF, Oja P. International Physical Activity Questionnaire: 12-country reliability and validity. Med Sci Sports Exerc. 2003;35:1381-1395.
53. Grimm EK, Swartz AM, Hart T, Miller NE, Strath SJ. Comparison of the IPAQ-Short Form and accelerometry predictions of physical activity in older adults. J Aging Phys Act. 2012;20:64-79.
54. Schmidt MD, Freedson PS, Pekow P, Roberts D, Sternfeld B, ChasanTaber L. Validation of the Kaiser Physical Activity Survey in pregnant women. Med Sci Sports Exerc. 2006;38:42-50.
55. Ainsworth BE, Sternfeld B, Richardson MT, Jackson K. Evaluation of the Kaiser Physical Activity Survey in women. Med Sci Sports Exerc. 2000;32:1327-1338.
56. Kriska AM, Edelstein SL, Hamman RF, Otto A, Bray GA, Mayer-Davis EJ, Wing RR, Horton ES, Haffner SM, Regensteiner JG. Physical activity in individuals at risk for diabetes: Diabetes Prevention Program. Med Sci Sports Exerc . 2006;38:826-832.
57. Chasan-Taber L, Schmidt MD, Roberts DE, Hosmer D, Markenson G, Freedson PS. Development and validation of a pregnancy physical activity questionnaire [published correction appears in Med Sci Sports Exerc. 2011;43:195]. Med Sci Sports Exerc. 2004;36:1750-1760.
58. Starling RD, Matthews DE, Ades PA, Poehlman ET. Assessment of physical activity in older individuals: a doubly labeled water study [published correction appears in J Appl Physiol. 2001;90:following table of contents]. J Appl Physiol. 1999;86:2090-2096.
59. Young DR, Jee SH, Appel LJ. A comparison of the Yale Physical Activity Survey with other physical activity measures. Med Sci Sports Exerc. 2001;33:955-961.
60. Friedenreich CM, Courneya KS, Bryant HE. The lifetime total physical activity questionnaire: development and reliability. Med Sci Sports Exerc. 1998;30:266-274.
61. Conway JM, Irwin ML, Ainsworth BE. Estimating energy expenditure from the Minnesota Leisure Time Physical Activity and Tecumseh Occupational Activity questionnaires: a doubly labeled water validation. J Clin Epidemiol. 2002;55:392-399.
62. De Backer G, Kornitzer M, Sobolski J, Dramaix M, Degré S, de Marneffe M, Denolin H. Physical activity and physical fitness levels of Belgian males aged 40-55 years. Cardiology. 1981;67:110-128.
63. Leon AS, Jacobs DR Jr, DeBacker G, Taylor HL. Relationship of physical characteristics and life habits to treadmill exercise capacity. Am J Epidemiol. 1981;113:653-660.
64. Richardson MT, Leon AS, Jacobs DR Jr, Ainsworth BE, Serfass R. Comprehensive evaluation of the Minnesota Leisure Time Physical Activity Questionnaire. J Clin Epidemiol. 1994;47:271-281.
65. Tuero C, De Paz JA, Marquez S. Relationship of measures of leisure time physical activity to physical fitness indicators in Spanish adults. J Sports Med Phys Fitness. 2001;41:62-67.
66. Kriska AM, Knowler WC, LaPorte RE, Drash AL, Wing RR, Blair SN, Bennett PH, Kuller LH. Development of questionnaire to examine relationship of physical activity and diabetes in Pima Indians. Diabetes Care. 1990;13:401-411.
67. Schulz LO, Harper IT, Smith CJ, Kriska AM, Ravussin E. Energy intake and physical activity in Pima Indians: comparison with energy expenditure measured by doubly-labeled water. Obes Res. 1994;2:541-548.
68. Jacobi D, Charles MA, Tafflet M, Lommez A, Borys JM, Oppert JM. Relationships of self-reported physical activity domains with accelerometry recordings in French adults. Eur J Epidemiol. 2009;24:171-179.
69. Pettee Gabriel K, McClain JJ, Schmid KK, Storti KL, Ainsworth BE. Reliability and convergent validity of the past-week Modifiable Activity Questionnaire. Public Health Nutr. 2011;14:1-8.
70. Momenan AA, Delshad M, Sarbazi N, Rezaei Ghaleh N, Ghanbarian A, Azizi F. Reliability and validity of the Modifiable Activity Questionnaire (MAQ) in an Iranian urban adult population. Arch Iranian Med. 2012;15:279-282.
71. Macera CA, Ham SA, Yore MM, Jones DA, Ainsworth BE, Kimsey CD, Kohl HW 3rd. Prevalence of physical activity in the United States: Behavioral Risk Factor Surveillance System, 2001. Prev Chronic Dis. 2005;2:A17.
72. Bauman A, Bull F, Chey T, Craig CL, Ainsworth B, Sallis J, Bowles HR, Hagstromer M, Sjostrom M, Pratt M. The International Prevalence Study on Physical Activity: results from 20 countries. Int J Behav Nutr Phys Act. 2009;6:21.
73. Dunn AL, Marcus BH, Kampert JB, Garcia ME, Kohl HW 3rd, Blair SN. Comparison of lifestyle and structured interventions to increase physical activity and cardiorespiratory fitness: a randomized trial. JAMA. 1999;281:327-334.
74. Ainsworth B, Haskell W, Leon A, Jacobs D, Montoye H, Sallis J, Paffenbarger J, R. Compendium of physical activities: classification of energy costs of human physical activities. Med Sci Sports Exerc.1993;25:71-80.
75. Ainsworth BE, Haskell WL, Herrmann SD, Meckes N, Bassett DR Jr, Tudor-Locke C, Greer JL, Vezina J, Whitt-Glover MC, Leon AS. 2011 Compendium of physical activities: a second update of codes and MET values. Med Sci Sports Exerc. 2011;43:1575-1581.
76. Ainsworth BE, Haskell WL, Whitt MC, Irwin ML, Swartz AM, Strath SJ, O'Brien WL, Bassett DR, Schmitz KH, Emplaincourt PO, Jacobs DR, Leon AS. Compendium of physical activities: an update of activity codes and MET intensities. Med Sci Sports Exerc. 2000;32(suppl):S498-S516.
77. Kimm SY, Glynn NW, Kriska AM, Barton BA, Kronsberg SS, Daniels SR, Crawford PB, Sabry ZI, Liu K. Decline in physical activity in black girls and white girls during adolescence. N Engl J Med. 2002;347:709-715.
78. Leon AS, Myers MJ, Connett J. Leisure time physical activity and the 16-year risks of mortality from coronary heart disease and all-causes in the Multiple Risk Factor Intervention Trial (MRFIT). Int J Sports Med. 1997;18(suppl 3):S208-S215.
79. Friedenreich CM, Cook LS, Magliocco AM, Duggan MA, Courneya KS. Case-control study of lifetime total physical activity and endometrial cancer risk. Cancer Causes Control. 2010;21:1105-1116.
80. Dolan SH, Williams DP, Ainsworth BE, Shaw JM. Development and reproducibility of the bone loading history questionnaire. Med Sci Sports Exerc. 2006;38:1121-1131.
81. Ainsworth B, Coleman K. Physical activity measurement. In: McTiernan A, ed. Cancer Prevention and Management Through Exercise and Weight Control. Boca Raton, FL: CRC Press; 2006:13-24.
82. Sternfeld B, Jiang SF, Picchi T, Chasan-Taber L, Ainsworth B, Quesenberry CP Jr. Evaluation of a cell phone-based physical activity diary. Med Sci Sports Exerc. 2012;44:487-495.
83. Dunton GF, Liao Y, Intille S, Wolch J, Pentz MA. Physical and social contextual influences on children's leisure-time physical activity: an ecological momentary assessment study. J Phys Act Health. 2011;8(suppl 1):S103-S108.
84. Floro JN, Dunton GE, Delfino RJ. Assessing physical activity in children with asthma: convergent validity between accelerometer and electronic diary data. Res Q Exerc Sport. 2009;80:153-163.
85. Barker RG. Ecological Psychology: Concepts and Methods for Studying the Environment of Human Behavior. Palo Alto, CA: Stanford University Press; 1968.
86. Bouchard C, Tremblay A, Leblanc C, Lortie G, Savard R, Thériault G. A method to assess energy expenditure in children and adults. Am J Clin Nutr. 1983;37:461-467.
87. Ainsworth BE, Bassett DR, Strath SJ, Swartz AM, O'Brien WL, Thompson RW, Jones DA, Macera CA, Kimsey CD. Comparison of three methods for measuring the time spent in physical activity. Med Sci Sports Exerc. 2000;32(suppl):S457-S464.
88. Haugen HA, Chan LN, Li F. Indirect calorimetry: a practical guide for clinicians. Nutr Clin Pract. 2007;22:377-388.
89. da Rocha EE, Alves VG, da Fonseca RB. Indirect calorimetry: methodology, instruments and clinical application. Curr Opin Clin Nutr Metab Care. 2006;9:247-256.
90. Levine JA. Measurement of energy expenditure. Public Health Nutr. 2005;8:1123-1132.
91. Schoeller DA, Ravussin E, Schutz Y, Acheson KJ, Baertschi P, Jéquier E. Energy expenditure by doubly labeled water: validation in humans and proposed calculation. Am J Physiol. 1986;250(pt 2):R823-R830.
92. Schoeller DA, van Santen E. Measurement of energy expenditure in humans by doubly labeled water method. J Appl Physiol. 1982;53:955-959.
93. Schoeller DA, Webb P. Five-day comparison of the doubly labeled water method with respiratory gas exchange. Am J Clin Nutr. 1984;40:153-158.
94. Ainslie P, Reilly T, Westerterp K. Estimating human energy expenditure: a review of techniques with particular reference to doubly labelled water. Sports Med. 2003;33:683-698.
95. Ritz P, Coward WA. Doubly labelled water measurement of total energy expenditure. Diabete Metab. 1995;21:241-251.
96. Schoeller DA. Recent advances from application of doubly labeled water to measurement of human energy expenditure. J Nutr. 1999;129:1765-1768.
97. Coward WA. Stable isotopic methods for measuring energy expenditure: the doubly-labelled-water $\left({ }^{2} \mathrm{H}_{2}{ }^{18} \mathrm{O}\right)$ method: principles and practice. Proc Nutr Soc. 1988;47:209-218.
98. McKenzie TL. Use of direct observation to assess physical activity. In: Welk G, ed. Physical Activity Assessments for Health-Related Research. Champaign, IL: Human Kinetics; 2002:179-191.
99. Rowlands AV, Ingledew DK, Eston RG. The effect of type of physical activity measure on the relationship between body fatness and habitual physical activity in children: a meta-analysis. Ann Hum Biol. 2000;27:479-497.
100. McKenzie TL. Observational measures of children's physical activity. J Sch Health. 1991;61:224-227.
101. Strath SJ, Swartz AM, Bassett DR Jr, O’Brien WL, King GA, Ainsworth BE. Evaluation of heart rate as a method for assessing moderate intensity physical activity. Med Sci Sports Exerc. 2000;32(suppl):S465-S470.
102. Ceesay SM, Prentice AM, Day KC, Murgatroyd PR, Goldberg GR, Scott W, Spurr GB. The use of heart rate monitoring in the estimation of energy expenditure: a validation study using indirect whole-body calorimetry. Br J Nutr. 1989;61:175-186.
103. Livingstone MB, Prentice AM, Coward WA, Ceesay SM, Strain JJ, McKenna PG, Nevin GB, Barker ME, Hickey RJ. Simultaneous measurement of free-living energy expenditure by the doubly labeled water method and heart-rate monitoring. Am J Clin Nutr. 1990;52:59-65.
104. Livingstone MBE, Coward WA, Prentice AM, Davies PSW, Strain JJ, McKenna PG, Mahoney CA, White JA, Stewart CM, Kerr MJJ. Daily energy expenditure in free-living children: comparison of heart-rate monitoring with the doubly labeled water $\left({ }^{2} \mathrm{H}_{2}^{18} \mathrm{O}\right)$ method. Am J Clin Nutr. 1992;56:343-352.
105. Dugas LR, van der Merwe L, Odendaal H, Noakes TD, Lambert EV. A novel energy expenditure prediction equation for intermittent physical activity. Med Sci Sports Exerc. 2005;37:2154-2161.
106. Hiilloskorpi HK, Pasanen ME, Fogelholm MG, Laukkanen RM, Mänttäri AT. Use of heart rate to predict energy expenditure from low to high activity levels. Int J Sports Med. 2003;24:332-336.
107. Keytel LR, Goedecke JH, Noakes TD, Hiiloskorpi H, Laukkanen R, van der Merwe L, Lambert EV. Prediction of energy expenditure from heart rate monitoring during submaximal exercise. J Sports Sci. 2005;23:289-297.
108. Iannotti RJ, Claytor RP, Horn TS, Chen R. Heart rate monitoring as a measure of physical activity in children. Med Sci Sports Exerc. 2004;36:1964-1971.
109. Welk GJ, Schaben JA, Morrow JR Jr. Reliability of accelerometrybased activity monitors: a generalizability study. Med Sci Sports Exerc. 2004;36:1637-1645.
110. Lyden K, Kozey SL, Staudenmeyer JW, Freedson PS. A comprehensive evaluation of commonly used accelerometer energy expenditure and MET prediction equations. Eur J Appl Physiol. 2011;111:187-201.
111. Colley RC, Tremblay MS. Moderate and vigorous physical activity intensity cut-points for the Actical accelerometer. J Sports Sci. 2011;29:783-789.
112. Crouter SE, Bassett DR Jr. A new 2-regression model for the Actical accelerometer. Br J Sports Med. 2008;42:217-224.
113. Crouter SE, Dellavalle DM, Horton M, Haas JD, Frongillo EA, Bassett DR Jr. Validity of the Actical for estimating free-living physical activity. Eur J Appl Physiol. 2011;111:1381-1389.
14. Heil DP. Predicting activity energy expenditure using the Actical activity monitor. Res Q Exerc Sport. 2006;77:64-80.
115. Hooker SP, Feeney A, Hutto B, Pfeiffer KA, McIver K, Heil DP, Vena JE, Lamonte MJ, Blair SN. Validation of the Actical activity monitor in middle-aged and older adults. J Phys Act Health. 2011;8:372-381.
116. John D, Freedson P. ActiGraph and Actical physical activity monitors: a peek under the hood. Med Sci Sports Exerc. 2012;44(suppl):S86-S89.
117. Rothney MP, Schaefer EV, Neumann MM, Choi L, Chen KY. Validity of physical activity intensity predictions by ActiGraph, Actical, and RT3 accelerometers. Obesity (Silver Spring). 2008;16:1946-1952.
118. Wong SL, Colley R, Connor Gorber S, Tremblay M. Actical accelerometer sedentary activity thresholds for adults. J Phys Act Health. 2011;8:587-591.
119. Brage S, Wedderkopp N, Franks PW, Andersen LB, Froberg K. Reexamination of validity and reliability of the CSA monitor in walking and running. Med Sci Sports Exerc. 2003;35:1447-1454.
120. Crouter SE, Kuffel E, Haas JD, Frongillo EA, Bassett DR Jr. Refined two-regression model for the ActiGraph accelerometer. Med Sci Sports Exerc. 2010;42:1029-1037.
121. Freedson PS, Melanson E, Sirard J. Calibration of the Computer Science and Applications, Inc. accelerometer. Med Sci Sports Exerc. 1998;30:777-781.
122. Hendelman D, Miller K, Baggett C, Debold E, Freedson P. Validity of accelerometry for the assessment of moderate intensity physical activity in the field. Med Sci Sports Exerc. 2000;32(suppl):S442-S449.
123. Matthew CE. Calibration of accelerometer output for adults. Med Sci Sports Exerc. 2005;37(suppl):S512-S522.
124. Swartz AM, Strath SJ, Bassett DR Jr, O'Brien WL, King GA, Ainsworth BE. Estimation of energy expenditure using CSA accelerometers at hip and wrist sites. Med Sci Sports Exerc. 2000;32(suppl):S450-S456.
125. Staudenmayer J, Pober D, Crouter S, Bassett D, Freedson P. An artificial neural network to estimate physical activity energy expenditure and
identify physical activity type from an accelerometer. J Appl Physiol. 2009;107:1300-1307.
126. Freedson PS, Lyden K, Kozey-Keadle S, Staudenmayer J. Evaluation of artificial neural network algorithms for predicting METs and activity type from accelerometer data: validation on an independent sample. J Appl Physiol. 2011;111:1804-1812.
127. Pober DM, Staudenmayer J, Raphael C, Freedson PS. Development of novel techniques to classify physical activity mode using accelerometers. Med Sci Sports Exerc. 2006;38:1626-1634.
128. Albinali F, Intille S, Haskell W, Rosenberger M. Using wearable activity type detection to improve physical activity energy expenditure estimation. In: Ubicomp '10: Proceedings of the 12th ACM International Conference on Ubiquitous Computing. Copenhagen, Denmark: Association for Computing Machinery; 2010:311-320.
129. DeVries SI, Garre FG, Engbers LH, Hildebrandt VH, van Buuren S. Evaluation of neural networks to identify types of activity using accelerometers. Med Sci Sports Exerc.2011;43:101-107.
130. Rothney MP, Neumann M, Béziat A, Chen KY. An artificial neural network model of energy expenditure using nonintegrated acceleration signals. J Appl Physiol. 2007;103:1419-1427.
131. Colbert LH, Matthews CE, Havighurst TC, Kim K, Schoeller DA. Comparative validity of physical activity measures in older adults. Med Sci Sports Exerc. 2011;43:867-876.
132. Copeland JL, Esliger DW. Accelerometer assessment of physical activity in active, healthy older adults. J Aging Phys Act. 2009;17:17-30.
133. Crouter SE, Clowers KG, Bassett DR Jr. A novel method for using accelerometer data to predict energy expenditure. J Appl Physiol. 2006;100:1324-1331.
134. Crouter SE, Dellavalle DM, Haas JD, Frongillo EA, Bassett DR. Validity of ActiGraph 2-regression model, Matthews cut-points, and NHANES cut-points for assessing free-living physical activity. J Phys Act Health. 2013;10:504-514.
135. John D, Tyo B, Bassett DR. Comparison of four ActiGraph accelerometers during walking and running. Med Sci Sports Exerc. 2010;42:368-374.
136. Ried-Larsen M, Brønd JC, Brage S, Hansen BH, Grydeland M, Andersen LB, Møller NC. Mechanical and free living comparisons of four generations of the Actigraph activity monitor. Int J Behav Nutr Phys Act. 2012;9:113.
137. Rothney MP, Apker GA, Song Y, Chen KY. Comparing the performance of three generations of ActiGraph accelerometers. J Appl Physiol. 2008;105:1091-1097.
138. Rothney MP, Brychta RJ, Meade NN, Chen KY, Buchowski MS. Validation of the ActiGraph two-regression model for predicting energy expenditure. Med Sci Sports Exerc. 2010;42:1785-1792.
139. Santos-Lozano A, Torres-Luque G, Marin PJ, Ruiz JR, Lucia A, Garatachea N. Intermonitor variability of GT3X accelerometer. Int J Sports Med. 2012;33:994-999.
140. Sasaki JE, John D, Freedson PS. Validation and comparison of ActiGraph activity monitors. J Sci Med Sport. 2011;14:411-416.
141. Wanner M, Martin BW, Meier F, Probst-Hensch N, Kriemler S. Effects of filter choice in GT3X accelerometer assessments of free-living activity. Med Sci Sports Exerc. 2013;45:170-177.
142. Welk GJ, McClain JJ, Eisenmann JC, Wickel EE. Field validation of the MTI Actigraph and BodyMedia armband monitor using the IDEEA monitor. Obesity (Silver Spring). 2007;15:918-928.
143. Nichols JF, Morgan CG, Chabot LE, Sallis JF, Calfas KJ. Assessment of physical activity with the Computer Science and Applications, Inc., accelerometer: laboratory versus field validation. Res Q Exerc Sport. 2000;71:36-43.
144. Strath SJ, Bassett DR Jr, Swartz AM. Comparison of MTI accelerometer cut-points for predicting time spent in physical activity. Int Sports Med. 2003;24:298-303.
145. Strath SJ, Pfeiffer KA, Whitt-Glover MC. Accelerometer use with children, older adults, and adults with functional limitations. Med Sci Sports Exerc. 2012;44(suppl):S77-S85.
146. Trost S, McIver K, Pate R. Conducting accelerometer-based activity assessments in field-based research. . Med Sci Sports Exerc. 2005;37(suppl):S531-S543.
147. Busse ME, van Deursen RW, Wiles CM. Real-life step and activity measurement: reliability and validity. J Med Eng Technol. 2009;33:33-41.
148. Dahlgren G, Carlsson D, Moorhead A, Häger-Ross C, McDonough SM. Test-retest reliability of step counts with the ActivPAL device in common daily activities. Gait Posture. 2010;32:386-390.
149. Godfrey A, Culhane KM, Lyons GM. Comparison of the performance of the activPAL Professional physical activity logger to a
discrete accelerometer-based activity monitor. Med Eng Physics. 2007;29:930-934.
150. Grant PM, Dall PM, Mitchell SL, Granat MH. Activity-monitor accuracy in measuring step number and cadence in community-dwelling older adults. J Aging Phys Act. 2008;16:201-214.
151. Grant PM, Granat MH, Thow MK, Maclaren WM. Analyzing free-living physical activity of older adults in different environments using bodyworn activity monitors. J Aging Phys Act. 2010;18:171-184.
152. Grant PM, Ryan CG, Tigbe WW, Granat MH. The validation of a novel activity monitor in the measurement of posture and motion during everyday activities. Br J Sports Med. 2006;40:992-997.
153. Harrington DM, Welk GJ, Donnelly AE. Validation of MET estimates and step measurement using the activPAL physical activity logger. J Sports Sci. 2011;29:627-633.
154. Hart TL, McClain JJ, Tudor-Locke C. Controlled and free-living evaluation of objective measures of sedentary and active behaviors. J Phys Act Health. 2011;8:848-857.
155. Maddocks M, Petrou A, Skipper L, Wilcock A. Validity of three accelerometers during treadmill walking and motor vehicle travel. Br J Sports Med. 2010;44:606-608.
156. Ryan CG, Grant PM, Tigbe WW, Granat MH. The validity and reliability of a novel activity monitor as a measure of walking. Br J Sports Med. 2006;40:779-784.
157. Taraldsen K, Askim T, Sletvold O, Einarsen EK, Bjåstad KG, Indredavik B, Helbostad JL. Evaluation of a body-worn sensor system to measure physical activity in older people with impaired function. Phys Ther. 2011;91:277-285.
158. Feito Y, Bassett DR, Thompson DL. Evaluation of activity monitors in controlled and free-living environments. Med Sci Sports Exerc. 2012;44:733-741.
159. Zhang S, Rowlands AV, Murray P, Hurst TL. Physical activity classification using the GENEA wrist-worn accelerometer. Med Sci Sports Exerc. 2012;44:742-748.
160. Esliger DW, Rowlands AV, Hurst TL, Catt M, Murray P, Eston RG. Validation of the GENEA accelerometer. Med Sci Sports Exerc. 2011;43:1085-1093.
161. Rowlands AV, Stiles VH. Accelerometer counts and raw acceleration output in relation to mechanical loading. J Biomech. 2012;45:448-454.
162. Zhang S, Murray P, Zillmer R, Eston RG, Catt M, Rowlands AV. Activity classification using the GENEA: optimum sampling frequency and number of axes. Med Sci Sports Exerc. 2012;44:2228-2234.
163. Crouter SE, Schneider PL, Karabulut M, Bassett DR Jr. Validity of 10 electronic pedometers for measuring steps, distance, and energy cost. Med Sci Sports Exerc. 2003;35:1455-1460.
164. Schneider PL, Crouter SE, Lukajic O, Bassett DR Jr. Accuracy and reliIGAM ability of 10 pedometers for measuring steps over a 400-m walk. Med Sci
165. Schneider PL, Crouter SE, Bassett DR. Pedometer measures of freeliving physical activity: comparison of 13 models. Med Sci Sports Exerc. 2004;36:331-335.
166. Abel M, Hannon J, Lillie T, Sell K, Anderson D, Conlin G. Comparison of Kenz Lifecorder versus ActiGraph physical activity output in freeliving conditions. J Phys Act Health. 2009;6(suppl 1):S141-S147.
167. Abel MG, Hannon JC, Sell K, Lillie T, Conlin G, Anderson D. Validation of the Kenz Lifecorder EX and ActiGraph GT1M accelerometers for walking and running in adults. Appl Physiol Nutr Metab. 2008;33:1155-1164.
168. Ayabe M, Ishii K, Takayama K, Aoki J, Tanaka H. Comparison of interdevice measurement difference of pedometers in younger and older adults. Br J Sports Med. 2010;44:95-99.
169. Hikihara Y, Tanaka S, Ohkawara K, Ishikawa-Takata K, Tabata I. Validation and comparison of 3 accelerometers for measuring physical activity intensity during nonlocomotive activities and locomotive movements. J Phys Act Health. 2012;9:935-943.
170. Kumahara H, Schutz Y, Ayabe M, Yoshioka M, Yoshitake Y, Shindo M, Ishii K, Tanaka H. The use of uniaxial accelerometry for the assessment of physical-activity-related energy expenditure: a validation study against whole-body indirect calorimetry. Br J Nutr. 2004;91:235-243.
171. McClain JJ, Craig CL, Sisson SB, Tudor-Locke C. Comparison of Lifecorder EX and ActiGraph accelerometers under free-living conditions. Appl Physiol Nutr Metab. 2007;32:753-761.
172. Plasqui G, Westerterp KR. Physical activity assessment with accelerometers: an evaluation against doubly labeled water. Obesity (Silver Spring). 2007;15:2371-2379.
173. Esliger DW, Tremblay MS. Technical reliability assessment of three accelerometer models in a mechanical setup. Med Sci Sports Exerc. 2006;38:2173-2181.
174. Hendrick P, Boyd T, Low O, Takarangi K, Paterson M, Claydon L, Milosavljevic S. Construct validity of RT3 accelerometer: a comparison of level-ground and treadmill walking at self-selected speeds. J Rehabil Res Dev. 2010;47:157-168.
175. Krasnoff JB, Kohn MA, Choy FK, Doyle J, Johansen K, Painter PL. Interunit and intraunit reliability of the RT3 triaxial accelerometer. J Phys Act Health. 2008;5:527-538.
176. Maddison R, Jiang Y, Hoorn SV, Mhurchu CN, Lawes CM, Rodgers A, Rush E. Estimating energy expenditure with the RT3 triaxial accelerometer. Res Q Exerc Sport. 2009;80:249-256.
177. Perry MA, Hendrick PA, Hale L, Baxter GD, Milosavljevic S, Dean SG, McDonough SM, Hurley DA. Utility of the RT3 triaxial accelerometer in free living: an investigation of adherence and data loss. Appl Ergon. 2010;41:469-476.
178. Powell SM, Jones DI, Rowlands AV. Technical variability of the RT3 accelerometer. Med Sci Sports Exerc. 2003;35:1773-1778.
179. Powell SM, Rowlands AV. Intermonitor variability of the RT3 accelerometer during typical physical activities. Med Sci Sports Exerc. 2004;36:324-330.
180. Reneman M, Helmus M. Interinstrument reliability of the RT3 accelerometer. Int J Rehabil Res. 2010;33:178-179.
181. Rowlands AV, Thomas PW, Eston RG, Topping R. Validation of the RT3 triaxial accelerometer for the assessment of physical activity. Med Sci Sports Exerc. 2004;36:518-524.
182. Sumukadas D, Laidlaw S, Witham MD. Using the RT3 accelerometer to measure everyday activity in functionally impaired older people. Aging Clin Exp Res. 2008;20:15-18.
183. Leenders NYJM, Sherman WM, Nagaraja HN. Comparison of four methods of estimating physical activity in adult women. Med Sci Sports Exerc. 2000;32:1320-1326.
184. Coleman KL, Smith DG, Boone DA, Joseph AW, del Aguila MA. Step activity monitor: long-term, continuous recording of ambulatory function. J Rehabil Res Dev. 1999;36:8-18.
185. Resnick B, Nahm ES, Orwig D, Zimmerman SS, Magaziner J. Measurement of activity in older adults: reliability and validity of the Step Activity Monitor. J Nurs Meas. 2001;9:275-290.
186. Storti KL, Pettee KK, Brach JS, Talkowski JB, Richardson CR, Kriska AM. Gait speed and step-count monitor accuracy in community-dwelling older adults. Med Sci Sports Exerc. 2008;40:59-64.
187. Nguyen HQ, Burr RL, Gill DP, Coleman K. Validation of the StepWatch device for measurement of free-living ambulatory activity in patients with chronic obstructive pulmonary disease. J Nurs Meas. 2011;19:76-90.
188. Shepherd EF, Toloza E, McClung CD, Schmalzried TP. Step activity monitor: increased accuracy in quantifying ambulatory activity. J Orthop Res. 1999;17:703-708.
189. Silcott NA, Bassett DR Jr, Thompson DL, Fitzhugh EC, Steeves JA. Evaluation of the Omron HJ-720ITC pedometer under free-living conditions. Med Sci Sports Exerc. 2011;43:1791-1797.
190. Holbrook EA, Barreira TV, Kang M. Validity and reliability of Omron pedometers for prescribed and self-paced walking. Med Sci Sports Exerc. 2009;41:670-674.
191. Giannakidou DM, Kambas A, Ageloussis N, Fatouros I, Christoforidis C, Venetsanou F, Douroudos I, Taxildaris K. The validity of two Omron pedometers during treadmill walking is speed dependent. Eur J Appl Physiol. 2012;112:49-57.
192. Hasson RE, Haller J, Pober DM, Staudenmayer J, Freedson PS. Validity of the Omron HJ-112 pedometer during treadmill walking. Med Sci Sports Exerc. 2009;41:805-809.
193. Le Masurier GC, Lee SM, Tudor-Locke C. Motion sensor accuracy under controlled and free-living conditions. Med Sci Sports Exerc. 2004;36:905-910.
194. Connolly CP, Coe DP, Kendrick JM, Bassett DR Jr, Thompson DL. Accuracy of physical activity monitors in pregnant women. Med Sci Sports Exerc. 2011;43:1100-1105.
195. Crouter SE, Schneider PL, Bassett DR Jr. Spring-levered versus piezoelectric pedometer accuracy in overweight and obese adults. Med Sci Sports Exerc. 2005;37:1673-1679.
196. Bassett DR Jr, Ainsworth BE, Leggett SR, Mathien CA, Main JA, Hunter DC, Duncan GE. Accuracy of five electronic pedometers for measuring distance walked. Med Sci Sports Exerc. 1996;28:1071-1077.
197. Jakicic JM, Marcus M, Gallagher KI, Randall C, Thomas E, Goss FL, Robertson RJ. Evaluation of the SenseWear Pro Armband to assess energy expenditure during exercise. Med Sci Sports Exerc. 2004;36:897-904.
198. Mackey DC, Manini TM, Schoeller DA, Koster A, Glynn NW, Goodpaster BH, Satterfield S, Newman AB, Harris TB, Cummings SR;

Health, Aging, and Body Composition Study. Validation of an armband to measure daily energy expenditure in older adults. J Gerontol. 2011;66:1108-1113.
199. Berntsen S, Hageberg R, Aandstad A, Mowinckel P, Anderssen SA, Carlsen KH, Andersen LB. Validity of physical activity monitors in adults participating in free-living activities. Br J Sports Med. 2010;44:657-664.
200. Fruin ML, Rankin JW. Validity of a multi-sensor armband in estimating rest and exercise energy expenditure. Med Sci Sports Exerc. 2004;36:1063-1069.
201. Johannsen DL, Calabro MA, Stewart J, Franke W, Rood JC, Welk GJ. Accuracy of armband monitors for measuring daily energy expenditure in healthy adults. Med Sci Sports Exerc. 2010;42:2134-2140.
202. King GA, Torres N, Potter C, Brooks TJ, Coleman KJ. Comparison of activity monitors to estimate energy cost of treadmill exercise. Med Sci Sports Exerc. 2004;36:1244-1251.
203. Zhang K, Werner P, Sun M, Pi-Sunyer FX, Boozer CN. Measurement of human daily physical activity. Obes Res. 2003;11:33-40.
204. Zhang K, Pi-Sunyer FX, Boozer CN. Improving energy expenditure estimation for physical activity. Med Sci Sports Exerc. 2004;36:883-889.
205. Whybrow S, Ritz P, Horgan GW, Stubbs RJ. An evaluation of the IDEEA activity monitor for estimating energy expenditure. $\mathrm{Br} J$ Nutr. 2013;109:173-183.
206. Brage S, Brage N, Ekelund U, Luan J, Franks PW, Froberg K, Wareham NJ. Effect of combined movement and heart rate monitor placement on physical activity estimates during treadmill locomotion and free-living. Eur J Appl Physiol. 2006;96:517-524.
207. Brage S, Brage N, Franks PW, Ekelund U, Wareham NJ. Reliability and validity of the combined heart rate and movement sensor Actiheart. Eur J Clin Nutr. 2005;59:561-570.
208. Spierer DK, Hagins M, Rundle A, Pappas E. A comparison of energy expenditure estimates from the Actiheart and Actical physical activity monitors during low intensity activities, walking, and jogging. Eur J Appl Physiol. 2011;111:659-667
209. Chen KY, Bassett DR Jr. The technology of accelerometry-based activity monitors: current and future. Med Sci Sports Exerc. 2005;37(suppl):S490-S500.
210. Brage S, Brage N, Wedderkopp N, Froberg K. Reliability and validity of the Computer Science and Applications accelerometer in a mechanical setting. Meas Phys Educ Exerc Sci. 2003;7:101-119.
211. Welk GJ, Blair SN, Wood K, Jones S, Thompson RW. A comparative evaluation of three accelerometry-based physical activity monitors. Med Sci Sports Exerc. 2000;32(suppl):S489-497.
212. Welk G. Principles of design and analyses for the calibration of
4. accelerometry-based activity monitors. Med Sci Sports Exerc.
213. John D, Liu S, Sasaki JE, Howe CA, Staudenmayer J, Gao RX, Freedson PS. Calibrating a novel multi-sensor physical activity measurement system. Physiol Meas. 2011;32:1473-1489.
214. DeVries SI, Engels M, Garre FG. Identification of children's activity type with accelerometer-based neural networks. Med Sci Sports Exerc.2011;43:1994-1999.
215. Duncan GE, Lester J, Migotsky S, Goh J, Higgins L, Borriello G. Accuracy of a novel multi-sensor board for measuring physical activity and energy expenditure. Eur J Appl Physiol. 2011;111:2025-2032.
216. Bassett DR Jr, Strath SJ. Use of pedometers to assess physical activity. In: Welk GJ, ed. Physical Activity Assessments for Health-Related Research. Champaign, IL: Human Kinetics; 2002:163-177.
217. Bassett DR Jr, Ainsworth BE, Swartz AM, Strath SJ, O'Brien WL, King GA. Validity of four motion sensors in measuring moderate intensity physical activity. Med Sci Sports Exerc. 2000;32(suppl):S471-S480.
218. Corder K, Brage S, Ekelund U. Accelerometers and pedometers: methodology and clinical application. Curr Opin Clin Nutr Metab Care. 2007;10:597-603.
219. Melanson EL, Knoll JR, Bell ML, Donahoo WT, Hill JO, Nysse LJ, Lanningham-Foster L, Peters JC, Levine JA. Commercially available pedometers: considerations for accurate step counting. Prev Med. 2004;39:361-368.
220. Marshall SJ, Levy SS, Tudor-Locke CE, Kolkhorst FW, Wooten KM, Ji M, Macera CA, Ainsworth BE. Translating physical activity recommendations into a pedometer-based step goal: 3000 steps in 30 minutes. Am J Prev Med. 2009;36:410-415.
221. Tudor-Locke C, Rowe DA. Using cadence to study free-living ambulatory behaviour. Sports Med. 2012;42:381-398.
222. Rowe DA, Welk GJ, Heil DP, Mahar MT, Kemble CD, Calabro MA, Camenisch K. Stride rate recommendations for moderate-intensity walking. Med Sci Sports Exerc. 2011;43:312-318.
223. Avons P, Garthwaite P, Davies HL, Murgatroyd PR, James WP. Approaches to estimating physical activity in the community: calorimetric validation of actometers and heart rate monitoring. Eur J Clin Nutr. 1988;42:185-196.
224. Haskell WL, Yee MC, Evans A, Irby PJ. Simultaneous measurement of heart rate and body motion to quantitate physical activity. Med Sci Sports Exerc. 1993;25:109-115.
225. Moon JK, Butte NF. Combined heart rate and activity improve estimates of oxygen consumption and carbon dioxide production rates. J Appl Physiol. 1996;81:1754-1761.
226. Rennie K, Rowsell T, Jebb SA, Holburn D, Wareham NJ. A combined heart rate and movement sensor: proof of concept and preliminary testing study. Eur J Clin Nutr. 2000;54:409-414.
227. Johansson HP, Rossander-Hulthén L, Slinde F, Ekblom B. Accelerometry combined with heart rate telemetry in the assessment of total energy expenditure. Br J Nutr. 2006;95:631-639.
228. Strath SJ, Bassett DR Jr, Swartz AM, Thompson DL. Simultaneous heart rate-motion sensor technique to estimate energy expenditure. Med Sci Sports Exerc. 2001;33:2118-2123.
229. Strath SJ, Bassett DR Jr, Thompson DL, Swartz AM. Validity of the simultaneous heart rate-motion sensor technique for measuring energy expenditure. Med Sci Sports Exerc. 2002;34:888-894.
230. Strath SJ, Brage S, Ekelund U. Integration of physiological and accelerometer data to improve physical activity assessment. Med Sci Sports Exerc. 2005;37(suppl):S563-S571.
231. Assah FK, Ekelund U, Brage S, Wright A, Mbanya JC, Wareham NJ. Accuracy and validity of a combined heart rate and motion sensor for the measurement of free-living physical activity energy expenditure in adults in Cameroon. Int J Epidemiol. 2011;40:112-120.
232. Brage S, Brage N, Franks PW, Ekelund U, Wong M-Y, Andersen LB, Froberg K, Wareham NJ. Branched equation modeling of simultaneous accelerometry and heart rate monitoring improves estimate of directly measured physical activity energy expenditure. J Appl Physiol. 2004;96:343-351.

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[^2]:    DLW indicates doubly labeled water; HR, heart rate; and PAEE, physical activity-related energy expenditure.

