

Screen-Based Behaviors as Moderators of the Link Between Physical Activity and Internalizing and Externalizing Symptoms in Adolescents: A Population-Based Cohort Study

Ruimin Ma,¹ Eugenia Romano,¹ Dara Aldisi,² Nasser M. Al-Daghri,³ Shaun Sabico,³ Arnold Baca,⁴ Guillermo Felipe López Sánchez,⁵ Lee Smith,⁶ Liye Zou,⁷ José Francisco López-Gil,^{8,9} Brendon Stubbs,^{1,4} and André O. Werneck¹⁰

¹Psychological Medicine, Institute of Psychiatry, Psychology and Neuroscience (IoPPN), King's College London, London, United Kingdom; ²Department of Community Health Sciences, College of Applied Medical Sciences, King Saud University, Riyadh, Saudi Arabia; ³Biochemistry Department, College of Science, King Saud University, Riyadh, Saudi Arabia; ⁴Center for Sport Science and University Sports, University of Vienna, Wien, Austria; ⁵Division of Preventive Medicine and Public Health, Department of Public Health Sciences, School of Medicine, University of Murcia, Murcia, Spain; ⁶Center for Health, Performance and Wellbeing, Anglia Ruskin University, Cambridge, United Kingdom; ⁷Body-Brain-Mind Laboratory, School of Psychology, Shenzhen University, Shenzhen, GD, China; ⁸School of Medicine, Universidad Espíritu Santo, Samborombón, Ecuador; ⁹Vicerrectoría de Investigación y Postgrado, Universidad de los Lagos, Osorno, Chile; ¹⁰Center for Epidemiological Research in Nutrition and Health, Department of Nutrition, School of Public Health, Universidade de São Paulo (USP), São Paulo, SP, Brazil

Background: Increased engagement in screen-based behaviors may contribute to decreased physical activity (PA) participation and is associated with mental health among adolescents. Yet, there remain knowledge gaps in how types and duration of screen-based behaviors may moderate the associations between PA, psychological distress, internalizing, and externalizing symptoms. This population-based study aimed to examine this relationship. **Methods:** Longitudinal data were obtained from the Millennium Cohort Study and adolescents were followed up from the 14-year to 17-year waves. Data on device-based moderate to vigorous PA (MVPA), screen-based behaviors (watching videos and playing videogames), internalizing (emotional and peer problems) and externalizing symptoms (hyperactivity and conduct problem), and psychological distress were analyzed using negative binomial regression (stratified by gender) with interaction terms of continuous device-based PA and categorical screen-based behaviors being applied. **Results:** The final sample included 3397 adolescents (mean age = 13.8, 54% girls). Device-based MVPA was associated with a lower incidence of emotional problems (boys [incidence rate ratio (IRR) = 0.97], and girls [IRR = 0.98]), peer problems (IRR = 0.97), and psychological distress (girls only, IRR = 0.98). Video watching for ≥ 2 hours per day was associated with a higher incidence of conduct problem in boys (IRR = 1.20) and videogames playing ≥ 2 hours per day was associated with all internalizing and externalizing symptoms in girls (IRR range 1.10–1.21). A buffering effect of MVPA on various symptoms among those spent < 2 hours per day on screen-based behaviors was observed. **Conclusions:** Reducing screen-based behaviors may help maximize the benefits of MVPA on mental health outcomes in adolescents therefore implementing interventions targeting screen-based behaviors reduction should be recognized as first-line priority.

Keywords: internalizing problems, externalizing problems, mental health, screen time, exercise, sedentary time

Key Points

- Moderate-to-vigorous physical activity is linked to fewer emotional, peer, and psychological distress symptoms, especially in girls.
- Screen time over 2 hours daily is associated with increased internalizing and externalizing problems, particularly among girls who play videogames.
- Moderate-to-vigorous physical activity appears most beneficial for mental health when screen-based behaviors are kept under 2 hours per day.

There are growing concerns around the mental health of young people including adolescents.¹ Recent reports indicate how adolescents' mental distress has increased sharply in the last decades which has been expedited by the coronavirus disease

2019 (COVID-19) pandemic.^{2,3} Given that at least 50% of mental health conditions first develop in adolescence and early intervention at this critical period is key, there is an urgent need to identify modifiable factors (typically referring to risk and/or


Romano  <https://orcid.org/0000-0003-4112-2787>

Aldisi  <https://orcid.org/0000-0001-5202-4432>

Al-Daghri  <https://orcid.org/0000-0001-5472-1725>

Sabico  <https://orcid.org/0000-0002-5248-2350>

Baca  <https://orcid.org/0000-0002-1704-0290>

López Sánchez  <https://orcid.org/0000-0002-9897-5273>


Smith  <https://orcid.org/0000-0002-5340-9833>

Zou  <https://orcid.org/0000-0001-6411-5710>

López-Gil  <https://orcid.org/0000-0002-7412-7624>

Stubbs  <https://orcid.org/0000-0001-7387-3791>

Werneck  <https://orcid.org/0000-0002-9166-4376>

Ma (ruimin.l.ma@kcl.ac.uk) is corresponding author,  <https://orcid.org/0000-0002-6051-8093>

protective factors) which could help develop effective preventive measures.

Among the protective factors for better mental health and a reduced risk of mental illness, regular engagement in physical activity (PA) has been increasingly recommended by researchers and health professionals.⁴⁻⁶ Specifically, PA is widely recognized for its benefits, both for physical health and for mental well-being.^{7,8} For example, previous studies indicated that engagement in PA is associated with less stress, pain, and sleep complaints, as well as with lower depressive symptoms in people with or without mental illness.^{5,9} Among adolescents with sub-threshold mood disorders, exercise can improve mental health, possibly through changes in the gut microbiome and key structural changes in the brain.^{10,11} However, maintaining a high PA level is becoming increasingly challenging for adolescents, with social barriers reported, such as feeling self-conscious, a lack of time to dedicate to PA, lack of availability of interesting sports in their area, or preference for other types of leisure activities.^{12,13}

Simultaneously to such barriers, a dramatic increase in screen-based behaviors or activities has been documented over the last years¹⁴ and potentially acts as a potential risk factor for low PA among adolescents. Although screen-based behaviors can be performed while sedentary or physically active, most of screen-based behaviors are predominantly sedentary.¹⁵ Consistent with the Displacement Theory,¹⁶ current evidence supports the idea that the increased amount of time spent on sedentary behaviors or activities may displace time spent on PA. For example, a study on the association between screen-based activities and PA among adolescents found that participants who spent less time on TV/movie streaming and playing electronic games had significantly higher odds of participating in PA,¹⁷ and a study on US youth found a trend in increased screen time, while adherence to PA guidelines seemed to decrease,^{18,19} highlighting a need for public health efforts to reduce screen time and promote PA among adolescents.

Furthermore, hours of screen time were observed to negatively link to lower well-being, higher anxiety and depression in adolescents.²⁰ Total screen use has shown a longitudinal association with a higher risk of self-harm and suicidal behavior in young people,²¹ although relationship seems to be complex and influenced by variables, such as type of device²² and specific characteristics of sedentary behavior such as cognitively active versus passive sedentary behaviors.²³ For example, there is evidence of moderation for screen-type on the association between screen-based sedentary behaviors, symptoms of depression and anxiety in adolescents.²⁴ Overall, this suggests that while the relationship between device-based PA and mental health is well-established, the moderating role of screen-based behaviors in this relationship needs to be further investigated. Therefore, this study aims to analyze the moderating role of screen-based behaviors on the prospective association between device-based moderate to vigorous PA (MVPA) and internalizing and externalizing symptoms in adolescents.

Methods

Design and Sample

The present research used data from the Millennium Cohort Study, which is a prospective cohort including a nationally representative sample of children born between September/2000 and January/

2002 in the United Kingdom.²⁵ Considering potential higher sample losses, children from lower socioeconomic backgrounds and ethnic minority areas were oversampled. Considering that device-based PA was assessed at the 14-year wave for the first time during adolescence among participants of the Millennium Cohort Study, we included data from the 14-year (2015), and 17-year (2018) waves. Our study initially included 18,818 participants in the cohort. However, 11,276 families took part in the 14-year wave. Considering that there were not enough accelerometers for all the cohort members, a random subsample including 81% of the eligible cohort members in England was created, while all the eligible participants living in Wales, Scotland, and Northern Ireland were invited to take part in the accelerometer study. From the 11,276 families included in the 14-year wave, 10,337 cohort members were eligible for using the accelerometers. However, devices were worn by 1153 participants (the main reason was due to refusal), 2448 devices were not returned, and 503 devices were broken or returned with no data. Considering the 6233 cohort members that have returned the devices, data were not processed in 1122 (most cases because data were not collected for the specified days), 307 participants did not present one valid day with at least 10 valid hours, and 645 presented only one valid day. Therefore, 4159 participants presented valid data on device-based PA. Of those, 3397 also presented valid data on mental health-related outcomes at 17 years of age. Ethical approval for all procedures was obtained from the Northern and Yorkshire Multi-Center Research Ethics Committee of the National Health Service, and informed consent was secured from all participating families.

Internalizing and Externalizing Symptoms at 17 Years

Internalizing and externalizing symptoms were estimated using the Strengths and Difficulties Questionnaire (SDQ),²⁶ self-reported by the cohort member. The SDQ, includes 2 subscales related to internalizing symptoms (ie, emotional and peer problems) and 2 related to externalizing symptoms (ie, hyperactivity and conduct problems), comprising five 3-point Likert scale items each. Clinical cut-off scores for total score and each subscale have been proposed: total score ≥ 17 , emotional ≥ 5 , peer problems ≥ 4 , hyperactivity ≥ 7 , and conduct problems ≥ 4 .²⁷ The 6-item Kessler Psychological Distress Scale was used to estimate psychological distress.²⁸ The scale asks the frequency of which the respondent experience different feelings (ie, nervousness, hopelessness, lack of energy, depressive mood, restlessness, and worthlessness), in a 5-item Likert scale. Total scores ranged from 0 to 24, with higher scores indicating worse symptoms.

MVPA and Screen-Based Behaviors at 14 Years

MVPA was estimated using the triaxial GENEActiv accelerometer (ActivInsights Ltd). The device was used on the nondominant wrist for 2 days, including a weekday, and one weekend day. Previous validation study found that the GENEActiv monitor was able to predict more than 70% of the measured oxygen consumption in different activities and there was agreement with an ActiGraph device.²⁹ Data were downloaded using the GENEActiv software and raw data was treated using the DDIR package in R. An epoch of 5 seconds was adopted and the analysis included all days with at least 10 hours of valid data, and we included participants with 2 valid days. PA was estimated using the Euclidean Norm Minus One. The cutoff point of Euclidean Norm Minus One ≥ 100 mg was adopted in each epoch for MVPA.³⁰

We assessed time watching videos and playing videogames as screen-based behaviors. Watching videos was estimated through the question: “On a normal week day during term time, how many hours do you spend watching television programs or films? Please remember to include time spent watching programs or films on a computer, or mobile device, as well as on a TV, DVD, etc. Please also include time spent before school as well as time after school” Videogame use was assessed through the following question: “On a normal week day during term time, how many hours do you spend playing electronic games on a computer or games systems, such as Wii, Nintendo D-S, X-Box or PlayStation? Please remember to include time before school as well as time after school.” Possible answers for each question were: “None,” “Less than half an hour,” “Half an hour to less than 1 hour,” “1 hour to less than 2 hours,” “2 hours to less than 3 hours,” “3 hours to less than 5 hours,” “5 hours to less than 7 hours,” or “7 hours or more.” Although these specific questions were not previously validated, they are widely used and previous studies using similar questionnaires found good reproducibility.³¹ We categorized watching videos and playing videogames using the cut-off point of 2 hours based on the Canadian 24-Hour Movement Guidelines,³² by considering the computing of each category.

Potential Confounders

We selected potential confounders based on existing evidence.^{33,34} Maternal education, ethnicity, maternal psychological distress, age, season of accelerometer use (for MVPA analysis), accelerometer wear time (for MVPA analysis), and strength and difficulties questionnaire (total difficulties) at 14 years were adopted as potential confounders. Age was used as a continuous variable. Ethnicity was self-reported by the main caregiver, and classified as White, Mixed (ie, multiple ethnic backgrounds), Indian, Pakistani or Bangladeshi, Black or Black British, or other. Parent’s education was assessed considering the highest academic achievement. Parent’s psychological distress was assessed using the Kessler psychological distress scale.²⁸ Total accelerometer wear time was derived from the mean time of the valid accelerometer days. The season of accelerometer use was computed based on the first valid day of accelerometer use. Total difficulties derived from the SDQ questionnaire were estimated using the main caregiver report of the SDQ at 14 years.

Statistical Analysis

We used values of mean or relative frequency, along with their respective 95% CIs, to describe the characteristics of the sample. Considering the nature of the outcomes, which presented overdispersion (ie, variance-to-mean ratio > 1), we used negative binomial regression for the main associations. Initially, we tested the individual associations of device-based MVPA, watching videos, and playing videogames at 14 years old with internalizing and externalizing symptoms at 17 years old, stratified by gender. To test the potential moderation of screen-based behaviors in the association of MVPA with internalizing and externalizing symptoms, we included interaction terms of continuous MVPA, and categorical time spent watching videos and playing videogames in the models. We also conducted analyses of the association between device-based MVPA at 14 years old and internalizing and externalizing symptoms at 17 years old, stratified by screen-based behaviors. The analyses were adjusted for maternal education, ethnicity, maternal psychological distress, age, season of accelerometer use (for MVPA analysis), accelerometer wear time (for MVPA analysis),

and SDQ (total difficulties) score at 14 years old. For ease of interpretation, MVPA was standardized in units of 30 minutes. Incidence rate ratio (IRR) and 95% CI were reported. We considered the cluster sampling design structure in all the analyses by using appropriate sample weights.³⁵ All analyses were conducted using Stata 18 software.

Results

The current study, included a total of 3397 adolescents (mean age = 13.8; 95% CI, 13.7–13.8), including 1828 girls and 1569 boys, with a majority from a White ethnic background. MVPA time of our sample was 129 minutes per day with a slightly longer mean MVPA time among boys (mean = 136 min/d) than girls (mean = 124 min/d). Our sample on average scored 7 on the SDQ at age 14, but the total difficulties score increased to 11 at age 17. Table 1 presents detailed characteristics of our sample.

Association Between Device-Based MVPA, Screen-Based Activities at Age 14 and Internalizing and Externalizing Problems at Age 17

Among boys, after adjusting for confounders, higher device-based MVPA was associated with a lower incidence of emotional problems (IRR = 0.97; 95% CI, 0.95–0.99), but a higher incidence of hyperactivity (IRR = 1.02; 95% CI, 1.01–1.04). Watching videos more than 2 hours per day was associated with a higher incidence of conduct problems (IRR = 1.20; 95% CI, 1.06–1.35), compared with watching videos for less than 2 hours per day (Table 2).

Among girls, in the adjusted model, higher device-based MVPA was associated with a lower incidence of peer problems (IRR = 0.97; 95% CI, 0.96–0.99), emotional problems (IRR = 0.98; 95% CI, 0.97–0.99), and psychological distress (IRR = 0.98; 95% CI, 0.97–0.99), but a higher incidence of hyperactivity (IRR = 1.01; 95% CI, 1.01–1.02). Playing videogames for more than 2 hours per day, on the other hand, was associated with a higher incidence of all internalizing and externalizing problems (peer problem: IRR = 1.14, 95% CI, 1.03–1.27; emotional problems: IRR = 1.12, 95% CI, 1.05–1.21; hyperactivity: IRR = 1.10, 95% CI, 1.03–1.18; conduct problems: IRR = 1.21, 95% CI, 1.07–1.37; psychological distress: IRR = 1.10, 95% CI, 1.02–1.19), as well as total difficulties (IRR = 1.13; 95% CI, 1.07–1.19), compared with playing videogames for less than 2 hours per day (Table 3).

Moderation of Screen-Based Behaviors in the Association of Device-Based MVPA and Internalizing and Externalizing Problems

Table 4 presents the association between device-based MVPA at age 14, and internalizing and externalizing problems at age 17, moderated by 2 screen-based behaviors at age 14 (ie, watching videos and playing videogames). Among boys, there was an interaction between watching videos and MVPA at 14 years, with MVPA promoting a higher protection against total difficulties at 17 years (IRR = 0.96, 95% CI, 0.94–0.99) in the group with lower screen-based behaviors, without significant associations in the stratified analyses. In the stratified analyses, MVPA at 14 years was associated with lower peer and emotional problems at 17 years in the group with lower time watching videos, but was associated with higher hyperactivity and conduct problems among those with

Table 1 Baseline Characteristics of the Sample

Variable	Category or measure	Whole sample (N = 3397)	Girls (n = 1828)	Boys (n = 1569)
Mother's psychological distress	Score	3.78 (3.58 to 3.96)	3.97 (3.76 to 4.17)	3.55 (3.26 to 3.85)
Mother's education	NVQ Level 1, %	5.0 (4.1 to 6.1)	4.1 (3.1 to 5.4)	6.0 (4.5 to 7.8)
	NVQ Level 2, %	25.7 (23.3 to 28.3)	26.6 (23.4 to 30.0)	24.7 (21.5 to 28.2)
	NVQ Level 3, %	13.2 (11.8 to 14.9)	13.7 (11.9 to 15.9)	12.7 (10.6 to 15.1)
	NVQ Level 4, %	35.8 (33.3 to 38.4)	33.2 (30.2 to 36.3)	38.8 (35.2 to 42.5)
	NVQ Level 5, %	12.9 (10.9 to 15.1)	13.9 (11.7 to 16.4)	11.7 (8.4 to 16.1)
	Overseas qualification only, %	2.2 (1.6 to 2.9)	2.6 (1.8 to 3.7)	1.7 (1.1 to 2.8)
Ethnicity	None of these, %	5.2 (4.3 to 6.4)	5.9 (4.7 to 7.5)	4.4 (3.3 to 5.9)
	White, %	88.2 (85.6 to 90.4)	88.4 (85.6 to 90.8)	87.9 (85.0 to 90.3)
	Mixed, %	3.7 (2.9 to 4.5)	3.3 (2.4 to 4.4)	4.1 (3.1 to 5.4)
	Indian, %	1.7 (1.2 to 2.5)	1.5 (0.9 to 4.4)	2.0 (1.3 to 5.4)
	Pakistani, %	2.3 (1.5 to 3.6)	2.5 (1.6 to 3.9)	2.1 (1.3 to 3.4)
	Bangladeshi, %	0.8 (0.4 to 1.5)	0.8 (0.4 to 1.4)	0.9 (0.4 to 2.1)
	Black Caribbean, %	0.4 (0.2 to 0.7)	0.6 (0.3 to 1.2)	0.2 (0.1 to 0.4)
	Black African, %	1.2 (0.7 to 2.1)	1.1 (0.6 to 2.0)	1.3 (0.6 to 2.7)
MVPA	Other, %	1.7 (1.1 to 2.5)	1.8 (1.1 to 2.8)	1.6 (0.9 to 2.7)
	min/d	129.2 (126.2 to 132.1)	123.6 (119.3 to 128.0)	135.5 (131.9 to 139.0)
Accelerometer wear time	h/d	22.2 (22.1 to 22.3)	22.4 (22.2 to 22.5)	22.0 (21.9 to 22.2)
Watching videos	<2 h/d, %	34.5 (32.3 to 36.8)	32.5 (29.8 to 35.4)	36.8 (33.2 to 40.5)
	≥2 h/d, %	65.5 (63.2 to 67.7)	67.5 (64.6 to 70.2)	63.2 (59.5 to 66.8)
Playing videogame	<2 h/d, %	62.3 (59.9 to 64.7)	83.0 (80.9 to 84.9)	40.6 (36.4 to 45.0)
	≥2 h/d, %	37.7 (35.3 to 40.1)	17.0 (15.1 to 19.1)	59.4 (55.0 to 63.6)
Season of assessment	Spring, %	34.3 (31.5 to 37.1)	33.4 (30.3 to 36.6)	35.2 (31.2 to 39.5)
	Summer, %	33.5 (30.8 to 36.3)	34.4 (31.2 to 37.8)	32.5 (29.0 to 36.2)
	Autumn, %	17.0 (15.1 to 19.0)	17.1 (14.9 to 19.7)	16.8 (14.5 to 19.4)
	Winter, %	15.3 (13.2 to 17.6)	15.1 (12.5 to 18.0)	15.5 (13.0 to 18.3)
Total difficulties at age 14 (SDQ)	Score	7.12 (6.86 to 7.39)	6.95 (6.64 to 7.25)	7.32 (6.92 to 7.72)
Internalizing and externalizing symptoms at 17 y				
Peer problem	Score	2.10 (2.02 to 2.18)	2.13 (2.03 to 2.24)	2.06 (1.95 to 2.18)
Emotion	Score	3.58 (3.47 to 3.68)	4.33 (4.18 to 4.48)	2.73 (2.60 to 2.87)
Hyperactivity	Score	3.90 (3.78 to 4.01)	3.77 (3.63 to 3.90)	4.04 (3.87 to 4.22)
Conduct	Score	1.55 (1.48 to 1.63)	1.38 (1.30 to 1.45)	1.75 (1.62 to 1.88)
Total difficulties	Score	11.12 (10.86 to 11.39)	11.60 (11.27 to 11.94)	10.59 (10.20 to 11.00)
Psychological distress ^a	Score	7.30 (7.06 to 7.52)	8.23 (7.93 to 8.53)	6.23 (5.95 to 6.51)

Abbreviations: MVPA, moderate to vigorous Physical activity; NVQ, National Vocational Qualifications; SDQ, the Strengths and Difficulties Questionnaire. Note: Values are presented as mean or relative frequency as well as their corresponding 95% CI. *P* values < .05 are marked in bold.

^aMeasured by the 6-item Kessler psychological distress scale.

higher time watching videos. Regarding time playing videogame, there was a significant interaction with MVPA at 14 years in the associations with emotional problem (IRR = 0.93, 95% CI, 0.88–0.98), conduct problems (IRR = 0.93, 95% CI, 0.87–0.99), total difficulties (IRR = 0.96, 95% CI, 0.93–0.99), and psychological distress (IRR = 0.94, 95% CI, 0.91–0.98) at 17 years, with all of them indicating a lower risk for each outcome, related with MVPA among the group with lower time playing videogame. Stratified analyses found that MVPA at 14 years was associated with lower emotional problem and psychological distress in the group with lower time playing videogame, but a higher risk for hyperactivity and conduct problems in those with greater time playing videogame. In the stratified analysis, MVPA at 14 years was associated with lower emotional problems and psychological distress at 17 years in

the group with lower time playing videogames, while MVPA was associated with higher hyperactivity and conduct problems in the group with higher time playing videogame.

Among girls, there was an interaction between watching videos and device-based MVPA, with a higher protection against emotional problems (IRR = 0.95, 95% CI, 0.91–0.99) and psychological distress (IRR = 0.95, 95% CI, 0.91–0.99) at 17 years, with a higher protection in the group with <2 hours per day. In the stratified analysis, higher MVPA was associated with lower peer problems, emotional problems, total difficulties, and psychological distress in the group spent <2 hours per day watching videos, as well as associated with lower peer problems in those who spent more time watching videos. Among those with higher time playing videogames, although there were no significant interactions,

Table 2 Individual Associations of MVPA, Watching Videos, and Playing Videogame at 14 Years With Internalizing and Externalizing Symptoms at 17 Years Among Boys

	Peer problem IRR (95% CI)	Emotional problems IRR (95% CI)	Hyperactivity IRR (95% CI)	Conduct problems IRR (95% CI)	Total difficulties IRR (95% CI)	Psychological distress IRR (95% CI)
Crude						
MVPA, 30 min ^a	0.97 (0.94–1.00)	0.96 (0.94–0.99)	1.02 (1.01–1.03)	1.02 (0.99–1.05)	1.00 (0.98–1.01)	0.98 (0.96–0.99)
Watching videos						
≥2 h/d (ref : <2 h/d)	1.10 (0.98–1.24)	0.94 (0.85–1.04)	1.09 (1.01–1.18)	1.23 (1.07–1.40)	1.07 (1.00–1.15)	1.02 (0.93–1.11)
Playing videogame						
≥2 h/d (ref : <2 h/d)	1.17 (1.05–1.31)	1.12 (1.02–1.23)	1.03 (0.93–1.13)	1.05 (0.89–1.24)	1.08 (1.00–1.18)	1.06 (0.98–1.15)
Adjusted						
MVPA, 30 min	0.98 (0.95–1.01)	0.97 (0.95–0.99)	1.02 (1.01–1.04)	1.02 (1.00–1.05)	1.00 (0.98–1.01)	0.98 (0.96–1.00)
Watching videos						
≥2 h/d (ref : <2 h/d)	1.07 (0.96–1.19)	0.94 (0.85–1.03)	1.08 (1.00–1.16)	1.20 (1.06–1.35)	1.05 (0.99–1.13)	1.01 (0.93–1.10)
Playing videogame						
≥2 h/d (ref : <2 h/d)	1.11 (1.00–1.21)	1.09 (0.99–1.19)	1.00 (0.91–1.09)	1.01 (0.87–1.16)	1.04 (0.97–1.13)	1.03 (0.95–1.11)

Abbreviations: IRR, incidence rate ratios; MVPA, moderate to vigorous physical activity. Note. Adjusted for maternal education, ethnicity, maternal psychological distress, age, season of accelerometer use (for MVPA analysis), accelerometer wear time (for MVPA analysis), and strength and difficulties questionnaire (total difficulties) at 14 years. *P* values < .05 are marked in bold.

^aStandardized in units of 30 minutes.

Table 3 Individual Associations of MVPA, Watching Videos, and Playing Videogame at 14 Years With Internalizing and Externalizing Symptoms at 17 Years Among Girls

	Peer problem IRR (95% CI)	Emotional problem IRR (95% CI)	Hyperactivity IRR (95% CI)	Conduct problems IRR (95% CI)	Total difficulties IRR (95% CI)	Psychological distress IRR (95% CI)
Crude						
MVPA, 30 min ^a	0.97 (0.95–0.99)	0.98 (0.97–0.99)	1.02 (1.01–1.02)	0.99 (0.97–1.01)	0.99 (0.98–1.00)	0.98 (0.97–0.99)
Watching videos						
≥2 h/d (ref : <2 h/d)	1.10 (0.99–1.22)	1.08 (0.99–1.17)	1.06 (0.98–1.16)	1.10 (0.99–1.22)	1.08 (1.00–1.16)	1.09 (1.00–1.18)
Playing videogame						
≥2 h/d (ref : <2 h/d)	1.25 (1.11–1.39)	1.18 (1.10–1.27)	1.16 (1.08–1.25)	1.32 (1.17–1.48)	1.20 (1.14–1.27)	1.18 (1.09–1.27)
Adjusted						
MVPA, 30 min	0.97 (0.96–0.99)	0.98 (0.97–0.99)	1.01 (1.01–1.02)	0.99 (0.98–1.01)	0.99 (0.99–1.00)	0.98 (0.97–0.99)
Watching videos						
≥2 h/d (ref : <2 h/d)	1.05 (0.95–1.16)	1.05 (0.97–1.14)	1.04 (0.95–1.13)	1.05 (0.94–1.17)	1.05 (0.98–1.12)	1.05 (0.98–1.14)
Playing videogame						
≥2 h/d (ref : <2 h/d)	1.14 (1.03–1.27)	1.12 (1.05–1.21)	1.10 (1.03–1.18)	1.21 (1.07–1.37)	1.13 (1.07–1.19)	1.10 (1.02–1.19)

Abbreviations: IRR, incidence rate ratios; MVPA, moderate to vigorous physical activity. Note. Adjusted for maternal education, ethnicity, maternal psychological distress, age, season of accelerometer use (for MVPA analysis), accelerometer wear time (for MVPA analysis), and strength and difficulties questionnaire (total difficulties) at 14 years. *P* values < .05 are marked in bold.

^aStandardized in units of 30 minutes.

stratified analyses indicate a significant association between higher MVPA and lower peer problems, emotional problems, and psychological distress among those spent less time playing videogames, and lower peer problems in those with greater time playing videogames.

Discussion

Adolescence is a critical phase marked by an increased susceptibility to both internalizing and externalizing problems,³⁶ with

increased level of screen-based sedentary behaviors but dramatically decreased PA level following COVID-19 being particularly evident.^{37,38} The current study observed a longitudinal impact of device-based MVPA level at 14 years on internalizing and externalizing problems, such as emotional problems, and hyperactivity among adolescents at 17 years. Spending more time watching videos at 14 years was associated with an increased risk for conducted problems at 17 years among boys, playing videogame for more than 2 hours per day was longitudinally associated with increased risk for all internalizing and externalizing

Table 4 Association Between MVPA at 14 Years and Internalizing/Externalizing Symptoms, Stratified by Watching Videos and Playing Videogame as Well as Their Corresponding Interaction

	Peer problem IRR (95% CI)	Emotional problem IRR (95% CI)	Hyperactivity IRR (95% CI)	Conduct problems IRR (95% CI)	Total difficulties IRR (95% CI)	Psychological distress IRR (95% CI)
Boys						
Watching videos						
<2 h/d	0.95 (0.90–0.99)	0.95 (0.91–0.99)	1.02 (1.00–1.05)	0.98 (0.93–1.04)	0.98 (0.96–1.01)	0.97 (0.94–1.01)
≥2 h/d	0.99 (0.95–1.02)	0.98 (0.95–1.01)	1.02 (1.01–1.04)	1.04 (1.01–1.06)	1.01 (0.99–1.02)	0.99 (0.96–1.01)
Multiplicative interaction	0.96 (0.90–1.02)	0.95 (0.90–1.01)	0.99 (0.96–1.02)	0.94 (0.89–1.00)	0.96 (0.94–0.99)	0.98 (0.93–1.02)
Playing videogame						
<2 h/d	0.97 (0.94–1.02)	0.93 (0.90–0.97)	1.01 (0.98–1.04)	0.97 (0.92–1.03)	0.98 (0.95–1.00)	0.95 (0.92–0.98)
≥2 h/d	0.98 (0.94–1.02)	0.99 (0.96–1.03)	1.03 (1.01–1.05)	1.05 (1.02–1.08)	1.02 (1.00–1.03)	1.00 (0.98–1.03)
Multiplicative interaction	0.98 (0.93–1.04)	0.93 (0.88–0.98)	0.98 (0.95–1.01)	0.93 (0.87–0.99)	0.96 (0.93–0.99)	0.94 (0.91–0.98)
Girls						
Watching videos						
<2 h/d	0.94 (0.89–0.99)	0.93 (0.89–0.97)	0.99 (0.94–1.03)	1.00 (0.94–1.06)	0.96 (0.92–0.99)	0.94 (0.90–0.98)
≥2 h/d	0.98 (0.96–0.99)	0.99 (0.98–1.00)	1.02 (1.01–1.03)	0.99 (0.98–1.01)	1.00 (0.99–1.01)	0.99 (0.96–1.00)
Multiplicative interaction	0.96 (0.91–1.02)	0.95 (0.91–0.99)	0.98 (0.94–1.02)	1.01 (0.95–1.07)	0.96 (0.93–1.00)	0.95 (0.91–0.99)
Playing videogame						
<2 h/d	0.97 (0.96–0.99)	0.98 (0.97–0.99)	1.02 (1.01–1.03)	0.99 (0.98–1.01)	0.99 (0.99–1.00)	0.98 (0.97–0.99)
≥2 h/d	0.97 (0.92–1.02)	0.98 (0.95–1.01)	1.00 (0.96–1.05)	1.01 (0.94–1.08)	0.99 (0.97–1.01)	0.95 (0.92–0.99)
Multiplicative interaction	1.00 (0.95–1.05)	1.00 (0.97–1.04)	1.01 (0.97–1.06)	0.97 (0.91–1.04)	1.00 (0.98–1.03)	1.03 (0.99–1.07)

Abbreviations: IRR, incidence rate ratios; MVPA, moderate to vigorous physical activity. Note: Adjusted for maternal education, ethnicity, maternal psychological distress, age, season of accelerometer use (for MVPA analysis), accelerometer wear time (for MVPA analysis), and strength and difficulties questionnaire (total difficulties) at 14 years. *P* values <.05 are marked in bold.

problems among girls at 17 years. Additionally, there was an interaction between watching videos and device-based MVPA at 14 years, amplifying the association of MVPA with total difficulties and emotional problems at 17 years for boys and girls spending less time on watching videos, respectively.

Our findings on the impact of device-based MVPA and screen-based behaviors on internalizing and externalizing problems are consistent with existing literature. Another longitudinal research^{4,39,40} reported higher incidences of internalizing and externalizing problems among adolescents who had lower PA but spent more time on computers and videogames during their childhood. The positive impact of PA on mental health among adolescents is widely acknowledged^{41,42}; therefore, it is not surprising that engaging in higher device-based MVPA was beneficial for reducing emotional problems for both sexes in this study. It is important to note that, in our study, adolescents on average scored below the clinical cut-offs for all internalizing and externalizing subscales, as well as total difficulties. Therefore, our findings may be more reflective of subclinical variations in psychological difficulties rather than clinically diagnosed conditions. Previous studies linked low level of PA but high screen-based sedentary behaviors to increased psychosocial difficulties,⁴³ and the impact of high device-based MVPA on peer problems was particularly evident among girls in this study. PA not only provides social opportunities for establishing peer relationships and collaboration,⁴⁴ previous evidence also suggests a positive effect of PA on prosocial behaviors⁴⁵ and social competences.⁴⁶ Although adolescent girls engage in lower PA than boys in general,⁴⁷ which we also confirmed in this study, they benefit more from social aspects of PA.⁴⁸ This may therefore explain our finding that engaging in regular

device-based MVPA had a more pronounced impact on peer problems for girls than boys.

In this study, spending more time playing videogames was associated with all internalizing and externalizing problems for girls. Evidence suggests a higher vulnerability for internalizing problems in adolescent girls engaging in screen-based sedentary behaviors than boys,²⁴ and girls tend to spend more time on social media, general computer use, and watching TV rather than videogaming.⁴⁹ It has been suggested previously that online environment could be more hostile for girls than boys,⁵⁰ negative contents from videogames, for example, violence and sexual themes therefore may had a greater impact on girls who engaged in more frequent gaming than boys.

Different types of TV programs, or films, and videogames may affect the risk of internalizing and externalizing problems in adolescents. Certain forms could be more detrimental and exhibit different relationships with internalizing and externalizing symptoms, respectively. For example, violent TV programs and videogames may include stress- and anxiety-provoking content⁵¹ therefore have a more negative impact on one's emotional well-being⁵² and contribute to aggression and behaviors such as self-harm.⁵³ On the other hand, more recreational screen-based behaviors with a socially interactive format, for example multiplayer games, could instead promote mood and encourage social participation and therefore bring social health benefits.⁵⁴ Preferred types of screen-based behaviors between boys and girls may also play a part in the varying association between screen-based behaviors and internalizing and externalizing problems. Compared with boys, young girls may prefer unhealthy screen-based behaviors characterized by components of screen entertainment and social interactions, for example, watching TV,

texting, social media use,^{55,56} rather than videogame playing. This may further explain why playing videogames was significantly associated with all internalizing and externalizing symptoms among girls who spent a large amount of time on videogames, and this trend was not observed among boys. Future studies may want to further explore potential gender differences in the relationship of various screen-based behaviors forms with distinct contents (eg, violent vs casual) and internalizing and externalizing problems, which may further help identify the unique vulnerabilities of young boys and girls who engage in regular screen-based behaviors.

Previous studies support a relationship between lower PA, greater engagement in screen-based behaviors and higher incidence of internalizing and externalizing problems.³⁹ The current study extends beyond current understanding and discovers a protective effect of device-based MVPA on a range of internalizing and externalizing symptoms at 17-year-old boys and girls, especially among those engaged in less video watching and videogame playing at 14 years, suggesting that the association of regular device-based MVPA engagement with mental health may be amplified by screen-based behaviors. Previous meta-analysis²⁴ illustrates that PA may impact the magnitude of the associations between screen-based behaviors and internalizing symptoms, particularly depression, although the evidence was inconsistent. Our study may otherwise suggest a moderating role played by the amount of time adolescents engage in screen-based behaviors. Replacing screen-based behaviors with adequate MVPA, for example aerobic training like running and muscle strengthening training, could have a positive impact on children and adolescents' mental health,⁴¹ but our results suggest that simply encouraging adolescents who engage a significant number of screen-based behaviors to participate MVPA may not be sufficient. Children and adolescents tend to prefer screen-based behaviors, for example TV viewing, even when a wide range of PA are available.⁵⁷ A more targeted approach to screen-based behaviors, such as interventions involving family, and behavioral intervention could therefore be first implemented before encouraging MVPA participation.^{58,59}

Our findings suggest a potential path of additive interaction, where the benefits of increased PA combine with those of reduced screen-based behaviors time to prevent/reduce internalizing and externalizing symptoms. Both factors may share mechanisms, as higher PA and reduced sedentary behavior are associated with lower inflammation levels.⁶⁰ Both excessive screen exposure and low PA are also linked to poorer sleep quality.^{61,62} Additionally, lower PA and higher sedentary behavior might reduce opportunities for social interactions, increasing feelings of isolation.^{63,64}

The current study demonstrated benefits from including a large nationally representative sample in the United Kingdom and controlling for a wide range of confounding factors. Its longitudinal nature allowed us to investigate the direction of the relationship from screen-based behaviors and device-based MVPA to internalizing and externalizing symptoms. Previous studies indicate a bidirectional relationship between screen-based behaviors, depression, and anxiety over time among adolescents⁶⁵; therefore, we also speculate a reciprocal relationship between these factors. High internalizing and externalizing symptoms may facilitate a higher level of screen-based behaviors and concurrently lower PA level, which may lead to further exacerbation of both symptoms among adolescents. The findings should be interpreted with the consideration of its limitations. First, the majority of our sample were White therefore limiting the generalizability of our findings to children and adolescents with an ethnic minority background. Second, psychological distress was not assessed at the 14-year wave. Although we

adjusted our analysis for the SDQ, which may indicate emotional and behavioral disturbances, residual confounding may still exist in the analysis. Third, screen-based behaviors were measured using self-reported questionnaires, hence could introduce recall and reporting bias. Given the current study only investigated 2 types of screen-based behaviors, the impacts of other types (eg, social media use and website browsing) and overall screen-based behaviors on MVPA, internalizing and externalizing symptoms warrant further investigation. In particular future research should consider not only the duration of other screen-based behaviors, but also the ways in which they are used, including the type of content engaged with. Despite that this study utilized a device-based indicator for PA, the accelerometer wear-time was only 2 days and a minimal 4 days of valid data were recommended by a previous systematic review to ensure data reliability.⁶⁶ Additionally, specific types of MVPA were not explored in detail. The interplay between MVPA types, gender, and internalizing and externalizing symptoms could be complex, with differential relationship between MVPA types and internalizing and externalizing problems being moderated by gender. For example, previous literature suggests a lower risk of internalizing problems among boys who engaged in PA that was facilitated by a coach, on the other hand, this was only observed among girls who participated PA without a coach.³⁹ This further suggests a need to tailor available MVPA programs to meet specific needs of adolescents.

This study provides evidence supporting a protective effect of device-based MVPA participation on preventing internalizing and externalizing problems for adolescents who spend less time on screen-based behaviors. This finding highlights the importance of implementing interventions targeting screen-based behaviors reduction as first-line priority in order to maximize the effectiveness of MVPA in modifying mental health and behavioral problems at a later stage.

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