SHORT COMMUNICATION



Revisiting the cross-sectional and prospective association of physical activity with body composition and physical fitness in preschoolers: A compositional data approach

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Summary

Background: Information is limited for the benefits of physical activity (PA) in preschoolers. Previous research using accelerometer-assessed PA may be affected for multicollinearity issues.

Objectives: This study investigated the cross-sectional and prospective associations of sedentary behaviour (SB) and PA with body composition and physical fitness using compositional data analysis.

Methods: Baseline PA and SB were collected in 4-year-old (n = 315) using wrist-worn GT3X+ during seven 24 h-periods. Body composition (air-displacement plethysmography) and physical fitness (PREFIT test battery) were assessed at baseline and at the 12-month follow-up.

Results: Increasing vigorous PA at expenses of lower-intensity behaviours for 4-yearold was associated with body composition and physical fitness at cross-sectional and longitudinal levels. For example, reallocating 15 min/day from lower intensities to vigorous PA at baseline was associated with higher fat-free mass index (+0.45 kg/m², 95% confidence intervals [CI]: 0.18–0.72 kg/m²), higher upper-body strength (+0.6 kg, 95% CI: 0.1–1.19 kg), higher lower-body strength (+8 cm, 95% CI: 3–13 cm), and shorter time in completing the motor fitness test (–0.4 s, 95% CI: –0.82 to [–0.01] s) at the 12-month follow-up. Pairwise reallocations of time indicated that the behaviour replaced was not relevant, as long as vigorous PA was increased.

Conclusions: More time in vigorous PA may imply short- and long-term benefits on body composition and physical fitness in preschoolers. These findings using compositional data analysis corroborate our previously published results using isotemporal substitution models.

KEYWORDS

fitness tracker, movement behaviour, movement sensor, sedentary time, youth

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1 | INTRODUCTION

Physical activity (PA) is widely known to produce health benefits across the lifespan.¹ However, information is limited in several populations, including preschoolers (i.e., 3–5 years old).^{2,3} In this population, body composition and physical fitness (hereinafter fitness) are markers of current and future health,^{4,5} but the role of PA in promoting healthy body composition and fitness is still unclear.

Accelerometers are valid and feasible to monitor PA in 3-5-year-old children.^{6,7} Previous studies described cross-sectional⁸⁻¹² and longitudinal¹³⁻¹⁶ associations of device-measured PA with body composition and fitness in preschoolers. For example, from MINISTOP (a population-based randomized controlled trial to promote PA and diet among 315 Swedish preschoolers), we demonstrated cross-sectional and longitudinal positive associations of vigorous PA with fat-free mass index (FFMI), cardiorespiratory, muscular and motor fitness in preschoolers.^{12,16} However, there has been a concern that multicollinearity issues may bias previous findings,^{3,17} which were obtained from linear regression and isotemporal substitution models. Accelerometer-assessed sedentary behaviour (SB), light, moderate and vigorous PA share the awake time of the day, which increases the multicollinearity risk in regression models.¹⁸ Isotemporal substitution models have traditionally been used to investigate time reallocations across behaviours,¹⁹ yet these models may be also affected by multicollinearity.

Compositional data analysis has been proposed instead to properly investigate the reallocation of time across behaviours while lowering risk of multicollinearity.^{20,21} Therefore, this study aimed to reanalyse the MINISTOP data to investigate whether the previously described associations of PA with body composition and fitness in preschoolers are corroborated by compositional models.

2 | MATERIAL AND METHODS

2.1 | Study design and participants

This study includes baseline and 12-month follow-up data from the MINISTOP trial.^{22,23} Children were ~4 years old (4.48 ± 0.15 years) at baseline. For this study, we analysed the baseline data of all participants for the cross-sectional associations (n = 315), and only the control group data for the longitudinal associations (n = 159) to eliminate any possible confounding introduced by the intervention. Children without sufficient accelerometer data (n = 8), or without complete follow-up data (n = 13), were excluded from analyses. Informed consents from parents were obtained. The trial was registered at clinicaltrials.gov (NCT02021786) and approved by the Research Ethics Committee, Stockholm, Sweden (2013/1607–31/5; 2013/2250–32).

2.2 | Data collection

PA and SB were monitored with non-dominant wrist-worn accelerometers (ActiGraph GT3X+, Pensacola, FL, US) for 7 days (24 h/day). Devices recorded accelerations at 50 Hz, and participants were instructed to only remove accelerometers for water-based activities. Children wearing accelerometer \geq 3 days for \geq 10 h/day were considered. Non-wear time was determined from the raw acceleration; awake and sleep time were detected with an automated algorithm,²⁴ and then, awake time was classified as SB, light, moderate or vigorous PA.²⁵ Detailed methods can be found elsewhere.¹²

Body composition was assessed using air-displacement plethysmography (BOD POD GS, Cosmed Company, Italy, www.cosmed. com).²⁶ Fat mass percentage was calculated using the Lohman's equation (i.e., fat $\% = \frac{1}{D_{body}} \left(\frac{D_{fat-free}-D_{fat}}{D_{fat-free}-D_{fat}} \right) \frac{-D_{fat}}{D_{fat-free}-D_{fat}}$, where *D* is density, D_{fat} is assumed to be 0.9000).²⁷ Absolute fat mass (kg) was obtained from fat mass percentage, and fat-free mass was the difference between body weight (kg) and fat mass (kg). Body composition outcomes included body mass index (BMI, kg/m²), FFMI (kg/m²), fat mass percentage (%) and fat mass index (kg/m²).

Cardiorespiratory, muscular and motor fitness were assessed with the PREFIT fitness test battery for preschoolers.²⁸ The 20-m shuttle run test was used for cardiorespiratory fitness, the handgrip strength test for upper-body strength, the standing long jump test for lower-body strength and the 4 × 10-m shuttle run test for motor fitness. Two attempts were recorded and the best attempt was used, except for the 20-m shuttle run test that was performed once.^{12,16}

2.3 | Statistical methods

Descriptive characteristics of participants regarding sociodemographic and anthropometric values, PA levels, body composition and fitness can be found elsewhere.^{12,16} Multiple regression models over compositional data were used to study the cross-sectional and longitudinal associations of PA with body composition and fitness.^{20,21} Compositional data analysis accounts for the relative nature of accelerometer-assessed PA by guantifying the effect of increasing a specific behaviour while reducing at least one of the others. Two different time-use compositions were defined: composition 1 included: SB, light, moderate and vigorous PA; composition 2 included: SB, light and moderate-to-vigorous PA. Isometric log-ratios were calculated as previously proposed²⁰ and included as explanatory variables. Gamma (γ) coefficients inform of the strength and direction of the association of each behaviour relative to the others with a certain outcome. To estimate the effect size, dose-response curves were drawn by reversing the isometric log ratios. These curves represent the effect of increasing one behaviour while reducing others on the outcome. Model 1 was unadjusted; model 2 was adjusted for sex, age and awake wear time; and model 3 was additionally adjusted for maternal and paternal BMI and as well as their educational attainment (i.e., university degree or not). Analyses were performed in R (v.4.0.3), and statistical significance was set at p < 0.05.

3 | RESULTS

3.1 | Cross-sectional associations

Tables S1 and S2 show the models using composition 1 (i.e., SB, light, moderate and vigorous PA) and composition 2 (i.e., SB, light and

moderate-to-vigorous PA), respectively. Vigorous PA relative to SB and lower PA intensities was associated with FFMI (γ 's \ge 0.275, p's \le 0.020), cardiorespiratory fitness (γ 's \ge 1.515, p's < 0.001), lower-body strength (γ 's \ge 4.502, p's \le 0.017) and motor fitness (γ 's \le -1.238, p's < 0.001) (Table S1). Increasing moderate-to-vigorous PA while reducing SB and light PA was associated with FFMI (γ 's \ge 0.850, p's \le 0.010), fat mass percentage (γ 's \ge -3.522, p's \le 0.026) and all fitness components (cardiorespiratory fitness: γ 's \ge 3.658, p's < 0.001; upper-body strength: γ 's \ge 1.187, p's \le 0.031; lower-body strength: γ 's \ge 19.718, p's \le 0.001; and motor fitness: γ 's \le -2.528, p's < 0.001) in all models (Table S2). Figure S1 shows the

dose-response curves relative to increasing vigorous PA while proportionally decreasing the other behaviours (model 2 was used for illustrative purposes). Figure S2 shows the pairwise reallocations from other behaviours to vigorous PA.

3.2 | Prospective associations

The prospective associations of SB and PA (at 4-year-old) with body composition and fitness outcomes (at 5-year-old) are presented in Tables S3 and S4. Vigorous PA relative to SB and lower PA intensities



FIGURE 1 Prospective associations of vigorous physical activity (PA) relative to sedentary behaviour (SB) and lower PA intensities at 4 years with body composition and physical fitness at the 12-month follow-up. Each line represents the effect of increasing vigorous PA while proportionally reducing SB, light and moderate PA. Models are adjusted for sex, age and awake wear time

4 of 6 WILEY-Pediatric

was associated with BMI (γ 's \geq 0.663, p's \leq 0.013), FFMI (γ 's \geq 0.588, p's \leq 0.002), upper-body strength (γ 's \geq 0.759, p's \leq 0.050) and lowerbody strength (γ 's \geq 10.940, p's \leq 0.002) in all models (Table S3). Vigorous PA was associated with motor fitness only in models 1 and 2 (γ 's ≤ -0.596 , p's ≤ 0.038). Table S4 shows that increasing moderate-to-vigorous PA at expenses of SB and light PA was associated with FFMI (γ 's \geq 1.038, *p*'s \leq 0.040), cardiorespiratory fitness (γ 's \geq 5.195, p's < 0.019), lower-body strength (γ 's \geq 23.187, p's ≤ 0.013) and motor fitness (γ 's ≤ -1.997, p's < 0.012) in all models. Furthermore, Figure 1 shows the dose-response curves relative to increasing vigorous PA while proportionally decreasing SB, light and moderate PA. For example, reallocating 15 min/day from SB, light and moderate PA to vigorous PA was associated with higher FFMI (+0.45 kg/m², 95% confidence intervals [CI]: 0.18-0.72 kg/m²), upper-body strength (+0.6, 95% CI: 0.1-1.19 kg), lower-body strength (+8 cm, 95% CI: 3-13 cm) and motor fitness (-0.4 s, 95% CI: -0.82 to [-0.01] s). Figure S3 shows the prospective associations of pairwise reallocations from lower-intensity behaviours to vigorous PA.

DISCUSSION 4

Our findings showed that more time in vigorous PA at expenses of lower intensities (SB, light and moderate PA) were associated with cross-sectional and prospective benefits on body composition and fitness in preschoolers. This study corroborates our previous observations using linear regression and isotemporal substitution models. Also, interestingly, our time-use reallocation analyses indicate that it is not relevant which behaviour is replaced, as long as vigorous PA is increased for most of the outcomes studied.

Vigorous PA was cross-sectionally associated with FFMI and fitness components in the previous study,¹² which is consistent in these analyses. Both studies show that the time in vigorous PA is the main driver of the associations. Increasing vigorous PA at expenses of others may benefit body composition and fitness, independently of which behaviour is replaced. Similar findings were obtained in the prospective associations, that is, consistent findings across multiple regression,¹⁶ isotemporal substitution¹⁶ and compositional data analysis (present study). Previous studies have also found consistent findings across isotemporal substitution models and compositional data analysis,²⁹ and we hypothesize that this occurs when the associations are mainly driven by one of the behaviours (in this case, vigorous PA). The findings were also robust across models, indicating that the associations are independent of potential confounders.

Altogether, previous literature and this study suggest that increasing vigorous PA is associated with body composition and physical fitness in preschoolers, while the SB-related findings are inconsistent.^{13,14,30} A potential explanation is that engaging in vigorous PA could be more effective than reducing SB to increase energy expenditure in preschoolers and, subsequently, to improve body composition and physical fitness. Furthermore, the variability of SB, light and moderate PA is rather low in our participants (coefficients of variation of

 \sim 0.10, \sim 0.12 and 0.22, respectively), while the variability of vigorous PA is higher (i.e., \sim 0.60), suggesting that there is more room to change vigorous PA than the other behaviours. The current World Health Organization PA guidelines recommend 4-year-old to perform at least 180 min/day of PA, of which at least 60 minutes should be of moderate-to-vigorous intensity.³ Our findings support such a recommendation and initiate a debate on whether vigorous PA should be specifically encouraged rather than moderate-to-vigorous PA in this age group. In this respect, it is relevant to note that our previous qualitative work has shown that preschool teachers and parents perceived that preschoolers engage in too little vigorous PA.³¹ Previous research did not utilize a compositional data approach,^{13,14,30} which makes it difficult to isolate the associations of the different intensities with the outcome (i.e., those children engaging in more moderate PA are likely to also engage in more vigorous PA, and this not adjusted for in standard linear regression models). The guidelines also recommend limiting sedentary screen time to no more than 60 min/day. Unfortunately, we do not have an estimate of the specific screen time in our participants. However, our results do support not limiting the total sedentary time for the body composition and the physical fitness in this early stage of life.

These findings are of relevance for public health strategies to prevent childhood obesity and its comorbidities. This study corroborates that spending more time in vigorous PA may imply short- and long-term health benefits already early in life (i.e., preschoolers). Furthermore, we can now conclude that vigorous PA, and not lower intensities, is the main driver of the associations. This implies that it is more relevant to focus on increasing vigorous PA than on reducing SB in this age group. This study has several limitations to acknowledge such the relatively small sample size for the prospective analyses as we excluded participants from the intervention group. Furthermore, this is an observational analysis and causation cannot be concluded. Strengths of this study are the accurate methods used to measure PA, body composition and fitness; the combination of the cross-sectional and longitudinal design and the use of compositional data analysis to appropriately account for the multicollinearity of accelerometerdetermined PA data.

CONCLUSION 5

More time in vigorous PA was associated with short- and longterm benefits on body composition and fitness in preschoolers, with vigorous PA being the main driver of these associations. Our findings using compositional data analysis corroborate our previously published results using linear regression and isotemporal substitution models.

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CONFLICT OF INTEREST

No conflict of interest was declared.

AUTHOR CONTRIBUTIONS

Marie Löf is the Principal Investigator for the MINISTOP trial and designed this analysis together with all the co-authors. Jairo H. Migueles was responsible for the data analysis and drafted the manuscript. Christine Delisle Nyström was responsible for data collection. Pontus Henriksson assisted on the data analysis and contributed to the manuscript preparation. The manuscript was reviewed by Christine Delisle Nyström, Marja H. Leppänen, Pontus Henriksson and Marie Löf. All the authors approved the final version.

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SUPPORTING INFORMATION

6 of 6

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