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Gender differences in the distribution of children's physical activity: evidence from nine countries

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Abstract

Background Physical activity in childhood is thought to influences health and development. Previous studies have found that boys are typically more active than girls, yet the focus has largely been on differences in average levels or proportions above a threshold rather than the full distribution of activity across all intensities. We thus examined differences in the distribution of physical activity between girls and boys in a multi-national sample of children.

Methods We used the harmonised International Children Accelerometry Database (ICAD), including waist-worn accelerometry data from 15,461 individuals (Boys: 48.3%) from 9 countries. Employing Generalised Additive Models of Location, Shape, and Scale (GAMLSS) we investigated gender differences in the distribution of individuals, including comparisons of variability (SD) and average physical activity levels (mean and median) and skewness. We conducted this analysis for each activity intensity (Sedentary, Light, and Moderate-to-Vigorous (MVPA)) and a summary measure (counts per minute (CPM)).

Results Sizable gender differences in the distribution of activity were found for moderate to vigorous activity and counts per minute, with boys having higher average levels (38% higher mean volumes of MVPA, 20% higher CPM), yet substantially more between-person variability (30% higher standard deviation (SD) for MVPA, 17% higher SD for CPM); boys' distributions were less positively skewed than girls. Conversely, there was little to no difference between girls and boys in the distribution of sedentary or light-intensity activity.

Conclusions Inequality in activity between girls and boys was driven by MVPA. The higher mean volumes of MVPA in boys occurred alongside greater variability. This suggests a need to consider the underlying distribution of activity in future research; for example, interventions which target gender inequality in MVPA may inadvertently lead to increased inequality within girls.

Keywords Physical activity, Childhood, Accelerometer, Gender, GAMLSS, ICAD, ALSPAC

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Introduction

Physical activity levels during childhood and adolescence have implications for health and development throughout the lifecourse [1]. Low levels of activity in childhood have been linked to a series of unfavourable outcomes: higher incidence of infectious [2] and chronic disease [3–8], poorer mental health outcomes [3, 9], lower cognitive function and school performance [9, 10], and delayed physical development [3, 7, 8, 10–15]. Gender is frequently observed to be a correlate of objectively measured physical activity in youth samples [16, 17], with boys on average typically undertaking more activity than girls, with the effect size relatively stable across ages [18–25]. Since childhood activity levels tend to track into later life [26], such differences may have lasting implications for gender disparities in subsequent health [27].

Understanding the distribution of individuals across all active behaviours could help to better understand causes of gender differences in activity profiles However, such an approach is underutilised [28]. Research to date has largely focussed on comparing summary measures of physical activity (frequently average counts [29, 30] or MVPA [1, 5, 8, 17, 19, 23]) with little research examining the distribution of activity across individuals. One identified paper investigated the Gini (an index of inequality for an outcome) of activity between countries, but did not examine gender [28]. Analysing the full distribution of activity across all intensities, drivers of differences between girls and boys may be better understood, furthering an understanding of whether differences are due to a whole population shift, or owes to a subset skewing the sample.

To address this gap, the present research explores the full distribution of activity using Generalised Additive Models of Location Shape and Scale (GAMLSS) which allows for comparisons between medians, standard deviations and skewness in addition to the mean [31, 32]. This analysis is repeated for the mean intensity of activity and each intensity threshold. Given the observed differences between girls and boys in volumes of MVPA, similar differences in the mean should be observed here. If this difference emerges due to volitional activity, such as sport or active play with a larger subset of one gender undertaking such activities [33], it may result in that gender having a wider distribution of activity and more skew. For light-intensity activities, those that are constituent of 'everyday' activities, it may be that there is less of a difference between girls and boys, with limited difference in the deviation or skew.

Methods

Sample

The International Children's Accelerometry Database (ICAD) was used in this analysis [34]. ICAD is a harmonised dataset of accelerometry data from a series of youth activity studies that employed waist-worn accelerometers in comparable means [34]. Data was harmonised by reprocessing the raw accelerometer data from each study with a consistent methodology [35]. Further, social and demographic information were recoded to a consistent reporting, with multiple harmonised variables created for each construct to include as broad of a sample as possible [35].

This analysis used a subset of the available studies that (a) included individuals aged between 5 and 18, (b) were either cross-sectional or the first wave of a longitudinal study of accelerometry, and (c) were not primarily focussed on an intervention group. The included studies were the Pelotas Birth Cohort (Brazil), National Health and Nutrition Examination Survey (NHANES; USA), the Avon Longitudinal Study of Parents and Children (ALSPAC; UK) [36, 37], European Youth Heart Study (EYHS; Denmark, Estonia, Norway and Portugal), the Kinder-Sportstudie (KISS; Switzerland) and the Healthy Eating and Play Study (HEAPS)/ Children Living in Active Neighbourhoods Project (CLAN; Australia) (Tables S1 and S2). In total, our sample includes 15,461 individuals, with 4,615 individuals removed due to incomplete or missing detail (Detail available in Figure S1 and Table S3). Gender was coded as a binary (boys/ girls) variable. Reporting of sex and gender varies across the contributing studies, as such, throughout this study the output is treated as a binary interpretation of gender.

Measures of activity

For all individuals, a total count of activity recorded by waist-worn accelerometers was collected, and processed in a consistent manner accounting for differing study protocols [34]. To standardise for differing wear times, the total counts were converted to a mean number of counts per minute (cpm). To demarcate intensity thresholds, Evenson cut points were used (Sedentary < 101 cpm $\leq$ Light < 2296 cpm $\leq$ MVPA). These thresholds have been validated for use in youth samples [38] and their use enables comparisons with existing research. From this, daily mean volumes of time spent in each threshold were calculated, with MVPA being a sum of time in moderate and vigorous activity. To ensure valid comparisons of activity during wakeful hours participants with a mean recording length greater than 16 h (960 min) of recording per day were removed from analysis of either sedentary or counts per minute. In line with

Kretschmer *et al. Int J Behav Nutr Phys Act*   (2023) 20:103

Page 3 of 10

previous research [39–41], this was done to remove individuals who wore their device while asleep (Figure S2, $n = 1,321$; 8.5%).

Analysis

We conducted descriptive analysis of the distributions of each outcome by gender, and estimated the mean, median, standard deviation and skew. Subsequently, the GAMLSS package in R [32, 42] was used to investigate the relative distribution and variation in volumes of physical activity. We estimated percentage differences in the mean and standard deviation between girls and boys using the normal distribution. To examine differences in the median and skewness, a Box-Cox Cole and Green (BCCG) distribution was used. A Box-Cox transformation transforms skewed data to a normal distribution. The power (λ) required to do so is a measure of the nonnormality of the underlying data and is reported here as a measure of skewness. This is estimated by maximum likelihood, and varies by the degree of skew, a power of one is required to transform normal data, with values lower than this for increasingly positive skews, and higher for negative skews [32]. Given the transformation of skewness in a Box-Cox, the measure of central tendency is given by the median. However, due to the log function within BCCG, negative and 0 values cannot be passed, thus any 0 values were recoded to 0.001, this was only necessary for measures of MVPA. GAMLSS requires complete cases to run, as such the sample was restricted to individuals with valid gender, covariate and outcome data.

We first conducted unadjusted models then additionally adjusted for factors which may in part explain or confound gender differences in activity: measured body mass index (kg/m^2, converted to internally calculated gender and age-specific z-scores [43]), parental education, and study. Heights and weights were taken at the time of accelerometry recording, or from the closest time point to accelerometry. No anthropometrics were taken more than 6 months after accelerometry. Details on both parents' education was included in all studies except the Pelotas study, for whom only mothers' education was available. Education was recoded to whether their parents had remained in schooling up to state minimums or whether a parent had received further education, consistent with previous analyses of the ICAD dataset [21].

To test the robustness of the results, and to ensure this was not a function of non-random missingness, sensitivity analyses were conducted. This involved repeating the unadjusted model with the dataset only restricted to complete cases for activity and gender. Ethnicity (white/other) and season were only available in a subset of individuals (Ethnicity: $N = 9,898$, 64%; Season: $N = 9,604$,

62%); we thus adjusted for these factors in additional sensitivity analysis of these countries. MVPA is additionally broken down into moderate and vigorous intensity activities and analysed separately.

Results

After data cleaning 15,461 (Boys: 48.3%) individuals had complete data for analysis (Table 1). The percentage of boys in studies varied between 45% (Denmark) and 52% (Brazil). The mean age of the sample was 11 years 8 months, ranged from 4.35 to 18.42 years (Table 1) and was similar for boys and girls (Figure S3). As study design is mixed, there was variation in the variance between countries, with birth cohort studies having a narrower spread of ages. Boys were taller and heavier than girls in the sample, but the differences were negligible (Δ 2cm & Δ 1kg). Of individuals who reported ethnicity, 70% were white, (70.5% of girls, 69.1% of boys) but this information was missing for Australia and

Table 1 Sample characteristics, and summary of physical activity volumes stratified by gender

	Overall	Girls	Boys
n	15461	7998	7463
Counts Per Minute[a] **(mean (SD))**	588.89 (225.87)	532.91 (200.34)	649.94 (236.11)
MVPA (mean (SD))	52.38 (29.60)	42.94 (23.73)	62.51 (31.84)
Light (mean (SD))	363.36 (78.66)	361.93 (77.74)	364.90 (79.60)
Sedentary[a] **(mean (SD))**	357.23 (99.18)	365.86 (99.40)	347.82 (98.08)
Age (mean (SD))	11.71 (2.72)	11.69 (2.71)	11.72 (2.74)
Height (mean (SD))	148.93 (15.46)	147.98 (14.09)	149.94 (16.74)
Weight (mean (SD))	44.96 (16.86)	44.51 (15.55)	45.45 (18.15)
Ethnicity (white) (%)	8366 (69.8)	4345 (70.5)	4021 (69.1)
Mothers Education (Beyond Compulsory) (%)	8933 (58.5)	4672 (59.1)	4261 (57.9)
Fathers Education (Beyond Compulsory) (%)	7614 (62.5)	3953 (62.7)	3661 (62.3)
Country (%)			
Australia	2395 (15.5)	1256 (15.7)	1139 (15.3)
Brazil	455 (2.9)	217 (2.7)	238 (3.2)
Denmark	1491 (9.6)	816 (10.2)	675 (9.0)
Estonia	594 (3.8)	331 (4.1)	263 (3.5)
Norway	367 (2.4)	180 (2.3)	187 (2.5)
Portugal	637 (4.1)	313 (3.9)	324 (4.3)
Switzerland	385 (2.5)	199 (2.5)	186 (2.5)
UK	4785 (30.9)	2511 (31.4)	2274 (30.5)
USA	4352 (28.1)	2175 (27.2)	2177 (29.2)

[a] Values are reported after exclusion of individuals with more than 16 h of recording per day. Detail on fathers' education was absent in the Brazilian (Pelotas) study

Kretschmer *et al. Int J Behav Nutr Phys Act*   (2023) 20:103

Page 4 of 10

Switzerland. Of those responding, roughly 69% of mothers and fathers had education beyond compulsory level, and this was balanced between girls and boys.

Counts per minute

Boys recorded over 100cpm more than girls on average (Girls: 532.91cpm, Boys: 649.94cpm; Table 1), with estimated values that were 20% greater than that of girls for both the mean and median in the adjusted model (Table 2). Boys had a wider distribution of values (Fig. 1A), marked by a greater standard deviation (Girls: 200.34, Boys: 236.11); 17% larger (Table 2). Both girls and boys had moderately positive measures of skew, with the strength of skewness marginally stronger for girls (as

Table 2 Association between gender and physical activity as measured by counts per minute

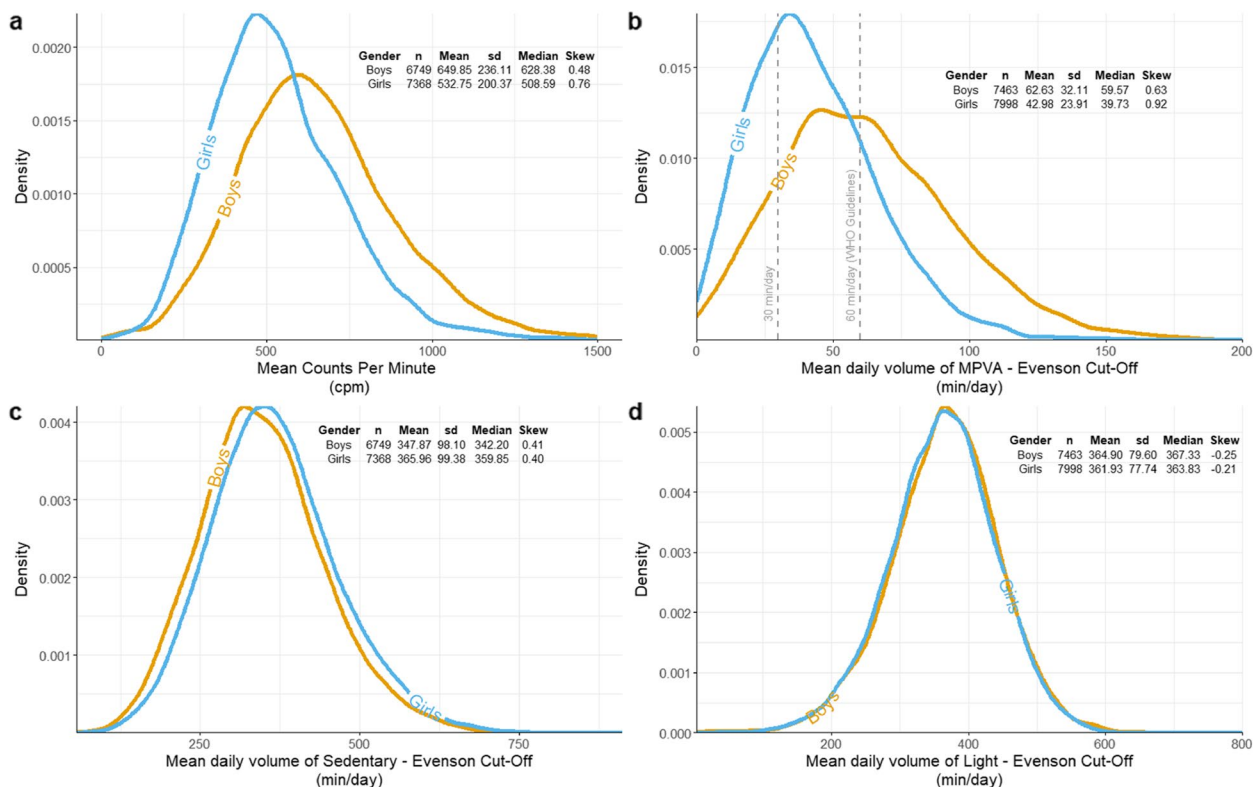| Gender	N (%)	NO distribution		BCCG distribution	
		Mean % Difference (SE)	SD % Difference (SE)	Median % Difference (SE)	Skewness[b]
Girls (ref) Unadjusted	7377 (52.2)	532.91	200.32	513.31	0.48
Boys (Unadjusted Difference)	6763 (47.8)	19.85 (0.62)***	16.42 (1.26)***	21.29 (0.67)***	0.19 (0.03)***
Boys[a] (Adjusted Difference)	6763 (47.8)	19.74 (0.58)***	17.24 (1.19)***	21.14 (0.63)***	0.17 (0.03)***

BCCG Box-Cox Cole and Green distribution, *SD* Standard deviation, *GAMLSS* Generalized Additive Models for Location, Scale and Shape, *SE* Standard error

* $= p < 0.05$, ** $= p < 0.01$, *** $= p < 0.001$

Differences in mean, variability and skewness estimated by GAMLSS

[a] adjusted for parental education, BMI, and country. NO: normal distribution

[b] Skewness is estimated as the Box-Cox power (that is, the power required to transform the outcome to a normal distribution, values closer to 1 represent less skew)

Fig. 1 Density plot of each activity measure with each line representing a gender. **A** displays mean counts per minute by gender, plot is muted at 1,500 cpm to centre of distribution. **B** displays moderate-to-vigorous activity as defined by Evenson cut points. Plot is muted at 200 min/day to show centre of distribution. 60 min per day and 30 min per day are marked by vertical dashed lines. **C** displays light-intensity activity as defined by Evenson cut points. **D** displays sedentary behaviour as defined by Evenson cut points

noted by a score closer to 1 in Table 2). The results were broadly similar across all 9 countries (Figure S5), with the exception of Portugal (EYHS) for which little inequality in the distribution was observed between girls and boys.

Moderate to vigorous physical activity (MVPA)

Using Evenson cut points [38], boys recorded a greater mean (Girls: 42.94 min/day, Boys: 62.51 min/day; Table 1) and median (Girls: 39.71 min/day, Boys: 59.50 min/day) volume of MVPA (Fig. 1 B). By this measure the average (mean) boy was meeting health guidelines of 60 min of MVPA per day, with the mean girl reporting 20 min less than the same target per day. In the adjusted model, boys recorded a mean volume 37% greater and a median 40% greater than girls (Table 3). Boys showed more variation in their daily volumes of MPVA with a greater standard deviation (Girls: 23.73, Boys: 31.84; Fig. 1 B), with an estimated value 30% greater for boys in the adjusted model (Table 3). Both distributions were positively skewed, with

the strength of skewness slightly stronger for girls than boys (Girls: 0.82, Boys: 0.57; Fig. 1 B). As with counts per minute, the results were broadly comparable on a country-by-country level.

Sedentary and light-intensity activity

Girls and boys had similar distributions for sedentary and light-intensity activities; both undertook approximately 6h of sedentary behaviour (Girls: 368.74min/day, Boys: 350.17min/day) and light-intensity activity per day (Girls: 358.58 min/day, Boys: 364.90 min/day; Fig. 1 C and D). The differences were marginal with girls estimated to have 5% higher volumes of sedentary behaviour, and less than 1% lower in light-intensity activity than boys (Tables 4 and 5). Standard deviations were closely aligned for both sedentary (Girls: 98.79, Boys: 97.92) and light-intensity activity (Girls: 77.74, Boys: 79.60) with an estimated difference of 1% and 3% respectively in the adjusted models (Tables 4 and 5). Data for both girls and

Table 3 Association between gender and moderate to vigorous activity as defined by Evenson cut points

Gender	N (%)	NO distribution		BCCG distribution	
		Mean % Difference (SE)	SD % Difference (SE)	Median % Difference (SE)	Skewness[b]
Girls (ref) Unadjusted	7998 (51.7)	42.94	23.80	39.64	0.56
Boys (Unadjusted Difference)	7463 (48.3)	37.64 (0.86)***	29.50 (1.13)***	39.76 (0.98)***	0.08 (0.02)**
Boys[a] (Adjusted Difference)	7463 (48.3)	37.70 (0.79)***	30.25 (1.14)***	40.49 (0.92)***	0.08 (0.02)***

BCCG Box-Cox Cole and Green distribution, *SD* Standard deviation, *GAMLSS* Generalized Additive Models for Location, Scale and Shape, *SE* Standard error

[*] $= p < 0.05$, ** $= p < 0.01$, *** $= p < 0.001$

Differences in mean, variability and skewness estimated by GAMLSS,

[a] Adjusted for parental education, BMI, and country. NO: normal distribution

[b] Skewness is estimated as the Box-Cox power (that is, the power required to transform the outcome to a normal distribution, values closer to 1 represent less skew)

Table 4 Association between gender and sedentary behaviour as defined by Evenson cut points

Gender	N (%)	NO distribution		BCCG distribution	
		Mean % Difference (SE)	SD % Difference (SE)	Median % Difference (SE)	Skewness[b]
Girls (ref) Unadjusted	7377 (52.2)	365.86	99.39	359.64	0.54
Boys (Unadjusted Difference)	6763 (47.8)	-5.01 (0.46)***	-1.34 (1.19)	-5.15 (0.51)***	0.01 (0.05)
Boys[a] (Adjusted Difference)	6091 (47.8)	-5.04 (0.44)***	-1.58 (1.19)	-5.18 (0.458***	-0.01 (0.05)

BCCG Box-Cox Cole and Green distribution, *SD* Standard deviation, *CoV* Coefficient of variation, *GAMLSS* Generalized Additive Models for Location, Scale and Shape, *SE* Standard error

[*] $= p < 0.05$, ** $= p < 0.01$, *** $= p < 0.001$

Differences in mean, variability and skewness estimated by GAMLSS

[a] adjusted for parental education, BMI, and country. NO: normal distribution

[b] Skewness is estimated as the Box-Cox power (that is, the power required to transform the outcome to a normal distribution, values closer to 1 represent less skew)

Table 5 Association between gender and light-intensity activity as defined by Evenson cut points

Gender	N (%)	NO distribution		BCCG distribution	
		Mean % Difference (SE)	SD % Difference (SE)	Median % Difference (SE)	Skewness[b]
Girls (ref) Unadjusted	7998 (51.7)	361.93	77.73	364.43	1.29
Boys (Unadjusted Difference)	7463 (48.3)	0.82 (0.34)*	2.36 (1.14)*	0.90 (0.36)*	0.03 (0.05)
Boys[a] (Adjusted Difference)	7463 (48.3)	0.88 (0.33)**	3.26 (1.14)**	0.87 (0.35)*	-0.02 (0.06)

BCCG Box-Cox Cole and Green distribution, *SD* Standard deviation, *GAMLSS* Generalized Additive Models for Location, Scale and Shape, *SE* Standard error

* $= p < 0.05$, ** $= p < 0.01$, *** $= p < 0.001$

Differences in mean, variability and skewness estimated by GAMLSS

[a] adjusted for parental education, BMI, and country. NO: normal distribution

[b] Skewness is estimated as the Box-Cox power (that is, the power required to transform the outcome to a normal distribution, values closer to 1 represent less skew)

boys were relatively normally distributed, being weakly positively skewed for sedentary behaviour (Table 4) with low, negative measures of skewness for light-intensity activity (Table 5). Within each individual nation, the observed patterns of light activity for girls and boys were broadly similar (Figure S8).

Sensitivity analysis
Results were similar when repeating the unadjusted model with the unrestricted dataset ($n = 18,980$; Tables S4, S5, S6, S7). Adjustment for season and ethnicity made little difference, leading to similar estimated effect sizes of gender for any measure (Tables S8, S9, S10, S11). Separating MVPA into moderate and vigorous intensity activity resulted in similar effects, that were larger for vigorous activities (Tables S12 and S13).

Discussion
Summary of findings
Boys recorded greater mean activity levels than girls but with higher variability, revealing more inequality in activity within boys than girls. This was driven by differences in MVPA: boys spent more time on average in MVPA, with greater variation between them. More equality amongst girls at a lower mean volume implied that few girls in this sample were doing large amounts of MVPA, resulting in a narrow spread of girls centred around median volumes of non-volitional of MVPA.

In contrast, for both sedentary and light-intensity activity, the differences in the distribution for girls and boys were marginal, with little inequality in the variation for either measure or for the total volumes. Time spent at these intensities accounted for most of the waking hours, indicating that differences in overall activity (cpm) are driven by a small subset of daily behaviours in moderate to vigorous thresholds.

Explanation of findings
Consistent with previous studies, girls and boys differed in their mean activity count and volume of MVPA [18–24]. However, the lack of difference in the volume of light-intensity activity implies that the difference between girls and boys in their overall activity was unlikely to be due to 'every day' activities that characterises the light-intensity spectrum, but instead are driven by changes at the upper end of the spectrum, which in context of the included populations would likely align with sports and active play [44–46].

Adding to the existing body of research is a quantification of the difference in the distribution. We observed a higher mean volume of MVPA for boys alongside a higher standard deviation suggesting that not only was the average boy more active than the average girl, more boys occupied the highest volumes of activity (Fig. 1B). Volumes of MVPA were more homogenous in girls, but clustered around a lower value. A possible explanation of this is that there was less inequality in volumes of 'day-to-day' MVPA (i.e. active commutes or physical education classes; In Fig. 1B the volume of MVPA at which the peak density is observed is relatively close between girls and boys), but a larger proportion of boys were undertaking additional volitional activity, increasing the inequality between genders and within boys [47].

As such, when interpreting differences between girls and boys in mean volumes of activity, changes were not driven by the whole population, but instead driven by the subset undertaking additional activity. The larger subset of boys undertaking near daily volitional sports or active play for at least an hour per day on top of their other activities provided more balance to the distribution despite the increased heterogeneity, resulting in a larger standard deviation yet lower skew.

While almost all countries show similar gender differences, Portugal did not have as much of a gender divide in total activity (cpm) as other nations did (Figure S2). Within this sample boys were less active when compared to other constituent studies than girls, with Portuguese boys ranked 8th (of 8) in median counts per minute compared to 5th for Portuguese girls. While girls and boys may have equal opportunity to undertake non-volitional activity, limited access to sport and leisure facilities on the island of Madeira [48] may equalise opportunities for individuals to engage in volitional activity [49], reducing the opportunities for a difference between boys and girls to emerge. Alternatively, it may be that on Madeira, the volitional activities that would differentiate individuals are not accounted for by the mode of accelerometry, such as swimming or cycling. A study of self-reported activity in the Azores, which included swimming and cycling, did observe boys to undertake more activity [50], but self-reports may undervalue the contribution of non-volitional activity [51].

Potential implications

Deficits between girls and boys in total activity observed here (measured by CPM) were derived from difference in MVPA. If the deficit was due to a lack of opportunities for sport and active play for girls, targeting interventions at higher intensity activities could be central to reducing the inequality between girls and boys. However, such interventions could increase opportunities for those who are already somewhat active but lead to little change amongst the least active. If that is the case, then increasing opportunities for volitional activity for girls without centring the interests of those less active [52] may inadvertently act to increase the inequality within girls. To maximise the efficacy of MVPA focussed interventions it may also be necessary to address the socio-cultural reasons for lower uptake of active play and sport by girls [33, 53, 54] and create targeted interventions for the less active, such as those referred to elsewhere as 'stealth interventions' [52].

Beyond differences between girls, activity remains low for most children both in this study and in other research [16, 17]. Given the similarity between girls and boys in light-intensity activity (Fig. 1D) repeated across all constituent studies in the present research (Figure S5), it may be that an intervention that targets light-intensity activity, such as improving community walkability, is more likely to have an impact for both genders than an intervention that targets more strenuous activity (such as sports).

Strengths and limitations

The sample size in this study was extensive, spanning multiple countries, which suggests that results may be generalisable across multiple cultures. Further, using harmonised, objective measures of physical activity captured a large range of activity at multiple intensities, rather than behaviours that are challenging to accurately recall. Processing this data in a consistent manner avoided issues associated with comparing between differing methodologies. Finally, by employing a GAMLSS analysis across all intensity thresholds, differences between the distribution were tested, allowing difference in the spread and skewness of samples to be directly examined.

GAMLSS has limitations to its use; the requirement of complete cases restricts the sample size throughout. While this presents a risk that the data was not missing at random, no notable changes in the results were seen during sensitivity analyses. Accelerometry is limited in its ability to measure resistance-based activities, and activities like cycling. Of the included studies, this may have led to underestimated volumes of activity in Danish EYHS study, in which most students cycle to school multiple times per week [55]. However rates of cycling are not expected to differ between boys and girls [56]. Further, to ensure backward compatibility between different accelerometers, recordings from newer devices were re-processed at the resolution of the oldest devices coming at the cost of some resolution [34]. All included data was collected between 1997 and 2007, as such more recent data could provide a more accurate estimate of current activity distributions. As the sample draws from countries with broadly similar political, economic and cultural practices, further work is needed in low-to-middle income nations [57].

Conclusions

In addition to inequality between girls and boys, we observed sizable and variable levels of inequality within each gender. Differences in overall activity (cpm) were mainly driven by the upper end of the activity spectrum; both the higher intensity activities (MVPA) and the most active individuals. Boys were more active on average, but this is due to a sizable subset of boys undertaking high volumes of MVPA, rather than all boys doing a small amount more than girls. Attention should therefore be placed on the full distribution of individuals, as an intervention may narrow the difference between boys and girls yet, by focussing this change on a subset of individuals, it may exacerbate the inequality within boys and girls. For equitable change in children's activity, interventions should aim to benefit those in the lowest quantiles as effectively as the highest.

Kretschmer *et al. Int J Behav Nutr Phys Act*   (2023) 20:103

Page 8 of 10

Abbreviations

ALSPAC	Avon Longitudinal Study of Parents and Children
BCCG	Box-Cox Cole and Green
BMI	Body Mass Index
CLAN	Children Living in Active Neighbourhoods
CPM	Counts Per Minute
EYHS	European Youth Heart Survey
GAMLSS	Generalised Additive Models of Location, Shape, and Scale
HEAPS	Healthy Eating And Play Study; ICAD: International Children's Accelerometry Database
KISS	Kinder-Sportstudie
MVPA	Moderate-to-Vigorous intensity Physical Activity
NHANES	National Health And Nutrition Examination Survey
SD	Standard Deviation

Supplementary Information

The online version contains supplementary material available at https://doi.org/10.1186/s12966-023-01496-0.

Additional file 1.

Authors' contributions

LK, MD, GDS, and DB designed the research question and analysis plan, to which LBA, PH, KN, and LS provided critical input. LBA, PH, KN, and LS led original data acquisition. LK analysed the data and wrote the initial draft. All authors read and revised the manuscript and approved the final version.

Availability of data and materials

Data in the present study was used under licence from MRC Epidemiology Unit, Cambridge and are not publicly available. A complete markdown document for all analyses (Cleaning, analysis in the main article and those in the sensitivity analysis) is available here.

Declarations

Ethics approval and consent to participate

All studies in the ICAD were approved by local ethics committees, and informed consent was obtained from all participants and their legal authorised representatives.

Consent for publication

Not applicable.

Competing interests

The authors declare that they have no competing interests.

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Kretschmer *et al. Int J Behav Nutr Phys Act*   (2023) 20:103

Page 9 of 10

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Kretschmer *et al. Int J Behav Nutr Phys Act*   (2023) 20:103

Page 10 of 10

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