ARTICLE



Timing of physical activity in relation to liver fat content and insulin resistance

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Received: 1 July 2022 / Accepted: 8 September 2022 / Published online: 1 November 2022 © The Author(s) 2022

Abstract

Aims/hypothesis We hypothesised that the insulin-sensitising effect of physical activity depends on the timing of the activity. Here, we examined cross-sectional associations of breaks in sedentary time and timing of physical activity with liver fat content and insulin resistance in a Dutch cohort.

Methods In 775 participants of the Netherlands Epidemiology of Obesity (NEO) study, we assessed sedentary time, breaks in sedentary time and different intensities of physical activity using activity sensors, and liver fat content by magnetic resonance spectroscopy (*n*=256). Participants were categorised as being most active in the morning (06:00–12:00 hours), afternoon (12:00–18:00 hours) or evening (18:00–00:00 hours) or as engaging in moderate-to-vigorous-physical activity (MVPA) evenly distributed throughout the day. Most active in a certain time block was defined as spending the majority (%) of total daily MVPA in that block. We examined associations between sedentary time, breaks and timing of MVPA with liver fat content and HOMA-IR using linear regression analyses, adjusted for demographic and lifestyle factors including total body fat. Associations of timing of MVPA were additionally adjusted for total MVPA.

Results The participants (42% men) had a mean (SD) age of 56 (4) years and a mean (SD) BMI of 26.2 (4.1) kg/m². Total sedentary time was not associated with liver fat content or insulin resistance, whereas the amount of breaks in sedentary time was associated with higher liver fat content. Total MVPA (-5%/h [95% CI -10%/h, 0%/h]) and timing of MVPA were associated with reduced insulin resistance but not with liver fat content. Compared with participants who had an even distribution of MVPA throughout the day, insulin resistance was similar (-3% [95% CI -25%, 16%]) in those most active in morning, whereas it was reduced in participants who were most active in the afternoon (-18% [95% CI -33%, -2%]) or evening (-25% [95% CI -49%, -4%]).

Conclusions/interpretation The number of daily breaks in sedentary time was not associated with lower liver fat content or reduced insulin resistance. Moderate-to-vigorous activity in the afternoon or evening was associated with a reduction of up to 25% in insulin resistance. Further studies should assess whether timing of physical activity is also important for the occurrence of type 2 diabetes.

Keywords Epidemiology · Insulin resistance · Liver fat · Physical activity · Sedentary behaviour · Sedentary breaks · Timing

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Abbreviations

¹H-MRS Proton magnetic resonance spectroscopy ISI Insulin sensitivity index **LPA** Light physical activity **LUMC** Leiden University Medical Center **MET** Metabolic equivalents of task **MVPA** Moderate-to-vigorous-physical activity **NAFLD** Non-alcoholic fatty liver disease **NEO** Netherlands Epidemiology of Obesity **PAEE** Physical activity energy expenditure



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Research in context

What is already known about this subject?

 Sedentary behaviour has been associated with increased risk of metabolic diseases, including type 2 diabetes, whereas frequent breaks in sedentary time have been associated with a better cardiometabolic profile, including lower triacylglycerol and blood glucose

- Moderate-to-vigorous-physical activity (MVPA) has been shown to lower liver fat content and thereby improve
 insulin sensitivity
- In addition to total physical activity, the timing of physical activity may be important for metabolic health and glucose homeostasis

What is the key question?

Are breaks in sedentary time and timing of MVPA associated with reduced liver fat content and insulin resistance?

What are the new findings?

- A lower amount of sedentary time and the number of daily breaks in sedentary time were not associated with reduced liver fat content and insulin resistance
- Timing of MVPA was not associated with liver fat content
- MVPA in the afternoon or evening was associated with a reduction of up to 25% in insulin resistance compared with an even distribution of MVPA throughout the day

How might this impact on clinical practice in the foreseeable future?

 The time of the day when physical activity is performed may be relevant for metabolic health and may be considered during lifestyle advice

Introduction

The current obesity pandemic is partially a consequence of lack of physical activity, and sedentary behaviour (prolonged sitting) during the day [1]. Sedentary behaviour is associated with an increased risk of cardiometabolic diseases, including type 2 diabetes [2-5]. Several studies have demonstrated that short breaks in sedentary time are associated with an improved cardiometabolic profile, including reduced triacylglycerol and glucose concentrations [6, 7]. Findings from observational studies are supported by (semi-)experimental studies showing that frequent interruptions of prolonged sitting with standing or light activities resulted in improved glycaemic responses [7-11] and triacylglycerol levels [9, 12]. High fasting serum triacylglycerol concentrations may reflect high liver fat content [13], which is strongly associated with insulin resistance [14]. Previous studies have shown that exercise is associated with reduced liver fat content and consequent improvement in insulin sensitivity [15]. Therefore, we hypothesised that breaks in sedentary time may reduce liver fat and insulin resistance, ultimately preventing type 2 diabetes.

Next to the duration of inactivity, it has been argued that the timing of physical activity during the day may be relevant for metabolic health [16, 17]. In animal models and in-vitro studies, differences in exercise capacity and associated metabolic pathways were observed in a daytime-dependent fashion [18–21]. Only a few studies have examined associations of timing of activities throughout the day with metabolic risk markers in humans, and results are inconsistent. For instance, a large observational study (N=7157) in women (mean age 71 years) reported that those who are less active during morning hours may be at higher risk of obesity [22]. This was, however, not observed in a smaller (N=125) study with a younger population (mean age 35 years) [23]. Further, high-intensity exercise in the afternoon improved blood glucose level more than high-intensity exercise in the morning in men with impaired glucose metabolism or diabetes [24, 25]. Recently, an association between morning bout-related moderate-tovigorous-physical activity (MVPA) and increased cardiovascular risk in men with type 2 diabetes, compared with later timing of MVPA, has been reported [26]. The importance of timing of physical activity in relation to metabolic health in the general population is currently unknown.

Therefore, our aim was to investigate associations of timing of physical activity and breaks in sedentary time with liver fat content and insulin resistance in a middle-aged population.



Methods

Study design and population

The Netherlands Epidemiology of Obesity (NEO) study is a population-based, prospective cohort study designed to investigate pathways that lead to obesity-related diseases. Between 2008 and 2012, 6671 individuals aged 45-65 years were included, with an oversampling of individuals living with overweight or obesity. The study design and population is described in detail elsewhere [27]. Men and women living in the greater area of Leiden (in the west of the Netherlands) were invited to participate if they were aged between 45 and 65 years and had a self-reported BMI of 27 kg/m² or higher. In addition, all inhabitants aged between 45 and 65 years from one municipality (Leiderdorp) were invited to participate, irrespective of their BMI. The Medical Ethical Committee of the Leiden University Medical Center (LUMC) approved the design of the study. All participants gave their written informed consent.

Participants came to the NEO study center of the LUMC for a study visit after an overnight fast of ≥10 h. Prior to this study visit, participants completed a questionnaire at home to report demographic, lifestyle and clinical information. All participants underwent a physical examination, including anthropometry and blood sampling, and completed a screening for potential contraindications for MRI. Approximately 35% of the participants without MRI contraindications were randomly selected to undergo assessment of liver fat content by proton magnetic resonance spectroscopy (¹H-MRS). This study is a cross-sectional analysis of baseline measurements of the random subset of participants who carried an accelerometer.

Data collection

Objective assessment of physical activity and sedentary time and breaks Daily levels of activity were objectively assessed in a random subsample of NEO study participants (*n*=955) with a combined uniaxial acceleration and heart rate monitor (Actiheart; CamNtech, UK). Participants were instructed to wear the monitor continuously for four consecutive days and nights, and to carry on with all normal activities during this time.

Details of assessment have been described previously [28]. Using a branched equation algorithm, the acceleration and heart rate information (recorded in 15 s epochs) was summarised into estimates of physical activity energy expenditure (PAEE, in kJ kg⁻¹ day⁻¹) and time spent at different activity intensities was expressed as metabolic equivalents of task (MET) [29, 30].

Sedentary time was defined as time spent in activities with an intensity ≤ 1.5 MET, excluding sleep time, which was

assumed as time between 23:00 hours and 07:30 hours on weekdays and between 23:30 hours and 08:30 hours on weekend days. A break in sedentary time was defined as a period of activity with an acceleration >0.75 m/s² following a sedentary bout (uninterrupted period). Light physical activity (LPA) was defined as activity with an intensity >1.5 MET and \leq 3 MET, and MVPA was defined as activity >3 MET. We differentiated the total amount of MVPA from MVPA accumulated in bouts \geq 5 min.

Further, we divided the day into three 6 h blocks: 06:00-12:00 hours (morning); 12:00–18:00 hours (afternoon); and 18:00-24:00 hours (evening). For each time block we calculated the proportion of total daily MVPA that was spent in each 6 h time block. Based on these proportions, we categorised participants as most active in the morning, afternoon or evening, or as having an even distribution of MVPA throughout the day. For this, we used a minimum difference of 5% between time blocks. For example, an individual with 40%, 30% and 30% of total MVPA in the morning, afternoon and evening, respectively, was classified as most active in the morning, whereas a person with respective values of 35%, 33% and 32% was classified as having an even distribution of MVPA throughout the day. Participants were excluded from analyses if valid total wear time <24 h or if wear time within any single hour of the day was <30 min.

Blood sampling Fasting blood samples were drawn from the antecubital vein after the participant had rested for 5 min in a seated position. Within 5 min after the first blood sample, participants drank a liquid mixed meal (total 400 ml, containing 2510 kJ (600 kcal)), with 16% of energy derived from protein, 50% from carbohydrates and 34% from fat. Two postprandial blood samples were drawn at 30 and 150 min after the mixed meal. Fasting and postprandial plasma glucose and serum insulin were determined as well as fasting HbA_{1c} concentrations [27]. We calculated the updated HOMA-IR from fasting glucose and insulin using the Oxford University online calculator (https://www.dtu.ox.ac.uk/homacalculator) and the Matsuda Insulin Sensitivity Index (Matsuda ISI).

Liver fat content In a random subgroup of participants without MRI contraindications, liver fat content was quantified by ¹H-MRS [31] on a 1.5 Tesla MR system (Philips Medical Systems, Best, the Netherlands). An 8 ml voxel was positioned in the right lobe of the liver, avoiding gross vascular structures and adipose tissue depots. Sixty-four averages were collected with water suppression. Spectra were obtained with an echo time of 26 ms and a repetition time of 3000 ms. Data points (1024) were collected using a 1000 Hz spectral line. Without changing any parameters, spectra without water suppression, with a repetition time of 10 s and with



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four averages, were obtained as an internal reference. ¹H-MRS data were fitted using Java-based magnetic resonance user interface software (jMRUI version 2.2, Leuven, Belgium) [32]. Hepatic triacylglycerol content relative to water was calculated as the sum of signal amplitudes of methyl and methylene divided by the signal amplitude of water and then multiplied by 100. Non-alcoholic fatty liver disease (NAFLD) was defined as liver fat content ≥5.56% [33].

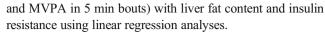
Covariates On a questionnaire, participants reported ethnicity, which we grouped into White (reference category) and Other. Highest level of education was reported in ten categories according to the Dutch education system and grouped into high (including higher vocational school, and university) vs low education (reference). Tobacco smoking was reported in three categories: current; former; and never smoking (reference). Body weight and per cent body fat were estimated by the Tanita bio impedance balance (TBF-310; Tanita International Division, UK) with the participant not wearing shoes; 1 kg was subtracted from the body weight to account for clothing. BMI was calculated by dividing the body weight (kg) by the height squared (m²). Participants reported their habitual dietary intake (including alcohol intake) using a semi-quantitative self-administered 125-item food-frequency questionnaire [34, 35]. Dietary intake of nutrients and total energy was estimated using the Dutch Food Composition Table (NEVO-2011). We calculated the Dutch healthy diet index that indicated adherence to the Dutch Guidelines for a Healthy Diet of 2015 [36]. The context of physical activity (leisure or occupational) was derived from the Short Questionnaire to Assess Health-enhancing physical activity (SQUASH) [37].

Statistical analyses

In the NEO study, individuals with a BMI of 27 kg/m² or higher were oversampled. To correctly represent baseline associations in the general population, adjustments were made for this oversampling [38]. This was done by weighting all participants towards the BMI distribution of participants from the Leiderdorp municipality, the BMI distribution of whom was similar to the BMI distribution in the general Dutch population [39, 40]. Consequently, all results apply to a population-based study without oversampling of individuals with a high BMI.

Population characteristics were summarised as mean (SD), median (25th, 75th percentile) or proportion, stratified by timing of physical activity. As a consequence of the weighted analyses, no absolute numbers could be given, only proportions.

We examined associations between daily total sedentary time, the number of breaks in sedentary time and different intensities of physical activity (i.e. total PAEE, LPA, MVPA



For this, we constructed three models with potential confounding factors: model 1 was adjusted for age, sex, ethnicity and level of educational background; model 2 was additionally adjusted for lifestyle variables (alcohol consumption, smoking and Dutch healthy diet index); and model 3 was additionally adjusted for total body fat. As body fat may both confound and mediate the relationship between physical activity and liver fat content and insulin resistance, this model allows one to observe whether physical activity is associated with liver fat content and insulin resistance beyond effects via total body fat. In addition, associations with breaks in sedentary time were adjusted for total sedentary time and total volume of MVPA. Since liver fat content and insulin resistance were non-normally distributed, these were transformed using the natural logarithm. For interpretation of the results, the linear regression coefficients were back-transformed into a relative change (with 95% CIs). As an example, a relative change of 0.8 can be interpreted as 0.8-fold decrease in liver fat content for each hour of MVPA per day, reflecting a difference in liver fat content from, for example, 5% to 4%. Additionally, these relative changes were expressed as percentage change in the text: $[\exp(\beta)-1]\times 100$ if $\beta>0$ and: $-[1/\exp(-\beta)-1]\times 100$ if $\beta<0$, with 95% CI.

Next, using linear regression analyses, we examined liver fat content and insulin resistance in participants who were most active in morning, afternoon or evening compared with those with an even MVPA distribution. From the regression coefficients we calculated relative changes with 95% CIs. These analyses were adjusted for the same covariates as mentioned above as well as for total MVPA. To investigate whether associations were different between men and women, we tested for interaction by including product terms of sex and all physical activity variables in the adjusted models.

We repeated all analyses with timing of LPA and total PAEE. Further, we repeated all analyses for the following additional outcomes: insulin sensitivity; and fasting glucose, insulin and HbA_{1c}. In addition, we added the amount of occupational activity and activity during leisure time as covariates to the models with timing of MVPA. Further, we restricted the analyses of breaks in sedentary behaviour to those with a similar amount of sedentary time (mean±1 SD).

Data was analysed using STATA 16.1 (StataCorp, College Station, TX, USA).

Results

Characteristics

Physical activity was objectively assessed in 955 participants, of whom 932 had a successful measurement. After exclusion



of participants with <24 h of total valid data or >30 min of missing data in any single hour (n=78), those working night shifts (n=2), those missing fasting blood samples (n=30), those using any type of glucose-lowering medication (n=35) and those missing covariates (n=12), data from 775 participants were used in the present analyses (see electronic supplementary material [ESM] Fig. 1), with a mean (SD) age of 56 (4) years and BMI of 26.2 (4.1) kg/m²; 42% were men. In the total study population, median liver fat content was 2.6% (IQR 1.1–5.8) with 28% NAFLD, and median HOMA-IR was 1.0 (IQR 0.7–1.5). Characteristics of the total study population and of participants stratified by the time of day when most of total daily MVPA was performed are shown in Table 1.

Associations of sedentary time, breaks in sedentary time and different intensities of physical activity with liver fat content and insulin resistance

Table 2 presents the associations of sedentary time, breaks from sedentary time and physical activity with liver fat content and insulin resistance. Neither sedentary time nor breaks in sedentary time were associated with lower insulin resistance. However, the number of breaks in sedentary time was associated with 22% (95% CI 9%, 37%) higher liver fat content. This association remained when analyses were stratified by daily sedentary time (data not shown). Total PAEE, MVPA and MVPA in 5 min bouts were associated with liver fat content in models 1 and 2 but associations were attenuated after adjustment for total body fat. Similarly, total PAEE, MVPA and MVPA in 5 min bouts, but not LPA, were associated with insulin resistance in models 1 and 2. After adjustment for total body fat, an additional hour of MVPA was associated with -5% (95% CI -10%, 0%) insulin resistance and an additional hour of MVPA in 5 min bouts was associated with -9% (95% CI-16%, -2%) insulin resistance. Even though the amount of liver fat was higher in men (median 4.1%) than in women (median 1.6%), we did not observe an interaction effect of sex in any of the associations (all p>0.10).

ESM Table 1 shows relative changes in insulin sensitivity, fasting concentrations of glucose, insulin and HbA_{1c} for sedentary time, number of breaks in sedentary time and different levels of physical activity intensity. Associations with the Matsuda ISI showed similar patterns to associations with insulin resistance. Overall, we observed associations with fasting insulin rather than with fasting glucose or HbA_{1c} .

Table 1 Characteristics of the total study population and stratified by the time of day during which most of the total daily MVPA is performed

Characteristic	Total population	Even distribution of MVPA (13%)	Most MVPA in morning (16%)	Most MVPA in afternoon (63%)	Most MVPA in evening (8%)
Sex, % women	58	52	56	59	63
Age, years	56 (6)	56 (7)	55 (6)	56 (6)	55 (7)
Education, % high	40	38	39	39	54
Ethnicity, % White	96.0	94.3	93.4	96.4	100
BMI, kg/m ²	26.2 (4.1)	27.0 (3.8)	26.0 (4.1)	26.2 (4.2)	26.6 (4.0)
Smoking, % current	15	17	16	14	21
Dutch healthy diet index	71 (14)	71 (15)	70 (15)	71 (14)	70 (16)
CVD history, %	5	4	2	7	2
Total Actiheart wear time, h	84.7 (11.3)	84.9 (13.3)	83.5 (10.7)	85.0 (10.5)	84.1 (14.9)
Total PAEE, kJ kg ⁻¹ day ⁻¹	45.9 (18.0)	46.7 (21.4)	49.2 (18.7)	45.6 (17.7)	39.4 (12.6)
Sedentary time, h/day	9.1 (2.1)	8.9 (2.4)	8.9 (2.1)	9.1 (2.1)	10.0 (1.8)
Breaks in sedentary time, n/day	71 (16)	70 (18)	70 (16)	72 (16)	68 (17)
LPA, h/day	5.4 (1.7)	5.2 (1.8)	5.4 (1.7)	5.4 (1.7)	4.9 (1.6)
MVPA, h/day	1.2 (0.7–1.8)	1.1 (0.8–1.9)	1.4 (0.7–2.2)	1.2 (0.7–1.7)	1.2 (0.7–1.5)
MVPA in 5 min bouts, h/day	0.5 (0.2-0.9)	0.5 (0.2–0.8)	0.7 (0.2–1.3)	0.5 (0.2-0.9)	0.5 (0.2-0.7)
Vigorous physical activity, min/day	1.2 (0-7.6)	0.1 (0-4.6)	2.1 (0-8.5)	1.3 (0-7.6)	2.0 (0.1–12.3)
Leisure-time physical activity, MET-h/week	29.6 (17.0-48.0)	24.3 (14.0-52.0)	31.5 (15.3–49.8)	30.7 (19.0-45.0)	34.0 (16.0–51.5)
Liver fat content, %	2.6 (1.1–5.8)	3.4 (1.9-4.9)	2.5 (1.1-5.1)	2.2 (1.1–5.8)	3.6 (0.9-6.3)
NAFLD, % liver fat ≥5.56%	28	24	21	26	39
HOMA-IR	1.0 (0.7–1.5)	1.3 (1.0–1.7)	1.0 (0.6–1.7)	1.0 (0.7–1.4)	0.8 (0.7-1.4)
Matsuda ISI	5.6 (3.8–8.2)	4.9 (3.7–6.5)	5.2 (4.0-8.1)	5.6 (3.8–8.6)	6.1 (3.9–8.3)

Results are presented as mean (SD), median (25th-75th percentile) or percentage

Results are based on analyses weighted towards the BMI distribution of the general population (n=775; or n=206 in those with liver fat content)



Table 2 Relative changes in liver fat content and insulin resistance according to sedentary time, number of breaks in sedentary time and different levels of physical activity intensity

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Physical activity	Relative change (95% CI) Liver fat content ^a	Insulin resistance (HOMA-IR) ^b
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Sedentary time, h/day		
Model 1 ^c	1.04 (0.96, 1.12)	1.02 (0.99, 1.04)
Model 2 ^d	1.06 (0.98, 1.13)	1.02 (0.99, 1.04)
Model 3 ^e	1.01 (0.95, 1.07)	1.01 (0.98, 1.03)
Breaks in sedentary time, 10/day		
Model 1 ^c	1.09 (0.97, 1.21)	0.97 (0.93, 1.01)
Model 2 ^d	1.09 (0.99, 1.21)	0.97 (0.93, 1.01)
Model 3 ^e	1.13 (1.05, 1.23)	0.98 (0.95, 1.02)
Model 3 + ST and MVPA	1.22 (1.09, 1.37)	0.98 (0.94, 1.02)
Total PAEE, 10 kJ kg ⁻¹ day ⁻¹		
Model 1 ^c	0.90 (0.83, 0.99)	0.95 (0.93, 0.98)
Model 2 ^d	0.89 (0.82, 0.97)	0.96 (0.93, 0.99)
Model 3 ^e	0.98 (0.91, 1.07)	0.98 (0.95, 1.00)
LPA, h/day		
Model 1 ^c	0.98 (0.88, 1.08)	0.99 (0.96, 1.02)
Model 2 ^d	0.96 (0.88, 1.06)	0.99 (0.96, 1.02)
Model 3 ^e	1.01 (0.93, 1.10)	1.00 (0.97, 1.03)
MVPA, h/day		
Model 1 ^c	0.80 (0.66, 0.97)	0.92 (0.86, 0.97)
Model 2 ^d	0.77 (0.64, 0.94)	0.92 (0.87, 0.97)
Model 3 ^e	0.97 (0.80, 1.18)	0.95 (0.90, 1.00)
MVPA in 5 min bouts, h/day		
Model 1 ^c	0.68 (0.51, 0.92)	0.87 (0.81, 0.93)
Model 2 ^d	0.66 (0.50, 0.89)	0.87 (0.81, 0.94)
Model 3 ^e	0.94 (0.70, 1.26)	0.91 (0.86, 0.98)

Results are based on analyses weighted towards the BMI distribution of the general population and were derived from regression coefficients with 95% CIs from linear regression analyses and expressed as a relative change. Such relative change can be interpreted as a ratio (e.g. 0.8, can be interpreted as 0.8-fold reduced liver fat content for each hour of MVPA per day, which would reflect a decrease in liver fat content from, for example, 5% to 4%). Further, these relative changes were expressed as percentage change in the text: $[\exp(\beta)-1]\times 100$ if $\beta\!>\!0$ and: $-[1/\exp(-\beta)-1]\times 100$ if $\beta\!<\!0$, with 95% CI , e.g. a relative change of 0.80 (0.67, 0.96) corresponds with -25% (-49%, -4%) percentage change

ST, sedentary time

Association of timing of physical activity with liver fat content and insulin resistance

Figure 1 illustrates the distribution of MVPA throughout the day for the total population and for the four subgroups based on timing of MVPA. Crude differences in liver fat content and insulin resistance between subgroups based on timing of MVPA are shown in ESM Fig. 2. After adjustments, insulin

resistance was reduced in participants who were most active in the afternoon (-18% [95% CI -33%, -2%]) or evening (-25% [95% CI -49%, -4%]), whereas insulin resistance was unaffected in those most active in the morning (-3% [95% CI -25%, 16%]) compared with participants with an even distribution of MVPA (Fig. 2). Similar observations were made upon studying subgroups in which MVPA was assessed in 5 min bouts (ESM Table 2). Timing of MVPA



^a Participants with alcohol consumption ≥40 g per day were excluded from the analyses

^b Associations with insulin resistance were based on the total study population (*n*=775), and those with liver fat content (*n*=206) measured by ¹H-MRS

^c Model 1: associations were adjusted for age, sex, educational background and ethnicity

^d Model 2: as for model 1, additionally adjusted for alcohol consumption, smoking and the Dutch healthy diet index

e Model 3: as for model 2, additionally adjusted for total body fat

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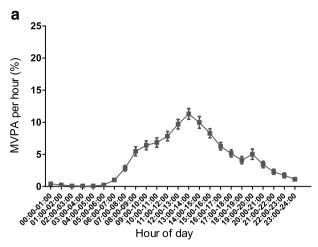
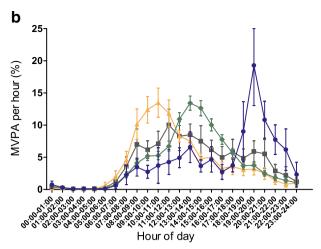


Fig. 1 Distribution of MVPA presented as mean percentage with 95% CIs per hour throughout the day for total population (**a**) and for the four subgroups based on timing of MVPA (**b**). Orange triangles, most MVPA in the morning (16% of population); green diamonds, most MVPA in the afternoon (63% of population); blue squares, most MVPA in the evening

was not associated with liver fat content. Additional adjustment for the amount of occupational and leisure-time physical activity did not affect the observed associations (not shown). ESM Table 2 shows the associations between timing of MVPA and additional outcomes. Here, we also observed associations with fasting insulin rather than with fasting glucose: insulin was reduced in participants who did most of



(8% of population); grey squares, even distribution of MVPA throughout the day (13% of population). Results are based on analyses weighted towards the BMI distribution of the general population (n=775; i.e. 13% represents around 100 participants)

their MVPA in the afternoon (-18% [95% CI - 35%, -2%]) or in the evening (-27% [95% CI - 52%, -5%]).

There were no marked differences in liver fat content and insulin resistance between groups based on timing of LPA. Participants who had their peak total PAEE in the morning, afternoon or evening were less insulin resistant than those who had an even distribution of PAEE throughout the day (ESM Table 3).

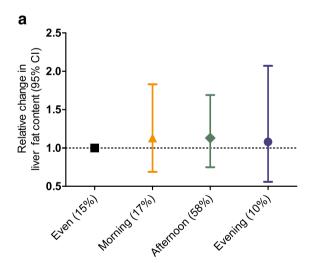
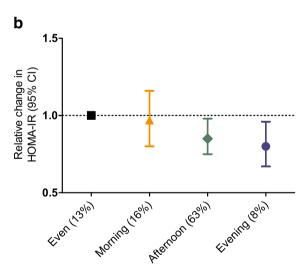


Fig. 2 Relative changes in liver fat content (a) and insulin resistance (b) between subgroups based on timing of MVPA, compared with an even distribution of MVPA throughout the day. All associations were adjusted for age, sex, educational background, ethnicity, alcohol consumption, smoking, Dutch healthy diet index, total body fat and total MVPA. Results are based on analyses weighted towards the BMI distribution of the general population and were derived from regression coefficients with 95% CIs from linear regression analyses and expressed as a relative change. Such relative change can be interpreted as a ratio (e.g. 0.8 can be interpreted as 0.8-fold reduced liver fat content for most MVPA in the



evening vs an even distribution of MVAP, which would reflect a decrease in liver fat content from, for example, 5% to 4%). Associations with insulin resistance were based on the total study population (n=775; i.e. 13% represents around 100 participants). Associations with liver fat content were based on participants with 1 H-MRS of liver fat (n=206; i.e. 15% represents around 31 participants). Percentages in brackets indicate proportion of the study population within the subgroups with most MVPA in the morning, afternoon or evening, or with an even distribution of MVPA throughout the day. Participants with alcohol consumption ≥ 40 g per day were excluded from the analyses of liver fat content



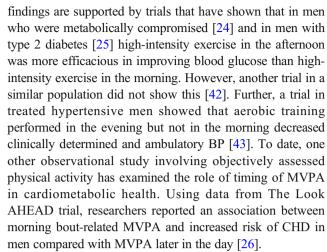
Discussion

In our study of middle-aged men and women, we did not observe associations of sedentary time with liver fat or insulin resistance, nor did we observe associations of number of breaks in sitting time with reduced liver fat or insulin resistance. However, higher total PAEE and, particularly, more MVPA was associated with reduced liver fat and insulin resistance. Interestingly, we observed that the timing of MVPA during the day was associated with insulin resistance: MVPA in the afternoon or evening but not in the morning was associated with reduced insulin resistance compared with having an even distribution of MVPA during the day.

Previous observational and experimental studies have reported positive effects of breaks in sitting time on different metabolic outcomes, such as reduced body weight, triacylglycerol concentrations and insulin resistance [7-10]. However, in our study, the number of breaks was not associated with reduced insulin resistance. One explanation could be that experimental studies usually examine regular breaks in sedentary time vs continuous sitting [9]. This contrast between an almost complete absence of breaks in sedentary time and a situation with regular breaks is not common in a free-living setting, such as in our study, where we observed an average of 71 breaks in combination with 9 h sedentary time. Another explanation may be that in our study the intensity of the activity during the breaks was too light to elicit metabolic responses. Most daily activities are of light intensity and because we did not observe an association between LPA and insulin resistance, this may also explain the lack of an association between breaks and insulin resistance. Similarly, in a previous study we observed that MVPA but not LPA was associated with less total body fat, visceral fat and liver fat [28].

In contrast to our hypothesis, we observed that a greater number of breaks in sedentary time was associated with somewhat more liver fat instead of less liver fat. We reasoned that total sedentary time might explain this result, as people who sit more also have more opportunity to break their sitting time. However, we still observed a positive association between the number of breaks and liver fat content within those with similar (mean±1SD; 7.1–11.3 h/day) sedentary time. Because the number of breaks was not similarly related to increased insulin resistance and the range of liver fat content in our population was as could be expected [33], we cannot think of any explanation other than chance as a result of the small sample size in which these analyses were performed (n=206). Overall, there is still much debate as to whether breaks in sedentary time per se have protective cardiometabolic effects [41] and longer intervention trials are needed to show long-term health benefits of short, light-intensity breaks in sitting time.

Timing of exercise is a relatively unexplored field in human studies. We observed that MVPA in the afternoon or evening, compared with an even distribution of MVPA during the day, was associated with reduced insulin resistance. Our



The mechanisms underlying the potential benefits of timing of MVPA remain unclear. Because timing of MVPA and liver fat content were not associated in our study, reduced liver fat accumulation is unlikely to underlie the relationship between MVPA in the afternoon or evening and reduced insulin resistance. Since physical activity may act as a Zeitgeber, a cue for the activation of clock genes, it has been argued that timing of physical activity may enhance the circadian rhythm and consequently metabolic health [16]. Indeed, mechanistic studies have previously shown that metabolic responses to MVPA differed based on the time of the day when MVPA was performed, and that these metabolic responses were regulated by the clock genes [18, 19]. Furthermore, it was shown that muscular strength and skeletal muscle mitochondrial function peak in the late afternoon, suggesting a circadian rhythm for oxidative metabolism [44]. Thus, being most active during this period may elicit greater metabolic responses than earlier in the day.

In our study, only timing of MVPA, and not timing of LPA or total PAEE, was associated with insulin resistance. This is in line with observations in mice where no difference in insulin signalling was observed when only light-intensity activity was performed at different time points [20]. Thus, the effects of timing of physical activity may only result from high-intensity activity. Further, in our study, the finding that most MVPA in the afternoon and evening was associated with reduced insulin resistance mainly resulted from lower fasting insulin rather than differences in fasting glucose concentrations. These findings provide some insight for future studies that further examine the underlying mechanisms behind the potential benefits of timing of physical activity.

Strengths and limitations

Strengths of our study include the objective assessment of physical activity with an accelerometer combined with heart rate monitor, the population-based setting and the adjustment for important confounding factors.



However, several limitations of our study should be considered. First, inherent to the study's observational design, residual confounding may still be present. For example, the time of day at which people engage in most MVPA may depend on the context of the physical activity. One could argue that MVPA later in the day is mainly performed during leisure time. Leisure-time physical activity has been associated with improved metabolic health, whereas occupational physical activity has sometimes even been associated with adverse health effects [45]. However, adding occupational or leisure-time physical activity to the regression models did not change our findings. Second, the Actiheart is a chest-worn accelerometer and is therefore less valid for estimating sedentary time and breaks than thigh-worn accelerometers. This may have led to an over- or underestimation of sedentary time or breaks in sedentary time in some participants. Although such misclassification would not be related to the outcomes of our study, this may have resulted in dilution of the associations of sedentary time and breaks. In addition, the objective assessment of physical activity was limited to 4 days and yielded limited data for weekend days. Activity patterns may vary from day to day and between week and weekend days. Consequently, by summarising data into an average 24 h period, these variations are not considered and misclassification of timing of MVPA may have occurred. However, we expect this would have led to an underestimation of the observed associations with reduced insulin resistance in people who were active in the afternoon or evening. Finally, we lacked information on the participants' chronotype and the effects of timing of physical activity may depend on an individual's chronotype [46]. Since a late chronotype has been associated with increased risks of type 2 diabetes and the metabolic syndrome [47], it may be important to examine health effects of timing of MVPA relative to each person's individual chronotype.

Conclusion

In conclusion, in contrast to our hypothesis, a lower amount of sedentary time or more breaks in sedentary time were not associated with reduced liver fat content or insulin resistance. However, in addition to the total amount of daily MVPA, timing of MVPA during the day was associated with reduced insulin resistance: performing most MVPA in the afternoon or evening was associated with up to 25% reduced insulin resistance compared with an even distribution of MVPA during the day. These results suggest that timing of physical activity throughout the day is relevant for the beneficial effects of physical activity on inulin sensitivity. Further studies should assess whether timing of physical activity is indeed important for the occurrence of type 2 diabetes, taking into account the influence of chronotype.

Supplementary Information The online version contains peer-reviewed but unedited supplementary material available at https://doi.org/10.1007/s00125-022-05813-3.

Acknowledgements We express our gratitude to all participants in the Netherlands Epidemiology in Obesity study. We are grateful to all participating general practitioners for inviting eligible participants. We furthermore thank all research nurses that were involved in the NEO study from different LUMC departments. We also thank, from the department of Clinical Epidemiology, LUMC S. Hillebrand, P. van Beelen and for collecting data, P. Noordijk and her team for sample handling and storage, and I. de Jonge for data management of the NEO study. We further thank K. Schaap from the Biomedical Data Sciences of the LUMC and K. Westgate, S. Brage, L. Griffiths and A. Smith from the MRC Epidemiology Unit, University of Cambridge for their help with cleaning and processing the objective physical activity data. Some of the data presented here were previously presented as an abstract at the Netherlands Association for the Study of Obesity (NASO) Scientific Spring meeting in 2021.

Data availability statement Due to the privacy of the participants of the NEO study and legal reasons, we cannot publicly deposit the data. In addition, NEO study participants did not sign informed consent to make their data publicly available. Data will be made available upon reasonable request to qualified researchers according to the NEO study research procedure. Data requests should be sent to the NEO Executive Board, who can be contacted via https://www.lumc.nl/org/neo-studie/contact/.

Funding The NEO study is supported by the participating departments, the Division and the Board of Directors of the LUMC, and by the Leiden University Research Profile Area 'Vascular and Regenerative Medicine'. We acknowledge the support from the Netherlands Cardiovascular Research Initiative, an initiative with support from the Dutch Heart Foundation (CVON2014-02 ENERGISE) and the Netherlands Organisation for Health Research and Development (ZonMw) Partnership Diabetes (459001010) / Dutch Diabetes foundation Breakthrough (2018.11.160). VBS-H was supported by an ERC starting grant (grant no. 759161 'MRS in diabetes').

Authors' relationships and activities The authors declare that there are no relationships or activities that might bias, or be perceived to bias, their work.

Contribution statement JHPMvdV performed data cleaning and analysis, interpreted the data and drafted the manuscript. SCB and EWvE performed data cleaning and analysis and critically revised the manuscript for important intellectual content. MKCH, VBS-H and PS participated in study conception and interpretation of the data, helped to draft the manuscript and critically revised it for important intellectual content. HJL, FRR and RdM contributed to the conception and design of the NEO Study and the research described in this manuscript, contributed to the acquisition and interpretation of the data, and revised the manuscript critically for important intellectual content. All authors provided final approval of the version to be published. JHPMvdV is the guarantor of this work.

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