## Sedentary Behavior and Chronic Disease: Mechanisms and Future Directions

#### Paddy C. Dempsey, Chuck E. Matthews, S. Ghazaleh Dashti, Aiden R. Doherty, Audrey Bergouignan, Eline H. van Roekel, David W. Dunstan, Nicholas J. Wareham, Thomas E. Yates, Katrien Wijndaele, and Brigid M. Lynch

**Background**: Recent updates to physical activity guidelines highlight the importance of reducing sedentary time. However, at present, only general recommendations are possible (ie, "Sit less, move more"). There remains a need to investigate the strength, temporality, specificity, and dose–response nature of sedentary behavior associations with chronic disease, along with potential underlying mechanisms. **Methods**: Stemming from a recent research workshop organized by the Sedentary Behavior Council themed "Sedentary behaviour mechanisms—biological and behavioural pathways linking sitting to adverse health outcomes," this paper (1) discusses existing challenges and scientific discussions within this advancing area of science, (2) highlights and discusses emerging areas of interest, and (3) points to potential future directions. **Results**: A brief knowledge update is provided, reflecting upon current and evolving thinking/discussions, and the rapid accumulation of new evidence linking sedentary behavior to chronic disease. Research "action points" are made at the end of each section—spanning from measurement systems and analytic methods, genetic epidemiology, causal mediation, and experimental studies to biological and behavioral determinants and mechanisms. **Conclusion**: A better understanding of *whether* and *how* sedentary behavior is causally related to chronic disease will allow for more meaningful conclusions in the future and assist in refining clinical and public health policies/recommendations.

Keywords: sitting, exercise, physical activity, physiology, epidemiology, cardiometabolic, mediation, measurement

Sedentary behaviors—seated or reclining postures done while awake and that require little energy expenditure (ie,  $\leq 1.5$  metabolic equivalents<sup>1</sup>)—are ubiquitous in modern societies. Accelerometerbased estimates indicate that adults in high-income countries spend on average 8 to 10 hours per day sedentary.<sup>2–4</sup> Prospective observational evidence suggests that high volumes of sedentary behavior are associated with an elevated risk for all-cause mortality, cardiovascular disease incidence and mortality, type 2 diabetes incidence, and some cancers, particularly among those who are not achieving recommended amounts of moderate- to vigorous-intensity physical activity

52

(MVPA).<sup>5–8</sup> Moreover, observational studies<sup>9–11</sup> and an accumulating body of acute experimental studies<sup>12</sup> suggest that specific patterns of sedentary time (ie, whether sedentary behavior is undertaken in more prolonged or shorter bout durations) may be differentially associated with several cardiometabolic risk biomarkers and premature mortality. However, this evidence base is still maturing.

As a result, the recently updated 2018 Physical Activity Guidelines for Americans now recognizes the importance of reducing sedentary time.<sup>5,13</sup> This new emphasis on shifting the balance away from high volumes of sedentary time in favor of *both* increased light-intensity physical activity and MVPA (notably of any bout duration) offers some important opportunities and targets from both a clinical and public health perspective. However, as limited evidence is available, concerning "optimal" amounts and patterns of sedentary behavior and light-intensity physical activity in relation to chronic disease risk, only general recommendations are possible to guide time spent in these behaviors at present (ie, "Sit less, move more").

Accordingly, there is an impetus to investigate the strength, temporality, specificity, and dose–response nature of these associations to inform the development of more specific, time- and pattern-based clinical and public health guidelines for sedentary behavior. It will also be important to investigate whether observed associations are causal, and if they are, what the mechanisms linking sedentary behavior with chronic disease outcomes may be. To achieve this, *triangulation* of evidence using a range of different research approaches<sup>14–16</sup>—each with different strengths, limitations, and sources of bias—will be required.

This paper stems from a recent research workshop (http://www. mrc-epid.cam.ac.uk/ispahsedentary18/) organized by the Sedentary Behavior Council themed "Sedentary behaviour mechanisms biological and behavioural pathways linking sitting to adverse health outcomes" which was held in October 2018 just prior to the seventh

Wijndaele and Lynch are co-senior authors. Dempsey, Wareham, and Wijndaele are with MRC Epidemiology Unit, Institute of Metabolic Science, University of Cambridge, Cambridge, United Kingdom. Dempsey, Dunstan, and Lynch are with Baker Heart and Diabetes Institute, Melbourne, VIC, Australia. Matthews is with Metabolic Epidemiology Branch, Division of Cancer Epidemiology and Genetics, National Cancer Institute, Bethesda, MD, USA. Dashti and Lynch are with the Melbourne School of Population and Global Health, The University of Melbourne, Melbourne, VIC, Australia. Doherty is with Big Data Institute, Li Ka Shing Centre for Health Information and Discovery, University of Oxford, Oxford, United Kingdom; and NIHR Oxford Biomedical Research Centre, Oxford University Hospitals NHS Foundation Trust, John Radcliffe Hospital, Oxford, United Kingdom. Bergouignan is with IPHC UMR 7178, CNRS, Université de Strasbourg, Strasbourg, France; and the Division of Endocrinology, Metabolism and Diabetes, University of Colorado, Anschutz Medical Campus, Aurora, CO, USA. van Roekel is with the Department of Epidemiology, GROW School for Oncology and Developmental Biology, Maastricht University, Maastricht, The Netherlands. Dunstan is also with Mary MacKillop Institute for Health Research, Australian Catholic University, Melbourne, VIC, Australia. Yates is with Diabetes Research Centre, University of Leicester, Leicester, United Kingdom; and the NIHR Leicester Biomedical Research Centre, Leicester, United Kingdom. Lynch is also with Cancer Epidemiology Division, Cancer Council Victoria, Melbourne, VIC, Australia. Dempsey (paddy.dempsey@baker.edu.au) is corresponding author.

International Society for Physical Activity and Health Conference (https://ispah.org/congress-history/london-2018/). The main aim of the workshop was to provide an up-to-date view on the state of the evidence on sedentary behavior mechanisms with respect to chronic disease, as well as to set an agenda for moving the science forward. This paper is not intended to be a full reflection of the workshop nor a systematic review of all research in this area. Rather, our objectives are to concisely (1) discuss existing challenges and scientific discussions within this rapidly advancing area of science, (2) highlight a few emerging areas of interest, and (3) point to pertinent future directions for sedentary behavior research.

## Important Scientific Challenges and Debates

#### Are Sedentary Behavior and Physical Activity "Independent" Risk Factors?

The notion of *independence* tends to be interpreted in slightly different ways from a biological perspective (ie, distinct physiological effects/pathways); a behavioral intervention perspective (ie, unique correlates/determinants); and an epidemiological perspective (ie, covariate adjustment, effect modification/interactions, and/or examining time trade-offs between behaviors, etc). It is therefore unsurprising that how sedentary behavior is related to physical activity (or lack thereof), and whether sedentary behavior is an independent risk factor, remains an area of ongoing research and scientific discussion.<sup>17,18</sup> Nevertheless, it could be argued that debates around the independence of sedentary and physical activity behaviors are somewhat artificial as these behaviors are inevitably interdependent-that is, it is not possible to alter sedentary time without also altering time spent in some form of physical activity (or sleep). Recent harmonized meta-syntheses indicate that the associations between self-reported sitting with all-cause and cardiovascular disease mortality are only partially independent of MVPA, but are particularly evident (or modified) in those who undertake insufficient (<150 min/wk) MVPA.<sup>7,8</sup> Analytical paradigms such as compositional data analysis and isotemporal substitution-which can better account for behavioral interdependencies within a finite time or composition-are now being more widely implemented to address questions concerning the "ideal balances" of sleep, sedentary time, and different volumes and intensities of physical activity within observational studies.<sup>19-23</sup> However, these approaches do not obviate underlying challenges concerning the accurate quantification of sleep, sitting/standing, and higher intensity activity behaviors across a 24-hour day with minimal burden (ie, using either single or multiple devices/inputs). Biological and behavioral intervention evidence is also needed to further build on the totality of evidence.

# Does Sedentary Behavior Have Distinct Mechanistic Underpinnings?

As mentioned previously, initial animal model-based biological research (now a decade-old) and more recent human experimental studies examining muscle/adipose tissue samples have proposed that some sedentary behavior or muscle inactivity-related physiological effects may be *distinct* from those of associated with MVPA.<sup>24–29</sup> However, this mechanistic evidence base remains sparse and is still maturing. Although some distinct mechanistic pathways linking sedentary behavior and MVPA to health may be plausible depending on the physiological outcome, experimental studies seldom rule out sedentary behavior as an "innocent bystander." That is, whether the

effects of sedentary behavior are simply part of the broader physiological pathways associated with inactivity (sometimes colloquially referred to as "flip-sides of the same coin").<sup>24,25</sup> Importantly, the current consensus of understanding on the hypothesized mechanisms underlying sedentary behavior and chronic disease is largely based on expert opinion or narrative reviews, both of which are prone to bias. More targeted research is required to investigate the specific pathophysiological pathways through which sedentary behavior may independently influence chronic disease risk, and to what extent these pathways differ or overlap with those associated with insufficient MVPA and other health-related factors, such as age, sex, nutrition, sleep, cardiorespiratory fitness, or adiposity.

## How to Quantify and Manipulate Specific Behaviors for Health Promotion?

Individuals and populations can engage in a wide variety of behaviors and activities on an hourly and daily basis. Thus, it is challenging to clearly separate out the distinct behavioral determinants and biological effects of short or prolonged sitting accumulation patterns versus other behaviors; such as seated fidgeting, active or passive standing, or more dynamic light- or moderate- to vigorous-intensity activities of various modalities. For example, debates as to whether postural changes alone (ie, passive standing) are a "healthier" alternative to sitting remain somewhat unclear, due in part to historically unclear definitions, inadequate measurement capacities or confounding factors. Although systematic and direct manipulation of specific behaviors in tightly controlled acute "proof-of-concept" human experimental trials (usually hours in duration) with intermediate cardiometabolic risk outcomes is possible, gathering longer-term randomized controlled trial evidence (weeks to months) is a major undertaking with significant cost implications and thus requires adequate justification.

In many instances, it tends to be much easier to generate hypotheses based on observational research than it is to operationalize robust/generalizable experimental tests to simulate these variations in the context of our behaviorally complex daily lives.<sup>30,31</sup> However, as is the case with most behavior-related observational research, measurement error, residual confounding, and reverse-causation are important limitations and challenges in the sedentary behavior field. Thus, while high-quality longer duration randomized controlled trial evidence remains a key priority, it is not without limitations and the previously mentioned factors reemphasize that no single approach will be sufficient to improve our understanding of the mechanisms that may link sedentary behavior with chronic disease. These challenges underscore the need for a variety of different research methods and perspectives, carefully tailored and systematically implemented study designs, along with advanced measurement and analytical approaches; simply put, triangulation of evidence.

## Recent Areas of Interest and Future Directions

#### Measurement Systems and Data Labeling Methods

Accurate measurement remains fundamental for documenting overall levels and accumulation patterns of sedentary time, understanding determinants and dose–response relationships with specific health parameters, and evaluating the efficacy and effectiveness of sedentary-reduction interventions. New questionnaire methods with reasonably valid estimates and contextually rich data (eg, activities completed over time in 24 h<sup>32,33</sup>); emergent device-based technologies<sup>34-36</sup>; and analytic methods show considerable promise in sedentary behavior assessment. In addition, trends toward device miniaturization and longer battery life, and interoperability of existing devices/logs (eg, accelerometers, electromyography, smartphones, global positioning systems, ecological momentary assessment, or domain-specific logs), are making the collection of continuous, timestamped data more accurate and feasible and will no doubt provide unique insights and opportunities in the future. However, challenges remain with reproducibility, attaining compliance with measurement protocols (particularly in large samples), and the development and application of complex analytical methods with high levels of generalizability. Thigh-worn accelerometers (eg, ActivPAL<sup>TM</sup>; PAL Technologies, Glasgow, Scotland) are currently the criterion standard for distinguishing sitting from nonsitting postures in fieldbased studies and are proving valuable in intervention studies to help understand potential unique contributions of different postures and activity types with health outcomes. Population-level studies incorporating thigh-worn accelerometers are, however, much smaller than those which use wrist-worn devices (eg, the UK Biobank Study<sup>37</sup>), in large part due to differences in convenience and cost.<sup>38</sup> In this regard, new collaborative research platforms such as the Prospective Physical Activity, Sitting, and Sleep consortium-which aims to pool together existing and future observational studies of thigh-worn accelerometry-show potential and are currently being developed.39

As wrist- and hip-worn accelerometers are more commonly used in population-level research investigating the activity spectrum, a priority of future research will be to develop new computational methods for processing data to derive valid estimates of posturebased sedentary patterns under free-living conditions. Newer statistical and computational methods aimed at better characterizing sedentary and physically active behaviors from single devices are being developed and tested.<sup>40-42</sup> Alternatives to threshold-based methods of classifying accelerometer "counts" have started to emerge, including those that incorporate machine learning models. For example, in the largest study of its kind to date, Willetts et al<sup>43</sup> used wrist-worn accelerometer data from UK Biobank and applied machine learning methods to identify when participants were sitting, standing, sleeping, bicycling, walking, or exercising. Models were trained in a free-living subsample, rather than constrained laboratory environments, and evaluated against reference wearable cameras,44,45 time-use, and sleep diary information sources (mean accuracy of 87% with a kappa interrater agreement score of .81 over all the behavior types). The ability to infer sitting behaviors at the population scale, along with a variety of other fine-grained activity behaviors such as standing and other activity types, holds great promise for better informing causal inferences about potential health consequences and mechanistic pathways (eg, see "Genetic Epidemiology" section). These algorithms could also be potentially used to classify patient data from clinical trials, but efforts are still required to enhance wider accessibility, scalability at low cost, and greater ease of use for all nonprogrammers/engineers.

#### Future Directions.

- (1) Can subjective and time-stamped data from devices be integrated to more accurately characterize posture, muscle activity, and physical activity types/patterns under different contexts?
- (2) Can the field progress toward the use of accessible, reproducible, large-scale measurement protocols across the entire spectrum of human movement behaviors, to aid prospective harmonization and future consortium-based work?

#### Genetic Epidemiology

The identification of genetic and epigenetic factors related to robustly tagged physical activity and sedentary behavior phenotypes is an emerging research focus<sup>46,47</sup> that may help provide improved causal insights into the complex biological pathways linking both physical activity and sedentary behavior with chronic disease. Findings therefore have the potential to strengthen clinical/public health messages around more specified behaviors and/or inform the development of mechanism-tailored prevention strategies.

Building upon their accelerometer-based behavioral phenotypes validated in free-living environments (using machine learning methods), Doherty et al<sup>47</sup> recently reported results from a large genomewide association study of UK Biobank suggesting that the amount of time spent sedentary (heritability estimate:  $h^2 = 15\%$ ), sleeping  $(h^2 = 19\%)$ , or moving  $(h^2 = 21\%)$  may be partly genetically determined. How sedentary behavior influences epigenetic expression is also just starting to be explored. For example, van Roekel et al<sup>46</sup> recently examined cross-sectional associations of self-reported TV viewing and sitting time with DNA methylation measured in peripheral blood. They found weak evidence  $(P < 1.0 \times 10^{-5})$  for 14 nonoverlapping 5'-C-phosphate-G-3 sites. However, for most (11 of the 14) 5'-C-phosphate-G-3' sites, higher volumes of sedentary behavior were associated with higher methylation levels. This work is of interest as locus-specific blood DNA methylation is hypothesized to be a mediating factor in the contribution of lifestyle components to the development of chronic disease.48

Doherty et al<sup>47</sup> also used *Mendelian randomization*—where genetic variants serve as instrumental variables to estimate whether the risk factor correlated with the genetic variant is causally related to the outcome of interest (eg, Figure 1)<sup>49</sup>—to provide evidence that overall physical activity may causally lower diastolic blood pressure and the odds of hypertension. However, no statistically significant associations were observed for sedentary behavior with any health outcomes. Discovery set sample sizes are, however, currently a limiting factor in these analyses, as genome-wide significant loci currently only explain 0.08% of variation in sedentary behavior. It should be noted that examining causal relationships of physical activity and sedentary behaviors (and their subcomponents) using Mendelian randomization is subject to some limitations at present, including weak instruments (ie, instrumental variables explaining



**Figure 1** — Mendelian randomization models aim to provide a natural experiment (causal estimate), similar to a randomized trial, in observational data, using genetic variants as instrumental variables. Because alleles are allocated randomly at conception, they are theoretically independent of environmental and other confounding factors. Solid pathway lines are theorized to exist; dashed pathway lines are theorized to be nonsignificant according to model assumptions. B<sub>2</sub> indicates the estimated causal relationship (B<sub>2</sub>=B<sub>1</sub>/B<sub>3</sub>). B<sub>1</sub> and B<sub>3</sub> indicate the estimated direct effects of a genetic variant on the exposure (eg, sedentary behavior) and outcome (eg, chronic disease).

a relatively small proportion of variance in sedentary behavior, leading to loss of statistical power and other biases), and the possibility of pleiotropy (ie, genetic variants influencing the outcome via a different biological pathway from sedentary behavior, leading to inaccurate causal estimates and loss of statistical power). Improvements in measurement and behavioral characterization (see "Measurement Systems and Data Labeling Methods" section) may help to reduce some of these issues in the future and help provide further insights. Replication of genome-wide association study findings in more diverse data sets will also be important to progress this field, including further research on how underlying genetic and epigenetic features related to sedentary behavior may influence chronic disease development.

#### Future Directions.

- (1) Can better measurement and data labeling methods help to more strongly distinguish between the genetics of sedentary behavior and physical activity (current genetic correlation = .59)?
- (2) Can better genetic instrument variables be identified to support Mendelian randomization studies of sedentary behavior with disease outcomes?
- (3) Can current genetic and epigenetic discoveries related to sedentary behavior be replicated in other (ie, non-European) populations?

#### **Causal Mediation and Other Analytic Methods**

Observational studies can contribute to a better understanding of the role and relative importance of potential biological pathways linking sedentary behavior to chronic disease by measuring relevant intermediate agents on these pathways and performing formal mediation analysis.<sup>50</sup> Such methods allow for partitioning of an overall association between sedentary behavior and chronic disease into *indirect* effects (ie, the association through the mediator[s] of interest) and *direct* effects (ie, the association not through the mediator)—see Figure 2. This information will not only help to advance our scientific understanding of potential causal pathways and underlying mechanisms but could also help to identify potential targets for intervention-particularly given the challenges of conducting long-term randomized controlled trials. Traditional methods for mediation analysis (ie, the difference and the product methods) that have been available for more than 30 years can be used successfully to assess mediation in simple settings with one mediator of interest, where there is no exposure-mediator interaction, the outcome is continuous or binary and rare, and a number of no confounding assumptions are met.<sup>50</sup> However, recent advancements in methodology and the development of a more sophisticated approach to mediation analysis-broadly referred to as causal mediation analysis-has made it more feasible to investigate more complex settings. These new methods are rooted in the counterfactual view of causation and allow partitioning of the overall association for any type of outcome under the same no confounding assumptions required by the traditional methods, and in the presence of exposuremediator interaction.<sup>50</sup> It is important to note that causal mediation analysis methods, similar to other statistical methods, make important assumptions about the causal structure of the associations between variables (ie, temporality). For example, determining whether adiposity or physical function confounds or mediates the association (ie, is in the causal pathway) of sedentary behavior and chronic disease when measured cross-sectionally is challenging and generally requires strong *a priori* assumptions (Figure 3A).

#### Future Directions.

- (1) Can contemporary mediation analysis approaches provide new and important insights on potential mechanistic pathways linking sedentary behavior with chronic disease outcomes?
- (2) Can more advanced causal mediation analysis methods improve inferences about the causal structure of associations between sedentary behavior and chronic disease outcomes (Figure 3B) while accounting for multiple mediators that influence or interact with each other<sup>51–54</sup> over repeated measurements.
- (3) Can the integration of causal mediation with additional approaches such as compositional or isotemporal paradigms<sup>19–22</sup> provide useful information when considering interdependencies



**Figure 2** — Mediation of the association between sedentary behavior and chronic disease, using chronic inflammation as a theoretical example. Panels A, B, and C illustrate the partitioning of total, indirect, and direct effects.



**Figure 3** — DAG of the association between SB and chronic disease, through potentially similar and distinct pathways to MVPA. Variables are labeled as exposure (green in online; SB), outcome (red in online; chronic disease), mediators (purple in online; M), confounders (white in online; C), or unmeasured confounders (blue in online; U). Theoretical examples of adiposity and physical function are used—which may plausibly be confounders or mediators alongside other potential risk factors in the pathway, such as IR, HTN, and chronic INF. Assumptions and challenges are noted in the black boxes. Causal mediation analyses would ideally be applied using data from multiple waves of follow-up to improve causal inferences (ie, panels A to B; time-points T1 $\rightarrow$ T3). It may also be relevant to consider and integrate inevitable interdependencies, effect modification, and/or interactions between multiple behaviors, as part of the broader causal structure of associations (panel C). DAG indicates directed acyclic graphs; HTN, hypertension; INF, inflammation; IR, insulin resistance; LIPA, light-intensity physical activity (including standing); MVPA, moderate-to-vigorous-intensity physical activity; SB, sedentary behavior.

between sedentary behavior and other competing behaviors (ie, physical activity and sleep) that make up the 24-hour day (Figure 3C)?

#### **Experimental Studies**

Experimental evidence from controlled laboratory trials and free-living intervention studies is crucial in providing a better understanding of biological plausibility, the causal structure of relationships, and potential mechanistic pathways linking sedentary behavior with adverse health outcomes. Building on the findings of observational studies, well-controlled human experimental studies are beginning to examine the physiological impact of prolonged uninterrupted sitting time relative to sitting interrupted by various countermeasures (eg, standing, light- to moderate-intensity walking, upper and lower body cycling/pedaling, and even body-weight resistance activities). Studies like these can provide useful physio-logical insights as well as help illuminate pragmatic "proof-of-concept" questions and hypotheses such as: "Is just standing enough, or do I need to move/ambulate more?" "Do I need to stand if I have a pedal desk?" "How long can I sit for?" "What mode of 'activity break' should I do and at what intensity?" or "If I cycle or run on my commute, can I afford to sit more at work?"

The findings of these recent studies have already been reviewed elsewhere in greater detail<sup>12,24,25,55–57</sup>—with emerging areas of interest and potential mechanisms underlying various

chronic disease outcomes also reviewed in those particular contexts. As a brief summary, hypothesized mechanisms (notably, still based largely on inactivity physiology paradigms, see Figure 4) include systemic/habitual reductions in both muscular/metabolic demand and blood flow/shear stress, muscle atrophy, postmeal nutrient loading, decreased lipid trafficking/oxidation, and concurrent decrements in muscle/liver insulin sensitivity and vascular function-all of which, in turn, would likely promote whole-body insulin resistance, intraorgan lipotoxicity (or ectopic fat storage), decreased mitochondrial oxidative capacity, oxidative stress, low-grade inflammatory cascades, and interorgan metabolic signaling. Peripheral<sup>58–62</sup> and cerebrovascular hemodynamics63,64 and perturbations in sympathetic regulation<sup>65</sup> may also be implicated, but these are harder to measure well in human intervention studies, and, thus the evidence base remains scant. Nevertheless, when sedentary behavior is habitual, it is likely that the above factors contribute to the development of clinical risk factors-such as hyperglycemia, dyslipidemia, and hypertension-promoting vascular damage and progression toward serious metabolic and cardiovascular complications, and the exacerbation of other chronic diseases. Much more research is still needed, however, to elucidate both direct and indirect pathophysiological consequences over the short and long term as well as the potential mechanisms involved.

#### Future Directions.

(1) Are the specific *physiological effects* of sedentary (sitting) behaviors, if apparent, mediated predominantly by local/systemic skeletal muscle inactivity or by seated postures per se, and what is the likely importance of these mechanisms for disease-specific pathologies (eg, dysmetabolism, vascular)



**Figure 4** — Hypothesized mechanisms linking sedentary behavior with chronic disease risk factors. Underlying biological responses to sedentary behavior/inactivity that may drive disease pathophysiology are likely to be multifactorial, involving peripheral organs that are known to play a key role in metabolism (ie, skeletal muscle, liver, and adipose tissue), SNS activity and peripheral/cerebrovascular hemodynamics, and oxidative stress and inflammatory signaling pathways. Dose–response relationships are likely to vary according to specific mechanisms and organ-specific pathways, and their interaction over the short and longer term. SNS indicates sympathetic nervous system.

dysfunction, cognition, central and peripheral neural effects, etc)?

- (2) What activity interventions or postural perturbations from sedentary behavior (eg, frequency, length, and type/mode of activity) are required to favorably alter physiology over the short (eg, 1–7 d) and longer term (weeks to months) in both controlled and real-life settings, in *whom* (eg, women, obese, unfit, etc), and under what *contexts/settings* (eg, relative to meal timing, while in energy deficit/surplus, in the workplace, under stress, while sleep deprived)?
- (3) What other nontraditional cardiometabolic risk markers, cellular or molecular mechanisms, and organ-specific pathways are affected by acute and habitual sedentary behavior patterns, and how do these local (eg, muscle, adipose tissue) and systemic (eg, metabolic, inflammatory) physiological effects integrate to elicit pathophysiological consequences?

#### Behavioral and Biological Determinants/ Mechanisms

Although the focus of this paper has primarily been on biological pathways linking sedentary behavior and chronic disease, there remain many important behavioral determinants to better understand and elucidate. Significant knowledge gaps and ambiguity still exist concerning the individual, social, and environmental factors that influence sedentary behavior.<sup>66,67</sup> Most studies to date have examined correlates rather than determinants—limiting inferences about causality and underlying behavioral mechanisms. A more thorough and systematic approach to studying the determinants and behavioral mechanisms that influence sedentary behavior (ie, as a dependent variable rather than an independent variable or mediator of change) is needed to design more specific, targeted, and effective interventions. However, this important phase is sometimes bypassed and progressed to designing interventions when there is insufficient evidence to help identify the factors that may be most beneficial to target.<sup>68,69</sup>

It has been argued that the ubiquitous, habitual, and socially/ environmentally reinforced nature of sedentary behaviors may point to unique determinants that are distinct from traditional strategies used to increase MVPA participation.<sup>66,70-72</sup> While individual-level theories for MVPA tend to focus on the role of conscious decision-making or reflective processes (which are usually finite<sup>73</sup>), approaches targeting sedentary behavior may need to allow for more emphasis on unconscious decision-making or automatic/impulsive processes (ie, cues/nudges/habits)-which tend to govern a substantial share of our behavior.74-76 Moreover, research examining where and why people are sedentary (and its temporal dimensions within and between individuals) may help to identify both macroenvironmental and microenvironmental factors and contextual cues to target (eg, combinations of environment/ location, physical objects, time of day, emotional state)-some of which may be more amenable to behavioral and policy changes than others. Consideration of these factors will be crucial in informing the design and implementation of effective, evidencebased interventions to reduce sedentary time.

It may be justifiable that sociocultural, motivational, and environmental factors tend to receive the greatest focus when seeking to intervene on sedentary behavior. However, as mentioned previously (see "Genetic Epidemiology" section), there remains a paucity of evidence on which intrinsic biological factors are important determinants or regulators of sedentary behavior (and physical activity). Indeed, a growing body of research in both humans and animals suggests that intrinsic biological factors also play a key role in the regulation of daily physical activity.<sup>77–83</sup> These may include influences on brain circuitry related to personality, affect regulation, relative reinforcing, and reward processing, or via influencing cardiorespiratory and muscle capacity/function to regularly engage in physical activity. These elements are likely to also interact with self-efficacy and other core components of social–behavioral models for both physical activity and sedentary behaviors<sup>84</sup>; thus, is it important that they are better integrated to improve our understanding of the overall scientific picture. Additional biological factors and pathways that could be worthwhile to explore further in the context of sedentary and physical activity behaviors (and our ability to intervene or identify therapeutic strategies) could include epigenetic events, early life experiences, and biological intermediates such as dietary, stress, and toxicant/ pollution exposures.

#### Future Directions.

- (1) Can important behavioral and biological determinants or regulators of sedentary behavior be identified more rigorously and better understood within different contexts?
- (2) Can the efficacy and effectiveness of behavioral interventions, guided by underlying biological and behavioral determinants and theories and behavior-change techniques, be improved through a better understanding of *when*, *where*, and *why* different people engage in sedentary behaviors?

### Conclusion

In this paper, we have described several major unanswered research questions concerning the observed associations of sedentary behavior with adverse health outcomes. The etiological and mechanistic factors underlying such associations are multiple, complex, and challenging to study. However, a deeper causal and mechanistic understanding remains an important scientific endeavor to help advance the field and improve chronic disease prevention and management. There is a need to acknowledge these inherent complexities and carefully seek to better understand them through the application of rigorous interdisciplinary science. Triangulation of evidence from observational, biological, behavioral, and experimental research will be essential. Moreover, improvements and refinements in measurement methods, research-designs, and statistical analysis techniques will also contribute greatly to our understanding of whether, how, and why sedentary behavior is causally related to chronic disease. Advances in these areas will allow for more meaningful conclusions on the relationship between sedentary behavior and chronic disease and assist in refining both clinical and public health policies and recommendations in the future.

#### Acknowledgments

This work was supported by the UK Medical Research Council (grant number MC\_UU\_12015/3 and MC\_UU\_12015/1). P.C.D. and D.W.D. are supported by National Health and Medical Research Council of Australia (NHMRC) Fellowships (nos. 1142685 and 1078360). E.H.R. was financially supported by Wereld Kanker Onderzoek Fonds (WKOF), as part of the World Cancer Research Fund International grant program (grant number 2016/1620). B.M.L. is supported by a Mid-Career Research Fellowship from the Victorian Cancer Agency. A.R.D. is supported by the National Institute for Health Research (NIHR) Oxford Biomedical Research Centre (BRC). The views expressed are those of the author(s) and not necessarily those of the UK National Health Service, NIHR, or Department of Health.

## References

- Tremblay MS, Aubert S, Barnes JD, et al. Sedentary behavior research network (SBRN)—terminology consensus project process and outcome. *Int J Behav Nutr Phys Act.* 2017;14(1):75. PubMed ID: 28599680 doi:10.1186/s12966-017-0525-8
- Matthews CE, Chen KY, Freedson PS, et al. Amount of time spent in sedentary behaviors in the United States, 2003–2004. *Am J Epidemiol.* 2008;167(7):875–881. PubMed ID: 18303006 doi:10.1093/aje/ kwm390
- Hagstromer M, Troiano RP, Sjostrom M, Berrigan D. Levels and patterns of objectively assessed physical activity—a comparison between Sweden and the United States. *Am J Epidemiol*. 2010;171(10): 1055–1064. PubMed ID: 20406758 doi:10.1093/aje/kwq069
- 4. Dempsey PC, Owen N, Biddle SJ, Dunstan DW. Managing sedentary behavior to reduce the risk of diabetes and cardiovascular disease. *Curr Diabetes Rep.* 2014;14(9):522. doi:10.1007/s11892-014-0522-0
- Powell KE, King AC, Buchner DM, et al. The scientific foundation for the Physical Activity Guidelines for Americans, 2nd edition. J Phys Act Health. 2018;17:1–11. PubMed ID: 30558473 doi:10.1123/ jpah.2018-0618
- 6. Patterson R, McNamara E, Tainio M, et al. Sedentary behaviour and risk of all-cause, cardiovascular and cancer mortality, and incident type 2 diabetes: a systematic review and dose response meta-analysis. *Eur J Epidemiol.* 2018;33(9):811–829. PubMed ID: 29589226. doi:10.1007/s10654-018-0380-1.
- Ekelund U, Brown WJ, Steene-Johannessen J, et al. Do the associations of sedentary behaviour with cardiovascular disease mortality and cancer mortality differ by physical activity level? A systematic review and harmonised meta-analysis of data from 850 060 participants. *Br J Sports Med.* 2019;53(14):886–894. doi:10.1136/bjsports-2017-098963
- Ekelund U, Steene-Johannessen J, Brown WJ, et al. Does physical activity attenuate, or even eliminate, the detrimental association of sitting time with mortality? A harmonised meta-analysis of data from more than 1 million men and women. *Lancet*. 2016;388(10051): 1302–1310. PubMed ID: 27475271 doi:10.1016/S0140-6736(16) 30370-1
- Bellettiere J, LaMonte MJ, Evenson KR, et al. Sedentary behavior and cardiovascular disease in older women: the objective physical activity and cardiovascular health (OPACH) study. *Circulation*. 2019;139(8):1036–1046. PubMed ID: 31031411 doi:10.1161/ CIRCULATIONAHA.118.035312
- Diaz KM, Howard VJ, Hutto B, et al. Patterns of sedentary behavior and mortality in U.S. middle-aged and older adults: a national cohort study. *Ann Intern Med.* 2017;167(7):465–475. PubMed ID: 28892811 doi:10.7326/M17-0212
- Bellettiere J, Winkler EAH, Chastin SFM, et al. Associations of sitting accumulation patterns with cardio-metabolic risk biomarkers in Australian adults. *PLoS One*. 2017;12(6):e0180119. PubMed ID: 28662164 doi:10.1371/journal.pone.0180119
- Saunders TJ, Atkinson HF, Burr J, MacEwen B, Skeaff CM, Peddie MC. The acute metabolic and vascular impact of interrupting prolonged sitting: a systematic review and meta-analysis. *Sports Med*. 2018;48(10):2347–2366. doi:10.1007/s40279-018-0963-8
- Piercy KL, Troiano RP, Ballard RM, et al. The physical activity guidelines for Americans. *JAMA*. 2018;320(19):2020–2028. PubMed ID: 30418471 doi:10.1001/jama.2018.14854
- Lawlor DA, Tilling K, Davey Smith G. Triangulation in aetiological epidemiology. *Int J Epidemiol*. 2016;45(6):1866–1886. PubMed ID: 28108528

- Munafo MR, Davey Smith G. Robust research needs many lines of evidence. *Nature*. 2018;553(7689):399–401. PubMed ID: 29368721 doi:10.1038/d41586-018-01023-3
- Wade KH, Richmond RC, Davey Smith G. Physical activity and longevity: how to move closer to causal inference. *Br J Sports Med.* 2018;52(14):890–891. PubMed ID: 29545236 doi:10.1136/bjsports-2017-098995
- Stamatakis E, Ekelund U, Ding D, Hamer M, Bauman AE, Lee IM. Is the time right for quantitative public health guidelines on sitting? A narrative review of sedentary behaviour research paradigms and findings. *Br J Sports Med.* 2019;53(6):377–382. PubMed ID: 29891615 doi:10.1136/bjsports-2018-099131
- van der Ploeg HP, Hillsdon M. Is sedentary behaviour just physical inactivity by another name? *Int J Behav Nutr Phys Act.* 2017;14(1):142. PubMed ID: 29058587 doi:10.1186/s12966-017-0601-0
- Chastin SF, Palarea-Albaladejo J, Dontje ML, Skelton DA. Combined effects of time spent in physical activity, sedentary behaviors and sleep on obesity and cardio-metabolic health markers: a novel compositional data analysis approach. *PLoS One*. 2015;10(10):e0139984. PubMed ID: 26461112 doi:10.1371/journal.pone.0139984
- 20. Pedišić Ž, Dumuid D, Olds T. Integrating sleep, sedentary behaviour, and physical activity research in the emerging field of time-use epidemiology: definitions, concepts, statistical methods, theoretical framework, and future directions. *Kinesiology*. 2017;49(2):10–11.
- Dumuid D, Pedisic Z, Stanford TE, et al. The compositional isotemporal substitution model: a method for estimating changes in a health outcome for reallocation of time between sleep, physical activity and sedentary behaviour. *Stat Methods Med Res.* 2019;28(3):846–857. PubMed ID: 29157152 doi:10.1177/0962280217737805
- Dumuid D, Stanford TE, Martin-Fernandez JA, et al. Compositional data analysis for physical activity, sedentary time and sleep research. *Stat Methods Med Res.* 2018;27(12):3726–3738. PubMed ID: 28555522 doi:10.1177/0962280217710835
- Winkler EAH, Chastin S, Eakin EG, et al. Cardiometabolic impact of changing sitting, standing, and stepping in the workplace. *Med Sci Sports Exerc.* 2018;50(3):516–524. PubMed ID: 29166319 doi:10. 1249/MSS.000000000001453
- 24. Dempsey PC, Larsen RN, Dunstan DW, Owen N, Kingwell BA. Sitting less and moving more: implications for hypertension. *Hypertension*. 2018;72(5):1037–1046. PubMed ID: 30354827 doi:10.1161/ HYPERTENSIONAHA.118.11190
- Dempsey PC, Owen N, Yates TE, Kingwell BA, Dunstan DW. Sitting less and moving more: improved glycaemic control for type 2 diabetes prevention and management. *Curr Diabetes Rep.* 2016; 16(11):114. doi:10.1007/s11892-016-0797-4
- 26. Hamilton MT. The role of skeletal muscle contractile duration throughout the whole day: reducing sedentary time and promoting universal physical activity in all people. *J Physiol.* 2018;596(8): 1331–1340. PubMed ID: 28657123 doi:10.1113/JP273284
- 27. Hamilton MT, Hamilton DG, Zderic TW. Role of low energy expenditure and sitting in obesity, metabolic syndrome, type 2 diabetes, and cardiovascular disease. *Diabetes*. 2007;56(11):2655–2667. PubMed ID: 17827399 doi:10.2337/db07-0882
- Duvivier B, Bolijn JE, Koster A, Schalkwijk CG, Savelberg H, Schaper NC. Reducing sitting time versus adding exercise: differential effects on biomarkers of endothelial dysfunction and metabolic risk. *Sci Rep.* 2018;8(1):8657. PubMed ID: 29872225 doi:10.1038/ s41598-018-26616-w
- Bergouignan A, Rudwill F, Simon C, Blanc S. Physical inactivity as the culprit of metabolic inflexibility: evidences from bed-rest studies. *J Appl Physiol.* 2011;111(4):1201–1210. PubMed ID: 21836047 doi:10.1152/japplphysiol.00698.2011

- Matthews CE, Moore SC, Sampson J, et al. Mortality benefits for replacing sitting time with different physical activities. *Med Sci Sports Exerc*. 2015;47(9):1833–1840. PubMed ID: 25628179 doi:10. 1249/MSS.00000000000621
- Wijndaele K, Sharp SJ, Wareham NJ, Brage S. Mortality risk reductions from substituting screen time by discretionary activities. *Med Sci Sports Exerc.* 2017;49(6):1111–1119. PubMed ID: 28106621 doi:10.1249/MSS.000000000001206
- Matthews CE, Kozey Keadle S, Moore SC, et al. Measurement of active and sedentary behavior in context of large epidemiologic studies. *Med Sci Sports Exerc.* 2018;50(2):266–276. PubMed ID: 28930863 doi:10.1249/MSS.000000000001428
- Matthews CE, Keadle SK, Berrigan D, et al. Influence of accelerometer calibration approach on moderate-vigorous physical activity estimates for adults. *Med Sci Sports Exerc*. 2018;50(11):2285– 2291. PubMed ID: 29933344 doi:10.1249/MSS.000000000001691
- Tikkanen O, Haakana P, Pesola AJ, et al. Muscle activity and inactivity periods during normal daily life. *PLoS One*. 2013;8(1): e52228. PubMed ID: 23349681 doi:10.1371/journal.pone.0052228
- Wang S, Xu J, Wang W, et al. Skin electronics from scalable fabrication of an intrinsically stretchable transistor array. *Nature*. 2018;555(7694):83–88. PubMed ID: 29466334 doi:10.1038/ nature25494
- Kuster RP, Huber M, Hirschi S, et al. Measuring sedentary behavior by means of muscular activity and accelerometry. *Sensors*. 2018; 18(11):4010. doi:10.3390/s18114010
- Wijndaele K, Westgate K, Stephens SK, et al. Utilization and harmonization of adult accelerometry data: review and expert consensus. *Med Sci Sports Exerc*. 2015;47(10):2129–2139. PubMed ID: 25785929 doi:10.1249/MSS.00000000000661
- Doherty A, Jackson D, Hammerla N, et al. Large scale population assessment of physical activity using wrist worn accelerometers: the UK biobank study. *PLoS One*. 2017;12(2):e0169649. PubMed ID: 28146576 doi:10.1371/journal.pone.0169649
- 39. Stamatakis E, Koster A, Hamer M, et al. Emerging collaborative research platforms for the next generation of physical activity, sleep and exercise medicine guidelines: the Prospective Physical Activity, Sitting, and Sleep consortium (ProPASS) [published online ahead of print May 10, 2019]. Br J Sports Med. PubMed ID: 31076396 doi:10. 1136/bjsports-2019-100786
- Rowlands AV, Yates T, Olds TS, Davies M, Khunti K, Edwardson CL. Sedentary sphere: wrist-worn accelerometer-brand independent posture classification. *Med Sci Sports Exerc.* 2016;48(4):748–754. PubMed ID: 26559451 doi:10.1249/MSS.00000000000813
- Rowlands AV, Olds TS, Hillsdon M, et al. Assessing sedentary behavior with the GENEActiv: introducing the sedentary sphere. *Med Sci Sports Exerc*. 2014;46(6):1235–1247. PubMed ID: 24263980 doi:10.1249/MSS.00000000000224
- 42. Kerr J, Carlson J, Godbole S, Cadmus-Bertram L, Bellettiere J, Hartman S. Improving hip-worn accelerometer estimates of sitting using machine learning methods. *Med Sci Sports Exerc*. 2018;50(7):1518–1524. PubMed ID: 29443824 doi:10.1249/MSS. 0000000000001578
- Willetts M, Hollowell S, Aslett L, Holmes C, Doherty A. Statistical machine learning of sleep and physical activity phenotypes from sensor data in 96,220 UK Biobank participants. *Sci Rep.* 2018;8(1):7961. PubMed ID: 29784928 doi:10.1038/s41598-018-26174-1
- 44. Kerr J, Marshall SJ, Godbole S, et al. Using the SenseCam to improve classifications of sedentary behavior in free-living settings. *Am J Prev Med.* 2013;44(3):290–296. PubMed ID: 23415127 doi:10.1016/j. amepre.2012.11.004

- 45. Doherty AR, Hodges SE, King AC, et al. Wearable cameras in health: the state of the art and future possibilities. *Am J Prev Med.* 2013; 44(3):320–323. PubMed ID: 23415132 doi:10.1016/j.amepre.2012. 11.008
- 46. van Roekel E, Dugue PA, Jung CH, et al. Physical activity, television viewing time, and DNA methylation in peripheral blood. *Med Sci Sports Exerc.* 2019;51(3):490–498. PubMed ID: 30376510 doi:10. 1249/MSS.000000000001827
- Doherty A, Smith-Byrne K, Ferreira T, et al. GWAS identifies 14 loci for device-measured physical activity and sleep duration. *Nat Commun.* 2018;9(1):5257. PubMed ID: 30531941 doi:10.1038/s41467-018-07743-4
- Geurts YM, Dugue PA, Joo JE, et al. Novel associations between blood DNA methylation and body mass index in middle-aged and older adults. *Int J Obes.* 2018;42(4):887–896. doi:10.1038/ijo. 2017.269
- Davies NM, Holmes MV, Davey Smith G. Reading Mendelian randomisation studies: a guide, glossary, and checklist for clinicians. *BMJ*. 2018;362:k601. PubMed ID: 30002074 doi:10.1136/bmj.k601
- VanderWeele TJ. Mediation analysis: a practitioner's guide. Ann Rev Public Health. 2016;37:17–32. doi:10.1146/annurev-publhealth-032315-021402
- Vansteelandt S, Daniel RM. Interventional effects for mediation analysis with multiple mediators. *Epidemiology*. 2017;28(2):258– 265. PubMed ID: 27922534 doi:10.1097/EDE.00000000000596
- Shpitser I, VanderWeele TJ. A complete graphical criterion for the adjustment formula in mediation analysis. *Int J Biostat.* 2011;7(1): 1–24. PubMed ID: 21556286 doi:10.2202/1557-4679.1297
- Lin SH, Young JG, Logan R, VanderWeele TJ. Mediation analysis for a survival outcome with time-varying exposures, mediators, and confounders. *Stat Med.* 2017;36(26):4153–4166. PubMed ID: 28809051 doi:10.1002/sim.7426
- 54. Lin SH, Young J, Logan R, Tchetgen Tchetgen EJ, VanderWeele TJ. Parametric mediational g-formula approach to mediation analysis with time-varying exposures, mediators, and confounders. *Epidemiology*. 2017;28(2):266–274. PubMed ID: 27984420 doi:10.1097/ EDE.00000000000000609
- Benatti FB, Ried-Larsen M. The effects of breaking up prolonged sitting time: a review of experimental studies. *Med Sci Sports Exerc*. 2015;47(10):2053–2061. PubMed ID: 26378942 doi:10.1249/MSS. 000000000000654
- Dempsey PC, Thyfault JP. Physiological responses to sedentary behaviour. In: Leitzmann MF, Jochem C, Schmid D, eds. *Sedentary Behaviour Epidemiology*. Cham, Switzerland: Springer International Publishing; 2018:109–153.
- 57. Loh R, Stamatakis E, Folkerts D, Allgrove JE, Moir HJ. Effects of interrupting prolonged sitting with physical activity breaks on blood glucose, insulin and triacylglycerol measures: a systematic review and meta-analysis [published online ahead of print September 24, 2019]. *Sports Med.* PubMed ID: 31552570 doi:10.1007/s40279-019-01183-w
- 58. Climie RE, Wheeler MJ, Grace M, et al. Simple intermittent resistance activity mitigates the detrimental effect of prolonged unbroken sitting on arterial function in overweight and obese adults [published online ahead of print September 6, 2018]. *J Appl Physiol*. PubMed ID: 30188800 doi:10.1152/japplphysiol.00544.2018
- Credeur DP, Miller SM, Jones R, et al. Impact of prolonged sitting on peripheral and central vascular health. *Am J Cardiol.* 2019;123(2): 260–266. PubMed ID: 30409414 doi:10.1016/j.amjcard.2018.10.014
- Morishima T, Restaino RM, Walsh LK, Kanaley JA, Fadel PJ, Padilla J. Prolonged sitting-induced leg endothelial dysfunction is prevented by fidgeting. *Am J Physiol Heart Circ Physiol*. 2016;311(1):H177– H182. PubMed ID: 27233765 doi:10.1152/ajpheart.00297.2016

- Restaino RM, Holwerda SW, Credeur DP, Fadel PJ, Padilla J. Impact of prolonged sitting on lower and upper limb micro- and macrovascular dilator function. *Exp Physiol.* 2015;100(7):829–838. PubMed ID: 25929229 doi:10.1113/EP085238
- Thorp AA, Owen N, Neuhaus M, Dunstan DW. Sedentary behaviors and subsequent health outcomes in adults a systematic review of longitudinal studies, 1996–2011. *Am J Prev Med.* 2011; 41(2):207–215. PubMed ID: 21767729 doi:10.1016/j.amepre.2011. 05.004
- Carter SE, Draijer R, Holder SM, Brown L, Thijssen DHJ, Hopkins ND. Regular walking breaks prevent the decline in cerebral blood flow associated with prolonged sitting. *J Appl Physiol*. 2018;125(3): 790–798. doi:10.1152/japplphysiol.00310.2018
- Wheeler MJ, Dunstan DW, Smith B, et al. Morning exercise mitigates the impact of prolonged sitting on cerebral blood flow in older adults. *J Appl Physiol.* 2019;126(4):1049–1055. doi:10.1152/japplphysiol. 00001.2019
- 65. Dempsey PC, Sacre JW, Larsen RN, et al. Interrupting prolonged sitting with brief bouts of light walking or simple resistance activities reduces resting blood pressure and plasma noradrenaline in type 2 diabetes. J Hypertens. 2016;34(12):2376–2382. PubMed ID: 27512975 doi:10.1097/HJH.000000000001101
- 66. De Craemer M, Chastin S, Ahrens W, et al. Data on determinants are needed to curb the sedentary epidemic in Europe. Lessons learnt from the DEDIPAC European knowledge hub. *Int J Environ Res Public Health.* 2018;15(7):1406. doi:10.3390/ijerph15071406
- 67. Chastin SF, De Craemer M, Lien N, et al. The SOS-framework (Systems of Sedentary behaviours): an international transdisciplinary consensus framework for the study of determinants, research priorities and policy on sedentary behaviour across the life course: a DEDIPAC-study. *Int J Behav Nutr Phys Act.* 2016;13:83. PubMed ID: 27421750 doi:10.1186/s12966-016-0409-3
- Michie S, Thomas J, Johnston M, et al. The human behaviour-change project: harnessing the power of artificial intelligence and machine learning for evidence synthesis and interpretation. *Implement Sci.* 2017;12(1):121. PubMed ID: 29047393 doi:10.1186/s13012-017-0641-5
- Michie S, Richardson M, Johnston M, et al. The behavior change technique taxonomy (v1) of 93 hierarchically clustered techniques: building an international consensus for the reporting of behavior change interventions. *Ann Behav Med.* 2013;46(1):81–95. PubMed ID: 23512568 doi:10.1007/s12160-013-9486-6
- 70. Biddle S, Gorely T. Sitting psychology: towards a psychology of sedentary behaviour. In: Papaioannou AG, Hackfort D, eds. *Routledge Companion to Sport and Exercise Psychology: Global Perspectives and Fundamental Concepts*. East Sussex, UK: Routledge; 2014:720–740.
- 71. Owen N, Sugiyama T, Eakin EE, Gardiner PA, Tremblay MS, Sallis JF. Adults' sedentary behavior determinants and interventions. *Am J Prev Med*. 2011;41(2):189–196. PubMed ID: 21767727 doi:10. 1016/j.amepre.2011.05.013
- Koohsari MJ, Sugiyama T, Sahlqvist S, Mavoa S, Hadgraft N, Owen N. Neighborhood environmental attributes and adults' sedentary behaviors: review and research agenda. *Prev Med.* 2015;77:141–149. PubMed ID: 26051198 doi:10.1016/j.ypmed.2015.05.027
- 73. Inzlicht M, Schmeichel BJ. What is ego depletion? Toward a mechanistic revision of the resource model of self-control. *Pers Psychol Sci.* 2012;7(5):450–463. doi:10.1177/1745691612454134
- 74. Marteau TM, Hollands GJ, Fletcher PC. Changing human behavior to prevent disease: the importance of targeting automatic processes. *Science*. 2012;337(6101):1492–1495. PubMed ID: 22997327 doi:10. 1126/science.1226918

- 75. Marteau TM. Changing minds about changing behaviour. *Lancet.* 2018;391(10116):116–117. doi:10.1016/S0140-6736(17) 33324-X
- 76. Maher JP, Conroy DE. A dual-process model of older adults' sedentary behavior. *Health Psychol.* 2016;35(3):262–272. PubMed ID: 26690644 doi:10.1037/hea0000300
- 77. Bauman AE, Reis RS, Sallis JF, et al. Correlates of physical activity: why are some people physically active and others not? *Lancet*. 2012;380(9838):258–271. PubMed ID: 22818938 doi:10.1016/ S0140-6736(12)60735-1
- Bowen RS, Turner MJ, Lightfoot JT. Sex hormone effects on physical activity levels: why doesn't Jane run as much as Dick? *Sports Med*. 2011;41(1):73–86. PubMed ID: 21142285 doi:10.2165/11536860-000000000-00000
- Joosen AM, Gielen M, Vlietinck R, Westerterp KR. Genetic analysis of physical activity in twins. *Am J Clin Nutr*. 2005;82(6):1253–1259. PubMed ID: 16332658 doi:10.1093/ajcn/82.6.1253
- Lightfoot JT, DEGeus EJC, Booth FW, et al. Biological/genetic regulation of physical activity level: consensus from GenBioPAC.

*Med Sci Sports Exerc*. 2018;50(4):863–873. PubMed ID: 29166322 doi:10.1249/MSS.000000000001499

- Garland T Jr, Schutz H, Chappell MA, et al. The biological control of voluntary exercise, spontaneous physical activity and daily energy expenditure in relation to obesity: human and rodent perspectives. *J Exp Biol.* 2011;214(pt 2):206–229. PubMed ID: 21177942 doi:10. 1242/jeb.048397
- Cheval B, Radel R, Neva JL, et al. Behavioral and neural evidence of the rewarding value of exercise behaviors: a systematic review. *Sports Med.* 2018;48(6):1389–1404. PubMed ID: 29556981 doi:10.1007/ s40279-018-0898-0
- Cheval B, Tipura E, Burra N, et al. Avoiding sedentary behaviors requires more cortical resources than avoiding physical activity: an EEG study. *Neuropsychologia*. 2018;119:68–80. PubMed ID: 30056055 doi:10.1016/j.neuropsychologia.2018.07.029
- 84. Bryan AD, Jakicic JM, Hunter CM, Evans ME, Yanovski SZ, Epstein LH. Behavioral and psychological phenotyping of physical activity and sedentary behavior: implications for weight management. *Obesity*. 2017;25(10):1653–1659. doi:10.1002/oby.21924