



Examining sociodemographic and health-related characteristics as moderators of an mHealth intervention on physical activity outcomes in young adult cancer survivors

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Abstract

Purpose This study explored whether sociodemographic and health-related characteristics moderated mHealth PA intervention effects on total and moderate-to-vigorous physical activity (MVPA) at 6 months, relative to a self-help condition among young adult cancer survivors (YACS).

Methods We conducted exploratory secondary analyses of data from a randomized controlled trial among 280 YACS. All participants received digital tools; intervention participants also received lessons, adaptive goals, tailored feedback, text messages, and Facebook prompts. Potential moderators were assessed in baseline questionnaires. PA was measured at baseline and 6 months with accelerometers. Linear model repeated measures analyses examined within- and between-group PA changes stratified by levels of potential moderator variables.

Results Over 6 months, the intervention produced MVPA increases that were ≥ 30 min/week compared with the self-help among participants who were males (28.1 vs. -7.7, $p = .0243$), identified with racial/ethnic minority groups (35.2 vs. -8.0, $p = .0006$), had baseline BMI of 25–30 (25.4 vs. -7.2, $p = .0034$), or stage III/IV cancer diagnosis (26.0 vs. -6.8, $p = .0041$). Intervention participants who were ages 26–35, college graduates, married/living with a partner, had a solid tumor, or no baseline comorbidities had modest MVPA increases over 6 months compared to the self-help ($ps = .0163$ – $.0492$). Baseline characteristics did not moderate intervention effects on total PA.

Conclusions The mHealth intervention was more effective than a self-help group at improving MVPA among subgroups of YACS defined by characteristics (sex, race, BMI, cancer stage) that may be useful for tailoring PA interventions.

Implications for cancer survivors These potential moderators can guide future optimization of PA interventions for YACS.

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Keywords Young adults · Cancer survivors · Physical activity · Digital health · mHealth · Interventions · Moderators

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Introduction

Nearly 84,000 young adults, ages 18–39, are diagnosed with cancer in the US annually [1, 2], and there is high demand for physical activity (PA) interventions among young adult cancer survivors (YACS) [3, 4]. Given the benefits of regular PA for cancer survivors, including improved fitness and health-related quality of life (HRQOL) [5], it is critical to address these needs among YACS who may face several decades at risk for long-term and late effects of cancer [6]. Yet few PA interventions have been designed for and evaluated among YACS [4, 7]. Most have been short-term pilot studies among small samples and demonstrated mixed

effects [8–13], and there is limited evidence to inform the development and optimization of PA interventions that are tailored to YACS' unique contexts and preferences [7]. There is a need to identify moderators of PA intervention effects, which can guide intervention tailoring for YACS [13] and expand our understanding of subgroups of YACS for whom, and under what conditions, various intervention approaches may be effective.

Previous studies examining moderators of exercise training effects among cancer survivors have focused on HRQOL [14–19] and exercise training outcomes (e.g., aerobic fitness, body composition) [16–18, 20, 21], older populations [14], and patients in treatment [16, 17, 22]. Most of these studies evaluated supervised exercise interventions and have yielded inconsistent findings. Variables previously identified as moderators of exercise intervention effects on HRQOL have included age [16, 17, 20, 23], ethnicity [19], marital status [14, 16, 17], time since diagnosis [14, 24], and history of chemotherapy [23]. To date, limited research has explored moderators of PA interventions among cancer survivors [24–26], and little is known about sociodemographic and health-related characteristics of YACS that may moderate response to PA behavior change interventions [4].

Technology has enabled delivery of theory-based mHealth PA interventions, which are responsive to YACS' preferences and enhance potential for scalability. Few studies have examined moderators of theory-based PA interventions aimed at promoting behavior change and adherence to PA among cancer survivors [23, 24, 27–30]. These studies primarily have focused on breast cancer survivors and have reported age [23, 28], marital status [24, 27, 28], time since diagnosis [24, 27], cancer stage [27, 28], cancer treatments [23, 24, 27], and psychosocial factors [28–30] as moderators of interventions effects on PA behaviors [24, 28–30] and HRQOL outcomes [23, 24, 27]. Interventions have demonstrated greater benefits on moderate-to-vigorous PA (MVPA) among breast cancer survivors who were older [28], married [24, 28], further from diagnosis [24], and had a lower cancer stage [28]. Overall, there is limited evidence regarding moderators of digital PA intervention effects in cancer survivors, and these have yet to be examined among YACS.

We previously reported that both a theory-based mHealth PA intervention and self-help group improved accelerometer-measured MVPA over 6 months in a nationwide sample of YACS [31]. Although findings indicated no between-group differences in total PA changes at 6 months (primary outcome), intervention participants increased MVPA by twice as much as self-help participants (24.7 vs. 11.4 min/week), and baseline MVPA was a moderator of intervention effects, such that intervention effects on MVPA were more pronounced among those starting with low levels of MVPA

(i.e., 1–30 min/week) [31]. As we were interested in identifying other potential moderators of intervention effects, the purpose of this study was to explore whether intervention effects on post-intervention outcomes over 6 months (total and MVPA) differed across sociodemographic (e.g., age, sex, race) and health-related variables (e.g., cancer treatment, time since diagnosis). To our knowledge, this is the first study to explore moderators of PA intervention effects among YACS. Given the exploratory aim of the current study, we examined sociodemographic and health-related variables based on previous research indicating that they moderated intervention effects on adherence to PA behaviors [24, 28].

Methods

Study design

We conducted a secondary exploratory analysis using data from the IMPROVING Physical Activity after Cancer Treatment (IMPACT) trial, a 12-month randomized controlled trial of an mHealth PA intervention among YACS. Details on the study protocol and interventions have been published [31–33]. The primary aim of the intervention was to increase accelerometer-measured total PA minutes/week at 6 months, and a secondary aim was to increase MVPA. Comparisons of study groups on total PA and MVPA at 6 and 12 months were previously reported [31, 33]. The current study explored whether baseline characteristics moderated intervention effects on accelerometer-measured total PA and MVPA at 6 months (primary timepoint post-intervention) relative to the self-help condition.

Participants and procedures

A total of 280 YACS were recruited from around the US. Baseline characteristics of the sample and details on recruitment approaches were previously reported [31, 32, 34]. All participants were YACS, ages 18–39, diagnosed with cancer ≤ 10 years, post-treatment, and engaging in less than recommended levels of PA for cancer survivors (i.e., < 150 min/week of MVPA; measured by accelerometer). All participants provided informed consent via an online questionnaire. Following completion of baseline assessments of sociodemographic, health-related and PA measures, participants were randomized to either an intervention or self-help condition. Participants completed additional PA assessments at 6 months. All study procedures were reviewed and approved by the Oncology Protocol Review Committee and Institutional Review Board of the University of North Carolina at Chapel Hill.

Study interventions are detailed elsewhere [31, 32]. Briefly, all participants received digital tools (i.e., activity tracker (Fitbit, San Francisco, CA), smart scale (BodyTrace, New York, NY)), an individual videochat session, and access to arm-specific closed Facebook group. Additionally, over the study period, intervention group participants had access to a mobile website with weekly activity goals that adapted to individuals' recent PA behaviors, behavioral lessons (weekly in months 1–3, biweekly in months 4–6, bimonthly in months 7–12), tailored feedback (weekly in months 1–6, bimonthly in months 7–12), and publicly available web resources. Intervention participants also received text messages (5 per week in months 1–6, 1 per week in months 7–12) and prompts to engage within the arm-specific Facebook group (≤ 5 per week).

Measures

Minutes/week of total and MVPA were assessed at baseline and 6 months with accelerometers (ActiGraph GT3X+, Pensacola, FL) as described previously [31, 32]. YACS were asked to wear accelerometers continuously for 7 days; wear was valid if the participant had ≥ 4 days with ≥ 10 h of wear and at least one weekend day [35]. Accelerometer-measured minute-level total (light, moderate, or vigorous intensity) and MVPA data were used to derive ≥ 10 -minute bouts using a standard algorithm [36, 37], and total and MVPA minutes/week were calculated [(5*weekday average) + (2* weekend day average)]. We used bouts as pre-specified in our study protocol [32], which was established prior to PA guidelines that removed the 10-minute bout requirement [38]. Data on sociodemographic and health-related variables were collected during screening or in baseline questionnaires.

Moderators

Sociodemographic variables collected through online screening questionnaires included date of birth (used to calculate baseline age: 18–25, 26–35, 36–<40), sex, race, ethnicity, and residence (rural/urban). Participant zip codes were used to classify urbanization level of residence using 2013 Rural-Urban Continuum Codes (RUCC; 1–3 rural, 4–9 urban). Marital status (married/living with partner vs. other), educational attainment (\leq some college vs. \geq college graduate), and number of children living in their home (≥ 1 vs. 0) were collected in online baseline questionnaires.

Health-related variables. Single-item questions during telephone screening asked about time first diagnosed with cancer, cancer type, and cancer stage. Data on cancer treatments and time since end of treatments were collected in the baseline questionnaire (“Have you ever received any of the following treatments for your cancer?” chemotherapy,

radiation, surgery, bone marrow transplant/stem cell transplant, other; “When did you finish treatment for your cancer?”). Treatment variables were dichotomized (yes vs. no). Number of comorbid conditions were derived from baseline questions about health conditions (e.g., high blood pressure, diabetes, depression, thyroid disorder) and dichotomized as (0 vs. ≥ 1). Self-reported height and objective weight at baseline were collected through a single-item question and smart scales (Body Trace, New York, NY; average of 3 weights), respectively, and used to derive body mass index (kg/m^2) categories (underweight/normal: < 25 ; overweight: 25 – < 30 ; obesity: ≥ 30). HRQOL was assessed at baseline with the Medical Outcomes Study 36-Item Short Form (SF-36) [39, 40], which includes 36 items with 8 subscales (physical functioning, role limitations-physical, role limitations-emotional, social functioning, pain, mental health, vitality, general health). Subscale components were calculated, transformed to scores from 0 to 100 (higher scores indicate more positive outcomes), and summed to derive Physical Component Summary (PCS) and Mental Component Summary (MCS) scores. Subscale and component summary scores were dichotomized (< 50 vs. ≥ 50). The SF-36 has been used with YACS [8, 41] and demonstrated reliability and validity among cancer survivors ($\alpha > 0.70$ for subscales) [40].

Statistical analyses

Descriptive statistics were used to summarize baseline participant characteristics. To examine whether any of these characteristics moderated the effects of the intervention relative to the self-help group, we stratified the analyses by levels of the potential moderators. Within each level of the potential moderator, we conducted repeated measures analyses using generalized estimating equation (GEE) analyses to compare the effects of the intervention and self-help groups on total PA and MVPA outcomes. Each model included the time effect, the intervention effect, and the interaction between the time and intervention effect; outcomes were adjusted for accelerometer wear time. For participants within each level of the moderator, we estimated PA changes over time from baseline to 6 months within groups, as well as differences between groups, in changes over time from baseline to 6 months. We chose to stratify the levels of the moderators instead of fitting models with three-way interactions to improve the interpretability of the results. In the results, we focus on reporting the quantity of these estimates and between-group differences in changes over time that were clinically meaningful at ≥ 30 min/week [42, 43], because analyses were exploratory, and this study was not powered *a priori* to detect group-time interaction effects within subgroups.

Results

Two-hundred eighty participants were randomized to the intervention ($n=140$) or self-help ($n=140$) group from August 2018–October 2019 [31, 32, 34]. The CONSORT diagram was presented previously [31]. At baseline, participants were aged 33.4 (SD=4.8) years and had been diagnosed 3.7 (SD=2.4) years prior to enrollment. Most participants reported being females (82%), non-Hispanic White (77%), college graduates (71%), and married/living with a partner (62%). Nearly half reported a stage I/II cancer diagnosis (49%) and having ≥ 1 comorbid conditions (39%). Participants reported history of cancer treatments as follows: chemotherapy (61%), radiation therapy (46%), and surgery (86%). Since most participants resided in urban locations (89%), had a history of surgery (86%), and endorsed more favorable health states on most SF-36 subscales (i.e., ≥ 50 ; 95% physical functioning, 93% social functioning, 85% mental health, 83% pain), we exclude results related to these potential moderator variables due to inadequate sample sizes for each moderator subgroup.

No variables moderated intervention effects on total PA (Supplementary Table). Moderators of intervention effects on MVPA are presented in Table 1. Figure 1 displays estimated change in MVPA minutes/week over 6 months for each group separately by potential moderator variables. Intervention effects on MVPA were more favorable compared with the self-help group, with between-group differences ≥ 30 min/week, among males (intervention: +28.1 vs. self-help: -7.7; mean difference (95% CI): +35.8 (4.7, 67.0); $p=.0243$), participants who identified as American Indian/Alaska Native, Black, Asian, Hispanic or of mixed race/ethnicity (+35.2 vs. -8.0; mean difference (95% CI): +43.7 (16.5, 71.0); $p=.0006$), and participants with baseline BMI of 25–30 (+25.4 vs. -7.2; mean difference (95% CI): +32.7 (10.8, 54.5); $p=.0034$). Intervention effects on MVPA minutes/week were also more favorable, with smaller between-group differences compared with the self-help, among participants who were ages 26–35 (+26.7 vs. +7.8; mean difference (95% CI): +18.9 (3.1, 34.7); $p=.0193$), college graduates (+29.3 vs. +12.2; mean difference (95% CI): +17.0 (0.1, 34.0); $p=.0492$), or married/living with a partner (+30.4 vs. +8.7; mean difference (95% CI): +21.7 (4.0, 39.4); $p=.0163$).

When considering baseline health-related characteristics, the intervention had more favorable effects on MVPA minutes/week, compared with the self-help group, among participants diagnosed with stage III/IV cancer (+26.0 vs. -6.8; mean difference (95% CI): +32.9 (10.4, 55.3); $p=.0041$). Additionally, the intervention appeared more effective than the self-help group, though with smaller between-group differences, among participants with a solid tumor type

(+21.6 vs. +4.3; mean difference (95% CI): +17.2 (2.1, 32.4); $p=.0254$) and participants with no baseline comorbid conditions (+33.5 vs. +13.5; mean difference (95% CI): +20.0 (1.0, 39.1); $p=.0395$). When exploring effects by HRQOL variables, the intervention had greater effects on MVPA, compared with self-help, for participants reporting higher baseline scores on role limitations-physical (+29.6 vs. +11.5; mean difference (95% CI): +18.1 (1.3, 34.9); $p=.0346$). There were within-group MVPA increases in the intervention group, but not the self-help, in both categories of MCS and PCS (i.e., < 50 , ≥ 50) (between-group $p=.1022$ –.4433). Having a child at home, years since diagnosis, time since end of treatment, history of chemotherapy, history of radiation, and SF-36 subscales (role limitations-emotional, vitality, general health) were not moderators of intervention effects on MVPA over 6 months.

Discussion

This study is one of the first to explore baseline sociodemographic and health-related characteristics as moderators of mHealth intervention effects on PA outcomes in YACS, providing evidence to enhance tailoring and optimization of future PA interventions for YACS. While baseline characteristics did not moderate intervention effects on total PA, the intervention produced differential effects on MVPA over 6 months relative to the self-help condition among specific subgroups. Among YACS who were males, identified as having an underrepresented racial/ethnic background, had a BMI of 25–30, or stage III/IV cancer at baseline, the intervention was more favorable for promoting clinically meaningful MVPA increases relative to the self-help condition. Additionally, those who were ages 26–35, college graduates, married/partnered, reported having a solid tumor, or no comorbid conditions at baseline achieved more MVPA when receiving the intervention compared with self-help. Overall, these findings indicate potential subgroups of YACS who may benefit from receiving digital tools alone, and others that may require more support from a comprehensive theory-based mHealth PA intervention integrating digital tools to achieve meaningful health benefits.

Few studies have reported on the effects of mHealth PA interventions among YACS. To our knowledge, one study has explored heterogeneity in PA intervention effects on outcomes by baseline PA levels among YACS. Belanger and colleagues [8] reported differential effects of targeted print materials among YACS self-reporting ≤ 300 PA minutes/week at baseline; YACS who received print materials reported significantly more PA minutes/week at 3 months (+90) compared with a control group that only received national PA guidelines. There are no studies of mHealth

Table 1 Changes in moderate-to-vigorous physical activity within and between self-help and intervention groups stratified by potential moderators in the IMPACT trial

Moderator	N ^a	Self-help				Intervention				Between-group difference	
		Baseline mean (SD) ^b	6 months mean (SD) ^b	Mean change (95% CI) ^c	P-value	Baseline mean (SD) ^b	6 months mean (SD) ^b	Mean change (95% CI) ^c	P-value	Mean change (95% CI) ^c	P-value
<i>Age</i>											
18 to 25 years	26	24.1 (29.0)	44.4 (72.3)	20.7 (-14.3, 55.7)	0.2461	15.9 (11.8)	27.3 (32.0)	9.8 (-13.7, 33.4)	0.4127	-10.9 (-54.2, 32.4)	0.6228
26 to 35 years	157	29.7 (35.6)	37.6 (45.4)	7.8 (-2.0, 17.6)	0.1196	28.8 (34.9)	55.1 (62.9)	26.7 (13.8, 39.5)	<0.0001	18.9 (3.1, 34.7)	0.0193
36 to <40 years	97	25.2 (35.0)	40.6 (67.9)	14.7 (-7.3, 36.6)	0.1902	19.4 (25.4)	43.2 (57.3)	23.7 (6.5, 40.8)	0.0068	9.0 (-18.8, 36.9)	0.5262
<i>Sex</i>											
Female	229	29.7 (35.5)	45.8 (60.7)	15.6 (3.9, 27.2)	0.0088	26.9 (32.4)	51.1 (56.8)	24.4 (13.9, 34.8)	<0.0001	8.8 (-6.9, 24.5)	0.2705
Male	51	16.7 (26.9)	10.1 (18.1)	-7.7 (-21.1, 5.7)	0.2602	15.8 (24.1)	43.1 (71.0)	28.1 (1.5, 54.7)	0.0381	35.8 (4.7, 67.0)	0.0243
<i>Race and ethnicity</i>											
BIPOC	64	23.3 (34.1)	16.1 (23.7)	-8.0 (-18.7, 2.8)	0.1477	26.9 (33.8)	62.0 (75.6)	35.2 (14.4, 55.9)	0.0009	43.7 (16.5, 71.0)	0.0006
Non-Hispanic White	215	28.5 (34.6)	45.4 (61.5)	16.4 (4.4, 28.5)	0.0075	24.3 (30.5)	44.7 (52.9)	20.6 (9.5, 31.8)	0.0003	4.2 (-12.2, 20.6)	0.6160
<i>Education</i>											
≤Some college	80	21.5 (27.8)	31.1 (51.6)	9.4 (-7.7, 26.6)	0.2806	24.1 (31.8)	34.8 (44.3)	10.3 (-5.3, 26.0)	0.1957	0.9 (-22.6, 24.4)	0.9404
≥College graduate	200	29.9 (36.7)	42.8 (59.1)	12.2 (0.1, 24.3)	0.0485	25.0 (31.2)	54.6 (63.9)	29.3 (17.4, 41.1)	<0.0001	17.0 (0.1, 34.0)	0.0492
<i>Marital status</i>											
Not partnered	107	21.3 (26.3)	37.6 (58.7)	15.3 (-1.7, 32.3)	0.0773	22.3 (28.8)	37.2 (53.8)	15.3 (-0.7, 31.2)	0.0603	-0.3 (-24.5, 24.5)	0.9981
Partnered	173	31.4 (38.1)	40.8 (56.4)	8.7 (-3.7, 21.1)	0.1690	26.2 (32.6)	56.3 (62.4)	30.4 (17.6, 43.2)	<0.0001	21.7 (4.0, 39.4)	0.0163
<i>≥1 child at home</i>											
No	148	23.3 (29.2)	39.2 (57.4)	14.9 (1.8, 28.1)	0.0264	20.8 (29.7)	46.4 (61.0)	24.7 (10.6, 38.8)	0.0006	9.7 (-9.7, 29.2)	0.3270
Yes	132	33.2 (40.2)	39.9 (57.3)	5.9 (-8.9, 20.7)	0.4342	28.2 (32.3)	52.5 (59.1)	24.3 (710.5, 38.0)	0.0005	18.4 (-1.9, 38.7)	0.0758
<i>Body mass index</i>											
<25 kg/m ²	91	31.9 (42.5)	59.5 (79.1)	27.1 (3.4, 50.9)	0.0250	25.1 (34.4)	60.3 (60.7)	34.6 (17.6, 51.7)	<0.0001	7.5 (-21.3, 36.3)	0.6103
25–<30 kg/m ²	80	33.7 (36.3)	27.6 (32.9)	-7.2 (-20.7, 6.2)	0.2901	25.1 (30.5)	50.0 (58.6)	25.4 (8.2, 42.7)	0.0039	32.7 (10.8, 54.5)	0.0034
≥30 kg/m ²	108	20.2 (24.2)	31.0 (43.4)	10.1 (-1.0, 21.1)	0.0740	23.9 (29.6)	39.1 (60.8)	15.7 (-2.1, 33.6)	0.0838	5.7 (-15.8, 27.1)	0.6053
<i>Years since diagnosis</i>											
<2 years	87	27.2 (34.5)	50.6 (62.8)	23.2 (4.7, 41.7)	0.0142	36.4 (38.3)	67.9 (67.7)	32.4 (12.5, 52.3)	0.0014	9.3 (-18.1, 36.6)	0.5066
2–4 years	81	25.0 (33.2)	29.5 (41.3)	2.3 (-9.1, 13.7)	0.6923	21.0 (27.6)	36.6 (45.1)	15.4 (0.6, 30.2)	0.0419	13.1 (-5.7, 31.8)	0.1710
>4 years	112	29.8 (35.9)	36.2 (60.9)	6.9 (-11.0, 24.8)	0.4509	20.1 (27.0)	44.9 (60.4)	24.8 (9.2, 40.3)	0.0018	17.9 (-5.4, 41.1)	0.1317
<i>Years since end of treatment</i>											
<2 years	134	25.0 (35.0)	41.1 (57.6)	15.8 (1.8, 29.7)	0.0269	29.8 (34.5)	56.6 (62.4)	27.6 (12.8, 42.4)	0.0003	11.9 (-8.5, 32.2)	0.2538
≥2 years	142	28.3 (33.7)	37.7 (57.5)	8.4 (-6.2, 23.1)	0.2576	20.8 (27.7)	41.9 (56.8)	20.7 (7.8, 33.7)	0.0017	12.3 (-7.5, 32.1)	0.2229
<i>Cancer stage</i>											
Stage I or II	137	28.7 (35.6)	49.1 (65.0)	19.9 (4.0, 35.8)	0.0142	25.5 (31.9)	47.3 (55.8)	22.5 (9.8, 35.1)	0.0005	2.6 (-17.6, 22.7)	0.8033
Stage III or IV	75	28.9 (35.7)	22.0 (31.9)	-6.8 (-20.3, 6.7)	0.3329	27.5 (33.2)	52.4 (48.2)	26.0 (8.0, 44.0)	0.0046	32.9 (10.4, 55.3)	0.0041
Other	62	24.2 (31.8)	34.2 (47.8)	7.6 (-7.7, 22.9)	0.3278	18.6 (25.5)	48.9 (83.5)	29.2 (-0.3, 58.8)	0.0524	21.6 (-15.8, 59.1)	0.2580
<i>Tumor type</i>											
Not solid	66	15.8 (17.4)	50.3 (64.4)	34.8 (11.0, 58.5)	0.0042	19.5 (25.0)	55.6 (66.4)	36.1 (14.1, 58.0)	0.0031	1.3 (-30.7, 33.4)	0.9351
Solid	214	31.1 (37.6)	36.2 (54.7)	4.3 (-6.0, 14.7)	0.4121	26.3 (32.8)	47.6 (58.1)	21.6 (10.6, 32.5)	0.0001	17.2 (2.1, 32.4)	0.0254

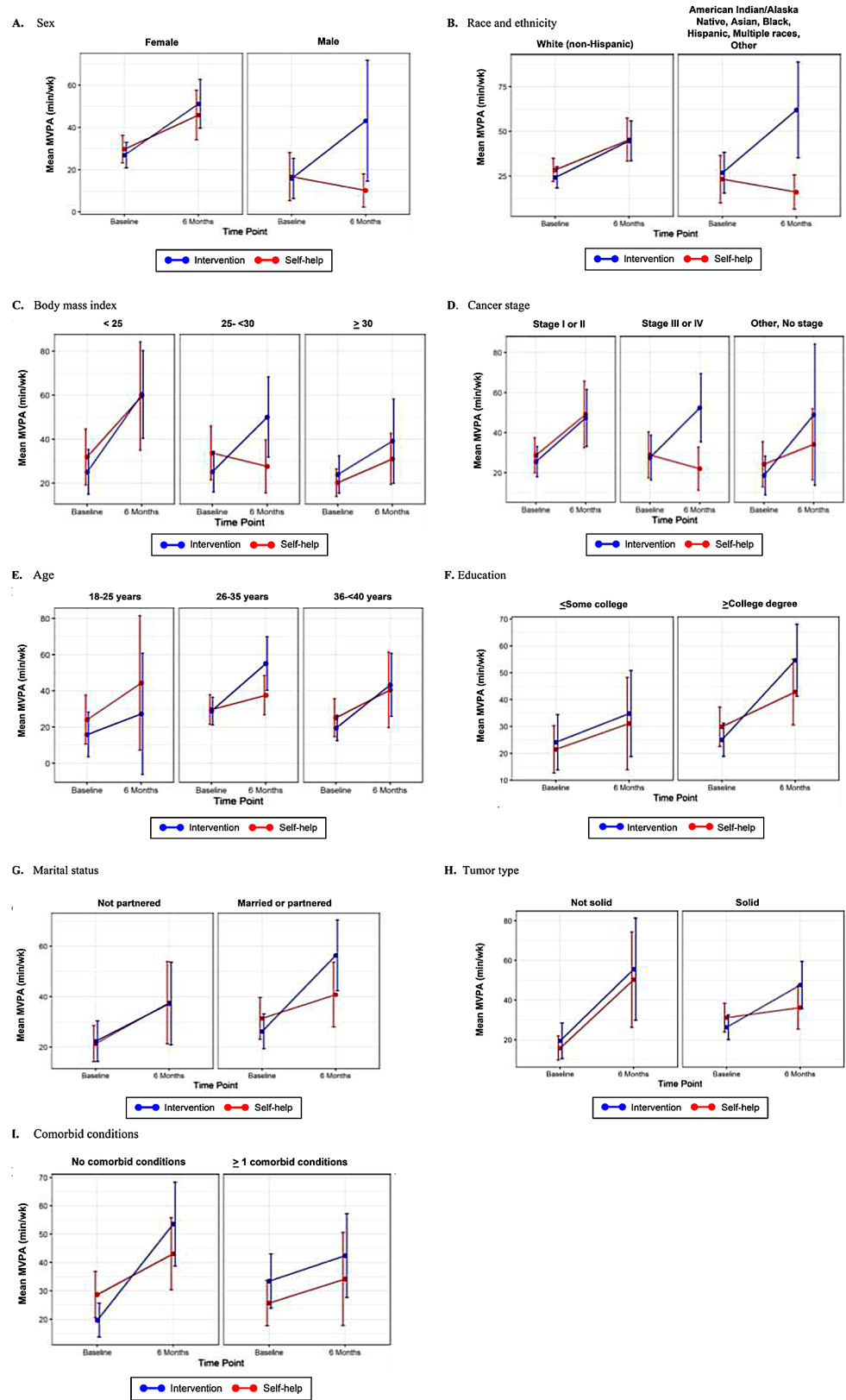
Table 1 (continued)

Moderator	N ^a	Self-help			Intervention			Between-group difference			
		Baseline mean (SD) ^b	6 months mean (SD) ^b	Mean change (95% CI) ^c	P-value	Baseline mean (SD) ^b	6 months mean (SD) ^b	Mean change (95% CI) ^c	P-value	Mean change (95% CI) ^c	P-value
<i>Chemotherapy</i>											
No	107	26.9 (37.4)	39.7 (67.6)	12.6 (-4.3, 29.4)	0.1449	25.3 (33.1)	48.8 (57.3)	23.7 (6.6, 40.8)	0.0065	11.1 (-12.9, 35.2)	0.3628
Yes	172	28.1 (32.7)	39.8 (49.7)	11.3 (-1.0, 23.6)	0.0727	24.4 (30.2)	49.8 (61.7)	25.7 (13.5, 37.9)	<0.0001	14.4 (-2.9, 31.8)	0.1023
<i>Radiation</i>											
No	151	29.1 (33.5)	39.4 (60.4)	9.4 (-5.6, 24.4)	0.2207	25.3 (31.3)	48.5 (61.8)	23.4 (8.8, 38.0)	0.0017	14.0 (-7.1, 35.1)	0.1935
Yes	128	25.7 (35.6)	39.5 (54.3)	13.6 (0.5, 26.8)	0.0426	24.4 (31.4)	51.4 (58.2)	27.3 (15.0, 39.5)	<0.0001	13.6 (-4.3, 31.6)	0.1371
<i>Comorbid conditions</i>											
0	170	28.7 (37.1)	43.1 (56.0)	13.5 (-0.3, 27.2)	0.0546	19.6 (28.1)	53.5 (65.3)	33.5 (20.5, 46.5)	<0.0001	20.0 (1.0, 39.1)	0.0395
≥ 1	110	25.7 (30.5)	34.2 (58.9)	7.8 (-6.3, 21.8)	0.2781	33.4 (34.4)	42.4 (49.3)	9.9 (-4.1, 23.9)	0.1656	2.1 (-17.6, 21.9)	0.8328
<i>Role limitations-physical health</i>											
< 50	53	29.4 (33.9)	40.1 (38.9)	10.7 (-1.9, 23.2)	0.0952	29.5 (36.5)	28.7 (26.2)	2.0 (-11.9, 15.9)	0.7833	-8.7 (-27.4, 9.9)	0.3581
≥ 50	227	26.9 (34.7)	39.3 (61.1)	11.5 (-0.6, 23.7)	0.0633	23.7 (30.0)	53.5 (63.8)	29.6 (18.3, 40.9)	<0.0001	18.1 (1.3, 34.9)	0.0346
<i>Role limitations-emotional problems</i>											
< 50	86	26.5 (33.8)	30.1 (43.8)	2.02 (-8.8, 12.8)	0.7124	29.1 (35.5)	36.3 (39.0)	7.7 (-4.1, 19.5)	0.1999	5.7 (-10.3, 21.7)	0.4846
≥ 50	194	27.8 (34.9)	43.7 (62.0)	15.5 (1.9, 29.0)	0.0249	22.9 (29.2)	54.7 (65.9)	31.9 (19.1, 44.7)	<0.0001	16.4 (-2.3, 35.2)	0.0860
<i>Vitality</i>											
< 50	168	29.9 (34.3)	37.8 (49.8)	7.3 (-4.1, 18.6)	0.2095	27.3 (33.5)	44.9 (50.3)	17.5 (6.3, 28.7)	0.0022	10.2 (-5.7, 26.1)	0.2078
≥ 50	112	23.6 (34.6)	41.9 (67.0)	18.1 (-0.02, 36.2)	0.0503	21.0 (27.4)	55.1 (70.2)	34.3 (16.8, 51.7)	0.0001	16.2 (-9.5, 41.9)	0.2175
<i>General health</i>											
< 50	116	25.5 (33.5)	36.2 (48.1)	10.3 (-3.5, 24.0)	0.1438	22.1 (29.2)	36.5 (39.6)	15.4 (5.6, 25.2)	0.0021	5.1 (-11.8, 22.0)	0.5518
≥ 50	164	28.9 (35.2)	42.0 (63.4)	12.4 (-1.7, 26.5)	0.0851	26.6 (32.5)	57.8 (69.0)	31.0 (16.0, 46.1)	<0.0001	18.6 (-2.2, 39.4)	0.0789
<i>MCS</i>											
< 50	171	30.3 (35.3)	39.2 (51.6)	8.2 (-3.2, 19.6)	0.1573	26.3 (32.5)	45.9 (52.3)	19.7 (7.9, 31.4)	0.0010	11.5 (-4.9, 27.8)	0.1697
≥ 50	109	23.0 (32.9)	39.9 (65.0)	16.7 (-1.4, 34.8)	0.0707	22.2 (29.1)	54.7 (69.9)	32.6 (15.2, 50.0)	0.0002	15.9 (-9.7, 41.5)	0.2236
<i>PCS</i>											
< 50	128	26.0 (32.4)	34.8 (45.3)	8.2 (-3.6, 20.0)	0.1730	23.3 (30.3)	37.0 (46.2)	14.4 (3.6, 25.2)	0.0088	6.3 (-9.7, 22.2)	0.4433
≥ 50	152	28.9 (36.5)	44.1 (66.9)	13.4 (-2.8, 29.6)	0.1048	25.8 (32.0)	58.4 (66.9)	32.0 (17.4, 46.6)	<0.0001	18.5 (-3.7, 40.8)	0.1022

^aBaseline sample: *n* = 140 (self-help), *n* = 140 (intervention); 6-month sample: *n* = 129 (self-help), *n* = 122 (intervention)^bUnadjusted means^cAdjusted for accelerometer wear time

BIPOC: Black, Indigenous, and People of Color; includes American Indian/Alaska Native, Asian, Black or African American, White Hispanic, Multiple races, Other self-reported races (Asian Indian, Hispanic/Latino/Cape Verdean). MCS: Mental component score. PCS: Physical component score

Fig. 1 Changes in accelerometer-measured MVPA over 6 months by group stratified by moderators at baseline. Abbreviation: MVPA, moderate-to-vigorous physical activity. **A** Stratified by sex. **B** Stratified by race and ethnicity (White (non-Hispanic) vs. American Indian or Alaska Native, Asian, Black, Hispanic, Multiple races, Other). **C** Stratified by body mass index (<25 vs. 25-30 vs. ≥30). **D** Stratified by cancer stage (I/II vs. III/IV vs. other/no stage). **E** Stratified by baseline age groups (18–25 vs. 26–35 vs. 36–40). **F** Stratified by education (≤some college vs. ≥college degree). **G** Stratified by marital/partner status (not partnered vs. married or living with partner). **H** Stratified by cancer type (not solid vs. solid). **I** Stratified by comorbid conditions (0 vs. ≥1 or more)



PA interventions in YACS, nor studies with accelerometer-measured PA outcomes in YACS, to directly compare our results.

Our findings provide evidence that sex and racial/ethnic background may be moderators of MVPA outcomes in response to an mHealth behavior change intervention designed for YACS. In the current study, YACS who identified as female or non-Hispanic White increased MVPA in both conditions, while males and those identifying with underrepresented racial/ethnic groups increased MVPA if they received the intervention. Most studies of PA among adolescents and young adults (AYAs) with cancer have included samples of predominantly women, with limited power to detect intervention effects by subgroups [7]. Consistent with a large cross-sectional survey of a diverse sample of AYAs which showed that several PA preferences (e.g., sports participation, program delivery, exercise modalities) differed by sex [4], our results suggest that tailoring future PA interventions for YACS by sex could be beneficial. Dieli-Conwright and colleagues have shown Hispanic ethnicity to be a moderator of the effects of an aerobic and resistance training exercise intervention, such that Hispanic breast cancer survivors experienced greater benefits on several measures of metabolic syndrome, physical fitness, and HRQOL, compared with non-Hispanic breast cancer survivors [19, 21]. Given documented disparities in reported MVPA levels among AYA survivors by racial and ethnic groups [44], our findings show the potential for mHealth intervention strategies to promote MVPA among YACS identifying with racial or ethnic minority backgrounds.

Notably, the intervention increased MVPA relative to the self-help group among participants in the overweight range (i.e., BMI 25–<30), suggesting that the strategies used may have successfully addressed some PA barriers in this subgroup, but not among those with higher BMI. Participants with lower BMI demonstrated MVPA improvements in both conditions, while those with higher BMI did not increase MVPA regardless of condition and may have needed additional or alternate intervention enhancements and support. Baseline BMI has been shown to moderate adherence to prescribed exercise sessions among breast cancer survivors randomized to various supervised exercise regimens during chemotherapy [45], and to moderate the effects of exercise training on HRQOL among lymphoma patients [17]. Additionally, higher BMI has been associated with lower reported MVPA among AYAs [44], and both lower educational level and higher BMI have been identified as barriers to PA among adults with cancer [46, 47]. To our knowledge, other PA behavior change interventions among cancer survivors have not demonstrated moderation of MVPA outcomes by baseline BMI or educational attainment. Education level was not a moderator of accelerometer-measured MVPA in a

previous trial of a PA behavior change intervention among breast cancer survivors [24], whereas we found that YACS with a college degree or higher achieved more MVPA in response to the intervention compared with self-help participants. It has been established that lower education levels are associated with lower PA among cancer survivors [48–50], with limited evidence corroborating this relationship among AYAs [44, 51]. Taken together, as individuals with lower education levels, males, and individuals from racial/ethnic minority groups have been underrepresented in studies of PA behavior among YACS [7, 52] and in behavior change intervention trials in cancer survivors in general [53], mHealth strategies show potential to improve PA among these subgroups and future interventions should work to address the unique needs and preferences of these subgroups. Disparities in MVPA attainment among AYAs by educational attainment, race, and BMI point to the need for PA interventions focused on subgroups potentially at risk for lower MVPA (e.g., those with lower education levels, identify as Black, increased BMI) [44]. Future PA interventions should consider mHealth strategies that are specifically tailored to address disparities among these subgroups of YACS who could potentially derive greater benefits from MVPA and mHealth strategies. Strategies such as embedding theory-based components that leverage existing digital tools and connected health data to provide adaptive PA goals, personalized feedback, or text messages that are tailored to individuals' characteristics and behavioral contexts may be warranted.

Our study identified age and marital status as potential moderators. Although a greater intervention effect on MVPA among participants ages 26–35 was observed, most participants were in this age subgroup, thereby increasing statistical power to detect an effect. The sample included fewer emerging adults, ages 18–25; more research is needed to identify effective intervention strategies for YACS in this age range, as they are less commonly represented in behavioral intervention trials [54]. Previous studies have shown that age may moderate the effects of PA interventions among breast cancer survivors, with some interventions indicating more benefits for older participants in improving physical functioning (> 57 years) [23] and strength and health scores (> 50 years) [20], while another showed stronger effects on aerobic fitness among younger participants (< 50 years) [16]. MVPA outcomes were more favorable among YACS who were married/partnered, which is consistent with previous studies of PA behavior change interventions among breast cancer survivors [24, 28]. This is not unexpected given that social relationships and social support have been identified as facilitators of PA in YACS [55, 56], and research has shown a positive association between social support and PA among AYAs [57].

The intervention had a stronger effect on MVPA than the self-help condition among YACS who reported having stage III/IV cancer. This is contrary to an evaluation of a PA behavior change intervention among breast cancer survivors, which reported no moderation of accelerometer-measured MVPA by cancer stage [24]. We are aware of one previous trial that reported cancer stage as a moderator of PA behavior change intervention effects, with better outcomes on lower extremity pain and physical dysfunction among breast cancer survivors with lower- versus higher-stage disease [27]. However, previous studies in breast cancer and lymphoma patients found that supervised exercise training was more favorable than usual care for improving lean body mass among those with higher-stage, but not lower-stage disease [16, 17]. It is possible the intervention effects among YACS with stage III/IV cancer relate to better response to mHealth intervention strategies, which were designed to address PA barriers and support PA adaptations, over and above the digital tools available to the self-help group. This is notable since a systematic review demonstrated the health benefits of PA for advanced-stage cancer patients and the need for more randomized trials focused on exercise in this population [58]. Given our exploratory analyses and the smaller subgroup of participants with stage III/IV cancer, future replication of these findings and consideration of cancer stage in optimizing PA interventions may be warranted.

Greater MVPA increases, though of smaller magnitudes compared with self-help participants, were observed among intervention participants with no baseline comorbidities or a solid tumor type. These findings differ from a PA behavior change intervention in breast cancer survivors in which comorbidities did not moderate effects on MVPA [24]. In a study of PA determinants among YACS, those reporting no comorbidities were more likely to report meeting PA guidelines [51], so it is plausible that intervention effects were stronger among this subgroup in the current study. Other studies of moderators of PA intervention effects have focused on survivors of individual cancer types, which limits evaluation by subcategories of solid or non-solid tumors. A recent systematic review of 118 studies including 15 cancer types found that reported PA barriers, such as comorbidities, vary across cancer types [59]. Overall, more research is needed to understand how PA intervention effects may vary by cancer type, treatment history, and comorbidities. These may be important variables to consider in future PA interventions for YACS as side effects, comorbidities, and PA barriers related to cancer type and treatments may vary more frequently over time. More precisely tailored and highly adaptive intervention strategies, such as just-in-time adaptive interventions that offer support only during times of need, could potentially address this heterogeneity.

This study contributes to the emerging literature identifying moderators of response to PA interventions among cancer survivors. Study strengths include the randomized controlled design, large sample size and longer duration relative to previous studies in YACS, and accelerometer-measured outcomes. These findings demonstrate the potential for mHealth strategies among subgroups of YACS underrepresented in research (i.e., males, racial/ethnic minority groups) and identified baseline characteristics for which further tailoring and adaptations in future PA interventions may be warranted. Given this was an exploratory study, there are several limitations. Like most previous work, our analyses did not account for combinations of moderators that may identify subgroups who responded favorably to the intervention. The study had limited power to detect group-time interaction effects within subgroups due to large sample size imbalances for some moderator variables (e.g., baseline HRQOL scores). Our measures of cancer stage and comorbidities were self-reported. Finally, findings may not be generalizable to subgroups of YACS not represented in the sample, including non-English speakers or those without internet access.

In conclusion, our findings on potential moderating variables indicate that considering baseline sex, race and ethnicity, BMI, and cancer stage when tailoring future PA interventions for YACS may be warranted. Additionally, further intervention enhancements or alternate strategies may be needed to facilitate improved PA behaviors among subgroups where none were observed (e.g., lower education) as a result of the current intervention. Overall, these results demonstrate the potential of mHealth interventions to promote increased MVPA among subgroups of YACS and underscore the need for more highly tailored and adaptive interventions that are matched to participant characteristics.

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Data availability The data that support the findings of this study are available from the corresponding author upon reasonable request.

Declarations

Ethics approval All procedures were approved by the University of North Carolina at Chapel Hill Oncology Protocol Review Committee (LCCC1707) and Institutional Review Board (#16-3409) and performed in accordance with the ethical standards of the institutional and/or national research committee and with the 1964 Helsinki Declaration and its later amendments or comparable ethical standards.

Informed consent Informed consent was obtained from all individual participants included in the study.

Competing interests The authors have no relevant financial or non-financial interests to disclose.

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