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## Associations of Co-occurring Psychosocial and Lifestyle Factors with Multisite Musculoskeletal Pain during Late Adolescence – A birth Cohort Study

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## Abstract

**Background:** Musculoskeletal (MS) pain is common. It often exists in several sites and is recurrent. Psychosocial difficulties and unhealthy behaviours have been related to multisite MS pain, but no literature has assessed the impact of accumulated psychosocial and lifestyle factors on recurrent multiple MS pain.

**Methods:** Our data was gathered from two questionnaires of the well-known Northern Finland Birth Cohort 1986 (NFBC1986), sent to members when they were aged 16 and 18. A total of 1625 adolescents (712 boys and 913 girls) answered questions on smoking, physical activity, sedentary behaviour, sleeping, and emotional and behavioural problems at 16 years and on musculoskeletal pain at 16 and 18 years. Weight and height measurements were taken at a health examination at baseline. A latent class analysis (LCA) and multinomial regression analysis were conducted.

**Results:** We identified four clusters among both sexes. “Externalizing behavior” among both genders (OR 2.98, CI 1.73–5.13 among boys; OR 2.38, CI 1.38–4.11 among girls), “Multiple risk behaviors” among girls (OR 2.73, CI 1.30–5.71) and a “Sedentary” cluster among boys (OR 1.85, CI 1.21–2.82) were associated to recurrent multisite MS pain. ‘Obese’ clusters had no significant associations with recurrent multiple MS pain.

**Conclusions:** Adolescents with psychosocial difficulties and/or several adverse health behaviours were at an increased risk of recurrent multisite MS pain, which emphasizes the importance of simultaneously studying multiple rather than single factors. The identification of risk groups may help more accurately target preventive interventions.

**Significance:** This study found subgroups of adolescents at risk of recurrent multisite musculoskeletal pain during late adolescence. The accumulation of multiple adverse behaviours is likely to provide new perspectives for understanding the multidimensional nature of multiple MS pains.

## 1. Introduction

In the last decade, musculoskeletal (MS) research has shifted its emphasis from single-site pain to multisite pain (Carnes et al. 2007, Kamaleri et al. 2008a). Large epidemiological studies have defined multisite MS pain as pain occurring concurrently in different body parts, including the back, neck and lower limbs (Carnes et al. 2007, Kamaleri et al. 2008b, Paananen et al. 2010a). Multisite MS pain seems to have more detrimental consequences for health-related quality of life (Holm et al. 2012, Paananen et al. 2011), pain disability (Hoftun et al. 2011, Holm et al. 2012) and function (Bruusgaard et al. 2012), and appears to be more recurrent/persistent (El-Metwally et al. 2004) than single site pain already among the young.

Between 22% and 69% of European adolescents report multisite MS pain (Hanvold et al. 2016, Paananen et al. 2010a, Pellisé et al. 2009). Generally, adolescent MS pain often has a non-specific characteristic, with no identifiable patho-anatomical cause (Houghton 2010, MacDonald et al. 2017). Pains with addressable aetiology are mainly related to an acute injury or overuse of the MS system rather than to degenerative processes (MacDonald et al. 2017).

Adolescence is a critical stage of life during which health risk behaviours and psychosocial problems tend to emerge (Corder et al. 2017, Costello et al. 2011). Part of these engagements seem to be related to external stimuli to which adolescent brains are especially vulnerable (Casey et al. 2008). Earlier longitudinal studies have found that different health behaviours and psychosocial factors influence the development of multisite pain in childhood and adolescence. For instance, an English study observed that psychosocial symptoms and high levels of physical activity between the ages of 11 and 14 predicted widespread pain (WSP) one year later (Jones et al. 2003), while a Finnish study found that depressive feelings among 10- to 12-year-olds predicted onset of WSP at one- and four-year follow-ups (Mikkelsen et al. 2008). Furthermore, sleep problems at 15 years predicted WSP two years later among English adolescents (Harrison et al. 2014).

We have previously shown that instead of one, adolescents often struggle with several adverse psychosocial and health-related behaviours at the same time (Heikkala et al. 2014). Later we have found that clustered unhealthy habits are associated with low back pain (Mikkonen et al. 2016). In terms of adolescent multisite MS pain, the number of psychosocial problems, unhealthy lifestyle factors and multiple MS pain sites seemed to have a dose-response relationship in a cross-sectional setting (Paananen et al. 2010a), and several of these single factors associated with recurrent MS pain longitudinally among the participants of the Northern Finland Birth Cohort 1986 (NFBC1986) (Jussila et al. 2014, Paananen et al. 2010b).

However, it remains unknown whether different combinations of these factors specifically increase the risk of recurrent multisite pain. Thus, the aim of this study was to examine how earlier formed lifestyle and psychosocial patterns (Heikkala et al. 2014) associate with recurrent multiple MS pain among adolescents in a two-year follow-up. Our hypothesis was that subgroups with psychosocial problems in particular would be likely to suffer recurrent multisite MS pain. Our analyses were stratified by gender, as the prevalence of MS pain differs among boys and girls.

## **2. Methods**

### *2.1. Study population*

The study population consisted of participants of the Oulu Back Study (OBS) in 2003–2004 who belonged to the Northern Finland Birth Cohort 1986 (NFBC1986) between 2001 and 2002. The OBS included NFBC1986 members living within 100 km from the city of Oulu at the age of 18 to 19. The NFBC1986 itself consists of those born in the northernmost provinces of Finland between 1st July 1985 and 30th June 1986 (n=9479). We collected the baseline data of our work via a postal survey of NFBC1986 participants aged 15 to 16, over a period of 11 months, from May 2001 to April 2002 (n=9215, of which 7344 replied and 6892 provided data on lifestyle and psychosocial factors). We also used a postal questionnaire for the follow-up sample of the OBS participants (n=2969, of which 2012 replied). A total of 1583 (691 boys and 892 girls) adolescents had taken part in the baseline collection of data on lifestyle factors, psychosocial problems and multisite MS pain and responded to the second questionnaire on multisite MS pain. All the participants gave their informed consent, and the study was approved by the local ethics committees.

## *2.2. Psychosocial problems at 16 years*

The Youth Self-Report (YSR) questionnaire is a widely used instrument for assessing adolescents' emotional and behavioural problems. The questionnaire comprises 105 items, each of which ask the respondents to rate themselves on a scale of 0–2: 0 = not true, 1 = somewhat or sometimes true, and 2 = very true or often true. From these items, eight syndrome scales can be formed, of which anxious/depressed symptoms, withdrawn/depressed symptoms and somatic complaints can be scored as “internalizing syndromes”, and rule-breaking behaviour and aggressive behaviour as “externalizing syndromes”. We used these broadband scales in the present work, and trichotomized them as normal range, borderline range and clinical range, consistent with the recommended cut-off limits. For further analyses, we combined the last two groups as “problem range” (above 82<sup>nd</sup> percentile) (Helstelä and Sourander, 2001, Kantomaa et al. 2008). The documentation of the construct, criterion-related and content validity, and the reliability of the YSR, based on the test-retest correlations, have proven to be good (Achenbach and Rescorla, 2001), and the questionnaire is an established reliable data collection method in epidemiological studies in Scandinavia (Berg-Nielsen et al. 2003, Broberg et al. 2001) and Finland (Helstelä and Sourander, 2001).

## *2.3. Lifestyle factors at 16 years*

### *Physical activity*

The questionnaire asked adolescents to estimate their participation in brisk (=at least some sweating and shortness of breath) moderate-to-vigorous physical activity (MVPA) outside school hours (Tammelin et al. 2007). Those who reported more than three hours of MVPA per week were classified as active, 2–3 hours of MVPA per week as moderately active, and 1 hour or less of MVPA per week as inactive.

### *Smoking*

Three questions elicited smoking behaviour: “Have you ever smoked?”, “Have you ever smoked regularly?” and “How much do you currently smoke?”. From the responses we formed three categories: (1) non-smokers, (2) 0.1–1.0 pack-years by the age of 16 years, and (3) over 1.0 pack-year, where one pack-year is equivalent to 15 cigarettes smoked per day for a year.

### *Sedentary behaviour*

We measured sedentary behaviour by inquiring about the adolescents’ daily time spent watching television, reading books or magazines, playing or working on a computer, and other sedentary activities. For girls, we retained the total number of sedentary hours as a continuous variable and for boys as a trichotomized variable: (1) 4 hours or less per day, (2) 4.1–7.9 hours, and (3) 8 hours or more per day.

### *Sleeping time*

The sleep variable was based on responses to the question: “How many hours on average do you sleep per day?”, and the categories included: (1) less than 8 hours, (2) 8–9 hours, and (3) more than 9 hours per day.

### *Body mass index*

The adolescents’ weight and height measurements were taken at a health examination at the age of 16 (n=6068, participation rate 88%). We calculated BMI values according to the following formula:  $\text{weight (kg)/height (meters)}^2$ . We used self-reported values for the 12% of adolescents who did not participate in the health examination. A continuous variable was formed for BMI. The International Obesity Task Force age-specific cut-off points for BMI

provided scales for overweight: 23.90–28.88 kg/m<sup>2</sup> for boys and 24–29.43 kg/m<sup>2</sup> for girls, and for obesity: 28.88 kg/m<sup>2</sup> for boys and 29.43 kg/m<sup>2</sup> for girls (Cole et al. 2000).

#### *Confounding factor*

As family socioeconomic status has been linked to both health behaviour and mental distress, we regarded it as a possible confounder. Information on parent's occupational status, which characterized family socioeconomic status, was collected at 16 years via a questionnaire sent to parents. We categorized occupational status as 1) higher clerical employees; 2) self-employed; 3) lower clerical employees; 4) workers, and 5) students, pensioners, unemployed or unknown.

#### *2.4. Categorization of the variables used in clustering*

In the procedure for selecting continuous and categorical variables for LCA, we evaluated several different combinations of continuous and categorical, i.e. dichotomized and trichotomized, variables. Dichotomizing problems other than externalizing and internalizing problems would have led to information loss and would have complicated interpretability, whereas using all the variables as continuous variables resulted in small group sizes. Finally, the model, in which externalizing and internalizing were dichotomized; physical activity level, sleeping time, smoking among both genders and sedentary activity among boys were trichotomized; and BMI in both sexes and sedentary activity variable among girls were used as continuous variables was the most representative of our data and had the least information loss. (Heikkala et al. 2014)

### *2.5. Multisite musculoskeletal pain*

Musculoskeletal pain was elicited via the question “Have you had any aches or pains during the last six months in the following areas of your body?” (1) neck or occipital area, (2) shoulders, (3) low back, (4) elbows, (5) wrists, (6) knees, and (7) ankle-foot area, at both 16 and 18 years. We combined the last four as peripheral pain. The adolescents provided answers of (1) no, (2) yes, but I have not consulted a physician, physiotherapist, nurse or other health professional (regarded as reporting pain), or (3) yes, and I have consulted a physician, physiotherapist, nurse or other health professional (regarded as consultation for pain). We established four groups on the basis of the number of pain sites: (1) no pain, (2) pain in one site, (3) pain in two sites, and (4) pain in three to four sites. In the analyses of the recurrence of multisite pains, we combined Groups 3 and 4 due to small numbers. We also merged the response options “reporting MS pain” and “consultation for MS pain”. Two or more pain sites at the age of 16 and 18 was defined as recurrent multisite MS pain, which was the main outcome of this study.

### *2.6. Statistical methods*

We assumed that lifestyle and psychosocial factors form different clusters, which present distinct patterns of these factors. To study these patterns, we carried out latent class analysis (LCA), which is an established cluster analytic approach. LCA helps in understanding the complex heterogeneity of the studied factors in the study population by identifying the smallest number of unobserved subgroups of individuals on the basis of psychosocial and lifestyle response patterns. In LCA, the number of latent clusters is increased until the most appropriate model is found. We added the clusters to the model of seven different subgroups. The selection of the most suitable latent cluster number model was based on multiple statistical criteria (Table 1), of which we preferred low BIC value (see Heikkala et al. 2014).



We applied multinomial regression analysis to study the associations between clusters and recurrent MS pain, stratified by gender. We used lifestyle and psychosocial patterns as explanatory factors and multisite MS pain at 16 and 18 years as the outcome factor. We adjusted the associations for socioeconomic status. Odds ratios (ORs) with 95% confidence intervals (CI) described the strengths and statistical significances of the possible associations. We used the Chi square ( $\chi^2$ ) test to estimate the statistical significance in the representativeness analyses.

### **3. Results**

#### Representativeness of the study sample

We used the OBS subsample of the original NFBC1986 cohort to evaluate the recurrence of multisite MS pain. A comparison of the OBS subjects and the remaining NFBC1986 members revealed that a slightly lower proportion of the OBS participants were boys (44% vs 49%,  $p < 0.001$ ;  $\chi^2$  test) and a higher percentage of their parents worked as lower clerical employees (20% vs 13%,  $p < 0.001$ ). Sitting less than four hours per day (29% vs 26%,  $p < 0.05$ ) and non-smoking (84% vs 81%,  $p = 0.001$ ) were more prevalent among the OBS participants than among the other NFBC1986 adolescents. We observed no significant differences in the prevalence rates of emotional and behavioural problems, physical activity level, weight status, sleeping time, or multisite MS pain.

### *3.1. Class characteristics*

We fit the latent class model of four clusters to the adolescents' data on lifestyle behaviours and psychosocial problems (Heikkala et al. 2014; Table 1).

Among the boys, Externalizing behavior (Cluster 1; 14% of boys) represented quite physically active adolescents with externalizing and internalizing problems and the highest probability of smoking (Fig. 1). The boys in the Sedentary cluster (Cluster 2; 27%) were the most physically inactive and sedentary and had the shortest sleeping time. The Obese cluster (Cluster 3; 8%) comprised boys with a very high BMI. These were also quite inactive. Participants belonging to the Reference subgroup (Cluster 4; 51%) engaged in the most favourable lifestyle and had the lowest probability of psychosocial problems.

Among the girls, the Externalizing behavior cluster (Cluster 1; 15% of girls) consisted of the least inactive young people, who also reported externalizing problems (Fig. 2). They also had a relatively high probability of internalizing problems and smoking. All adverse lifestyle factors, except obesity and psychosocial problems, were concentrated in the Multiple risk behaviors cluster (Cluster 2; 12%). The Obese cluster (Cluster 3; 7%) was formed of girls with a high BMI and low physical activity levels. The lowest probabilities of psychosocial problems, smoking, overweight and poor sleeping characterized the Reference cluster (Cluster 4; 67%).

### *3.2. Prevalence of musculoskeletal pain*

Seventeen per cent of the girls and 32% of the boys had been pain-free during the preceding six months at 16 years (Table 2). At 18 years, the percentages were similar: 8% for the girls and 24% for the boys. Two or more pain sites occurred among two-fifths of the boys and three-fifths of the girls at baseline, and among three-fifths of the boys and four-fifths of the

girls at follow-up. Three to four pains were the most prevalent in the girl clusters at 16 years, whereas the boy clusters had more variability (Table 3).

### *3.3. Recurrence of multisite pain in clusters*

In all the girl clusters, over half reported having had multiple MS pains at the ages of 16 and 18, while among the boys, 52% of the Externalizing behavior cluster, 36% of the Sedentary cluster, 38% of the Obese cluster and 25% of the Reference cluster suffered from multisite pain at baseline and follow-up (Table 4). The prevalence of “no pain” or “one-site pain” at the age of 16 and 18 varied from 11% to 21% among the girls, and from 32% to 48% among the boys.

In the analyses, the Reference clusters were used as “Reference” as they represented the most favourable patterns of lifestyle and psychosocial factors. Belonging to the Externalizing behavior cluster was related to recurrent multisite pain among both genders with nearly three-fold odds (OR 2.98, CI 1.73–5.13; Table 5) among the boys and over two-fold odds (OR 2.38, CI 1.38–4.11) among the girls. Girls belonging to the Multiple risk behavior cluster had similar levels of odds of suffering recurrent multiple pain (OR 2.73, CI 1.30–5.71). We also observed a significant association between the Sedentary cluster and recurrent multisite MS pain among the boys (OR 1.85, CI 1.21–2.82). Belonging to the Obese clusters was not statistically significantly related to pains.

## **4. Discussion and conclusions**

We examined the roles of lifestyle and psychosocial clusters in recurrent multisite MS pain between the ages of 16 and 18 in a birth cohort. LCA revealed four clusters for both genders at the age of 16. The accumulation of emotional and behavioural problems, smoking and physical activity significantly increased the risk of recurrent multisite MS pain among both

genders. In addition, having problems in several areas among the girls and inactive lifestyle among the boys associated considerably with recurrent multiple MS pains.

A significant number of the adolescents (one third of the boys and over a half of the girls) suffered from recurrent multisite MS pain. Similar findings have been observed among a sample of Norwegian university students, as 47% of the population reported persistent multiple pains in different MS locations during a 6.5-year follow-up (Hanvold et al. 2016). Among 7 to 18-year-old American children and adolescents with diagnosed chronic pain (of which most was MS pain), 63% characterized the pain as occurring in multiple sites (Basch et al. 2018). In contrast, studies by Mikkelsen et al. (1999, 2008) found that WSP persisted among only 0.7% and 28% of children, depending on the measured time point. Harrison et al. (2014) have also observed low levels of chronicity of WSP (4% of adolescents). Regarding other combinations of MS and other pains, one fourth of adolescents seem to experience persistent symptoms (Hoftun et al. 2011, Kröner-Herwig et al. 2011, van Gessel et al. 2011).

The clusters with a high number of accumulated detrimental psychosocial and lifestyle factors were at a higher risk of recurrent multisite MS pain than the favourable lifestyle factor subgroups, which is in line with earlier cross-sectional observations (Paananen et al. 2010a). Hoftun et al. (2012) noticed in their study that the probability of chronic pain rose in accordance with an increasing number of unfavourable lifestyle factors, whereas McBeth et al. (2001) discovered the same in terms of the prevalence of persistent chronic widespread pain and multiplying psychosocial risks. However, the odds ratios of our results did not quite reach the same levels as previously when we added the single-factor influences one by one (Paananen et al. 2010a). In Paananen et al.'s study, however, the researchers decided which factors to use, whereas LCA forms natural clusters from the available lifestyle and psychosocial variables.

Psychosocial symptoms and mental health, in a broad sense, are likely to play a significant role in the transformation from acute to chronic MS pain (Pincus et al. 2002) and the persistence of MS pain itself (Paananen et al. 2010b, Skrove et al. 2015). This can also be seen in our work as externalizing and internalizing problems, accumulated in three of four subgroups at risk of continuing multiple MS pain. Behavioural difficulties were particularly prevalent among the risk profiles. It is also worth noticing that smoking prevalence was somewhat high and inactivity levels quite low among the Externalizing behavior adolescents, particularly physical inactivity among the girls. McLaren et al. (2017) found that adolescents suffering from problematic MS pain (most of which was multisite pain), smoked more and had poorer mental health than those with no pain, which is in concordance with current observations. Previously, Eckhoff and Kvernmo (2014) have connected over eight hours of physical activity per week to multisite MS pain in adolescence, Puroila and co-workers (2015) have linked moderate levels of activity to later multiple MS pain, and Jones et al. (2003) have found associations between psychosocial problems and high physical activity and widespread pain among schoolchildren, lending some support to our findings. Extreme sports with aggressive characteristics are considered a potential explanation for clustering (Heikkala et al. 2014) and have been linked to MS pain (Guddal et al. 2017), but a more precise analysis of the subscales of psychosocial symptoms observed no disparities in the Externalizing behavior clusters (data not shown).

Inactive lifestyle, including sedentary behaviour and physical inactivity, appears to be related to multisite MS pain. A study by Kamaleri et al. (2008b) noticed a number of pain sites that were higher among individuals with low physical activity, and Eckhoff and Kvernmo (2014) reported sedentary activity as having a similar impact. Haukka et al. (2012) also found that moderate or low physical activity predicted persistent MS pains among adults, but reverse findings have been published among adolescents, i.e. an

association between sedentary behaviour and persistent multisite MS pain has been observed but no significant relations between physical inactivity and persistent multiple MS pains has been found (Paananen et al. 2010b). In the current work, low physical activity and sedentary behaviour accumulated among boys and formed a risk group of their own, i.e., the Sedentary cluster. Interestingly, sleep time was also the shortest on average among these boys. Sleeping might be a critical factor that increases the risk of pain among Sedentary boys (Bonvanie et al. 2016, Gupta et al. 2007, Harrison et al. 2014). Among girls, inactivity and poor sleep was mostly concentrated in the Multiple risk behavior cluster, in which the girls were also at a high risk of recurrent MS pains, as discussed above.

Obesity did not influence the risk of recurrent multiple MS pains in the present study. Supporting our result, obesity was related to any pain, but not chronic widespread pain among 3376 British adolescents (Deere et al. 2012). In a Norwegian study, both overweight and obesity associated with chronic multisite pain (Hoftun et al. 2012). These differences might be due to different definitions, as Hoftun et al. (2012) defined multisite pain as pain in the stomach, head and the MS system. It might also be that the effects of overweight and obesity take longer to emerge in multiple MS sites, as adolescent obesity has been related to later adulthood multisite MS pain (Puroila et al. 2015).

The main strength of the present study is its large baseline sample of adolescents, which can be considered representative of Finnish young people. In addition, according to our best knowledge, no study has previously analysed the influence of LCA clusters on recurrent multisite MS pain. Furthermore, the method we used is established in the field of cluster analyses (Collins and Lanza, 2010, Lazarsfeld and Henry, 1986), and provides a more nuanced understanding of the participants' lifestyle than traditional analytic approaches.

The relatively small follow-up population, a sub-cohort based on location, is likely to be a weakness in our work, as in some clusters the amount of certain pain status-characterized participants ranged from only 8 to 10. In addition, recurrent multisite MS pain was regarded as pain occurring at the age of 16 and 18 during the six months before the measurement points. Thus, when interpreting our results, it must be borne in mind that no information on the pain situation was available between these time points, and some participants may have suffered pain at only these ages but not in between. We did not study pain intensity or frequency, and this must also be considered a weakness of our study. Furthermore, we do not know whether adolescents had pain in different or the same MS locations at the measured time points. However, our focus in this study was on multisite MS pain in general. Self-reported pain values have been criticized as unreliable. However, the previous literature has widely used self-reporting, and no objective measurement methods are yet available to estimate pain status. We did not explore the influences of single factors in the current study, thus we were unable to compare the role of single factors and LCA grouping in multisite MS pain.

In conclusion, the results of the present study provide further support for previous observations regarding the relationships between lifestyle and psychosocial factors and recurrent multisite MS pain among adolescents. We found that the risk of recurrent multiple MS pain was higher among those with psychosocial difficulties and/or several adverse health behaviours, and it seems that these associations are strong. As a result, our findings emphasize the importance of an assessment of psychosocial and lifestyle factors concurrently among adolescents with multisite MS pain. However, due to limited data on pain characteristics, the clinical relevance of the studied pain problems may be questioned,

and therefore, future research should verify the current findings in different populations and especially in data that also includes information on consequential pain.

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### **Author contributions**

EH participated in the study design, calculated the statistics, interpreted the results and wrote the first draft of the manuscript; MP, ST, JA and JK took part in study planning, critically revised the manuscript, provided suggestions to improve the manuscript and supervised the study process. All authors have seen and approved the final version.

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## Legends for illustrations and tables

Fig 1. Characteristics of clusters by problem range levels (%) of psychosocial and lifestyle factors among boys.

Fig 2. Characteristics of clusters by problem range levels (%) of psychosocial and lifestyle factors among girls.

Table 1. Fit statistics for cluster models of one to seven classes, stratified by gender.

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Table 1. Fit statistics for cluster models of one to seven classes, stratified by gender.

<b>BOYS (number of classes)</b>	<b>BIC</b>	<b>AIC</b>	<b>SSABIC</b>	<b>Entropy</b>	<b>LRT</b>
One	38384.202	38310.975	38346.073	N/A	N/A
Two	37902.138	37755.683	37825.879	0.811	0.1190
Three	37609.967	37390.284	37495.578	0.784	0.3129
Four	37568.660	37275.750	37416.142	0.644	0.0008
Five	37603.055	37236.918	37412.408	0.833	<0.001
Six	37648.546	37209.182	37419.770	0.679	0.2307
Seven	37653.450	37140.859	37386.545	0.822	1.0000
<b>GIRLS (number of classes)</b>					
One	26908.612	26843.382	26870.482	N/A	N/A
Two	25935.439	25793.163	25862.357	0.654	<0.0001
Three	25917.237	25706.917	25809.203	0.634	0.0141
Four	25606.412	25328.046	25463.425	0.804	0.0050
Five	25641.632	25295.221	25463.692	0.707	0.4722
Six	25669.709	25255.253	25456.817	0.762	0.6387
Seven	25766.152	25283.651	25518.307	0.824	0.1721

AIC = Akaike Information Criteria, BIC=Bayesian Information Criteria, SSABIC=Sample Size Adjusted Bayesian Information Criteria

LRT =  $p$ -value for the Lo-Mendell-Rubin Likelihood Ratio Test

Table 2. Demographics of baseline sample.

	<b>BOYS (n=3302)</b>	<b>GIRLS (n=3590)</b>
	<b>% (n)</b>	<b>% (n)</b>
<b><i>Emotional symptoms</i></b>		
Problem range	11 (363)	19 (700)
Normal range	89 (2939)	81 (2890)
<b><i>Behavioural symptoms</i></b>		
Problem range	16 (524)	26 (931)
Normal range	84 (2778)	74 (2659)
<b><i>Physical activity</i></b>		
<2 h/week	31 (1023)	41 (1464)
2-3 h/week	24 (785)	30 (1083)
>3 h/week	45 (1494)	29 (1043)
<b><i>Sitting time</i></b>		
<4.1 h/day	22 (730)	30 (1082)
4.1-7.9 h/day	43 (1427)	43 (1548)
>7.9 h/day	35 (1145)	27 (960)
<b><i>Weight status</i></b>		
Normal weight or underweight	83 (2736)	86 (3090)
Overweight	13 (432)	11 (387)
Obese	4 (134)	3 (113)
<b><i>Smoking</i></b>		
No regular smoking	84 (2767)	80 (2857)
0.1-1.0 pack-year	8 (274)	12 (445)
>1.0 pack-year	8 (261)	8 (288)
<b><i>Sleeping time</i></b>		
<8 h/day	17 (552)	25 (891)

8-9 h/day	66 (2198)	65 (2330)
>9 h/day	17 (552)	10 (369)
<b><i>Family's SES</i></b>		
Higher clerical employees	7 (242)	6 (238)
Self-employed	17 (568)	17 (615)
Lower clerical employees	15 (493)	15 (531)
Workers	40 (1315)	40 (1426)
Students etc.	21 (684)	22 (780)
<b><i>Multiple pains at 16</i></b>		
No pain	32 (1042)	17 (595)
One pain-site	25 (796)	19 (675)
Two pain-sites	21 (660)	24 (854)
Three pain-sites	13 (434)	23 (824)
Four pain-sites	9 (291)	16 (578)
<b><i>Multiple pains at 18</i></b>		
No pain	24 (166)	8 (71)
One pain-site	19 (137)	11 (101)
Two pain-sites	24 (167)	21 (186)
Three pain-sites	19 (134)	34 (303)
Four pain-sites	14 (102)	27 (242)

Pack-year = 15 cigarettes smoked per day for a year

SES = socioeconomic status

	GIRLS				BOYS			
	Externalizing behavior	Multiple risk behaviors	Obese	Reference	Externalizing behavior	Sedentary	Obese	Reference
	% (n)	% (n)	% (n)	% (n)	% (n)	% (n)	% (n)	% (n)
No pain	9 (44)	7 (31)	13 (30)	21 (490)	19 (88)	34 (294)	28 (70)	36 (590)
1 pain	15 (80)	15 (62)	20 (46)	21 (487)	20 (93)	23 (200)	25 (62)	26 (441)
2 pains	24 (128)	23 (95)	27 (62)	24 (569)	22 (98)	21 (181)	28 (71)	19 (310)
3-4 pains	52 (276)	55 (228)	40 (93)	34 (805)	39 (177)	22 (188)	19 (48)	19 (312)

Table 3. Prevalence of multiple musculoskeletal pain within clusters at the age of 16.

Table 4. Persistence of multiple musculoskeletal pain within clusters of boys and girls aged between 16 and 18.

Column per cent and N.

	No pain or one pain site at 16 and 18	No pain or one pain site at 16, multiple pain at 18	Multiple pains at 16 and 18
<b><u>BOYS</u></b>			
Externalizing behavior	32% (27)	16% (13)	52% (44)
Sedentary	37% (67)	27% (50)	36% (67)
Obese	46% (22)	16% (8)	38% (18)
Reference	48% (179)	27% (100)	25% (96)
<b><u>GIRLS</u></b>			
Externalizing behavior	12% (18)	18% (25)	70% (99)
Multiple risk behaviors	11% (9)	18% (14)	71% (56)
Obese	18% (10)	31% (17)	51% (28)
Reference	21% (132)	28% (171)	51% (313)



Table 5. Multinomial regression analysis of recurrence of multiple musculoskeletal pain between 16 and 18 years of age within clusters among boys and girls.

	CLUSTERS OF BOYS				CLUSTERS OF GIRLS			
	Externalizing behavior OR (CI)	Sedentary OR (CI)	Obese OR (CI)	Reference OR	Externalizing behavior OR (CI)	Multiple risk behaviors OR (CI)	Obese OR (CI)	Reference OR
Multisite MS pain								
Multiple pains at 16 and 18	<b>2.98</b> (1.73–5.13)	<b>1.85</b> (1.21–2.82)	1.53 (0.78–3.01)	1.00	<b>2.38</b> (1.38–4.11)	<b>2.73</b> (1.30–5.71)	1.18 (0.55–2.51)	1.00
No pain or one pain site at 16, multiple pain at 18	0.86 (0.43–1.75)	1.34 (0.86–2.09)	0.69 (0.29–1.61)	1.00	1.08 (0.56–2.07)	1.25 (0.52–2.98)	1.23 (0.54–2.79)	1.00
No pain or one pain site at 16 and 18	1.00	1.00	1.00		1.00	1.00	1.00	

Adjusted for socioeconomic status

Bolded values are statistically significant

OR = odds ratio

CI = confidence interval

Total N for boys = 691

Total N for girls = 892

Fig 1. Characteristics of clusters by problem range levels (%) of psychosocial and lifestyle factors among boys.

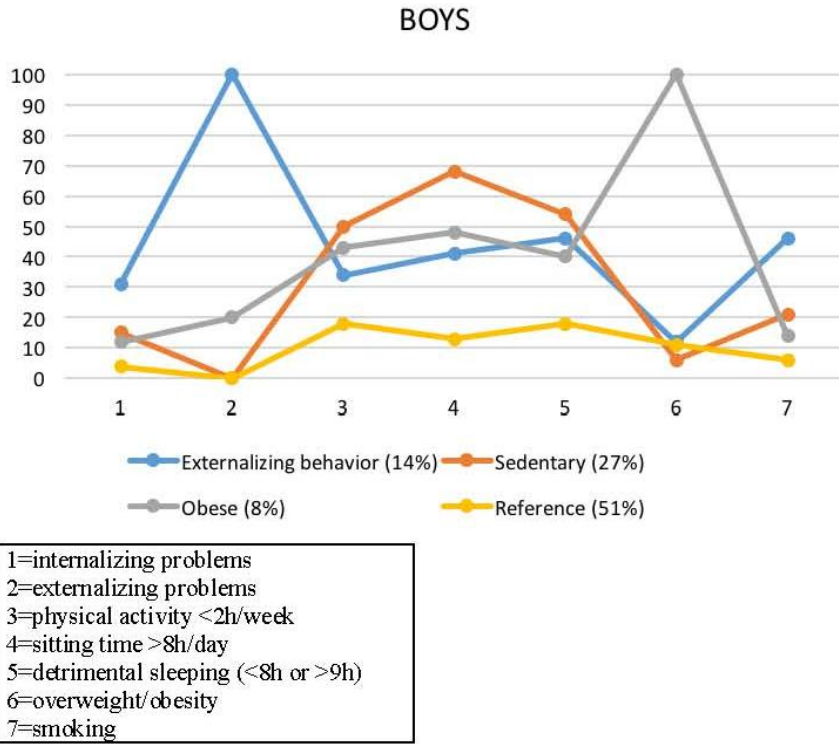


Fig 2. Characteristics of clusters by problem range levels (%) of psychosocial and lifestyle factors among girls.

