# Impact of achievement and change in achievement of lifestyle recommendations in middle-age on risk of the most common potentially preventable cancers 

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#### Abstract

This study aimed to assess the association between achievement, and within-person change in achievement, of lifestyle recommendations in middle-age and incidence of the most common potentially preventable cancers. We used data from 44,572 participants from the Swedish Västerbotten Intervention Programme who had attended at least two health checks 9-11 years apart. We assessed the association between the mean number of healthy lifestyle recommendations achieved (lifestyle score), and change in lifestyle score between the health checks, and risk of one or more of the eight most common potentially preventable cancers using Cox regression. Participants were followed-up for 11.0 (SD 4.9) years. A higher mean lifestyle score was associated with a lower hazard of cancer in men (HR 0.81 ( $95 \%$ CI $0.74-0.90$ ) per unit increase) and women (HR 0.90 ( $0.84-0.96$ )). There was no evidence of a linear association between change in lifestyle score and risk (HR 0.93 ( $0.85-1.03$ ) and HR 1.004 ( $0.94-1.07$ ) per unit change for men and women respectively). When comparing those with an increase in lifestyle score of $\geq 2$ with those who improved less or declined in achievement the HR was 0.74 (0.54-1.00) and 1.02 ( $0.84-1.24$ ) for men and women respectively. These findings support the inclusion of lifestyle recommendations in cancer prevention guidelines. They further suggest that interventions to change health behaviours in middle-age may reduce risk of the most common preventable cancers in men, but this association was not observed in women. Strategies to encourage healthy lifestyles earlier in the life course may be more effective.


## 1. Introduction

Many national and international organizations, including the World Cancer Research Fund (World Cancer Research Fund, 2021a), the Swedish Public Health authority (Swedish Public Health Authority, 2021), and the UK Department of Health (Bull et al., 2010; Public Health England, 2016; NHS Choices, 2019), incorporate lifestyle recommendations in guidance to reduce risk of cancer. For many of these recommendations, particularly fruit and vegetable intake, red and processed meat intake and dietary fibre, the evidence comes from prospective
cohort studies in which between-individual differences in single lifestyle factors (Aune et al., 2012; Vieira et al., 2015; Liu et al., 2013; Chan et al., 2011; Aune et al., 2011) at one time-point have been associated with risk of specific cancers. The impact of achieving these recommendations on the risk of the most common preventable cancers collectively, and the extent to which change in achievement of these recommendations in middle-age influences future risk of cancer are uncertain.

The evidence for within individual change both for individual and combined cancers is stronger for smoking and alcohol consumption: studies have demonstrated a reduced incidence of cancer in those who

[^0]have quit or reduced smoking compared with those who continue to smoke (Pirie et al., 2013; Jha et al., 2013; Godtfredsen et al., 2005) and in those who reduce alcohol consumption compared with those who continue (Rehm et al., 2007; Ahmad Kiadaliri et al., 2013). A growing number of studies have also reported changes in cancer incidence following weight change (Harvie et al., 2005; Birks et al., 2012; Rodriguez et al., 2007; Parker and Folsom, 2003; Eliassen et al., 2006; Tee et al., 2013; Rapp et al., 2008) or weight maintenance (Robsahm et al., 2019). However, as highlighted in a report on body fatness and cancer published by the International Agency for Research on Cancer (IARC) in 2016, even for body weight where more than 1000 epidemiological studies have been published, the number and quality of studies reporting data on weight-loss or weight maintenance were judged to be insufficient for formal evaluation (Lauby-Secretan et al., 2016). The evidence for physical activity is also mixed, with studies based on self-reported change in physical activity showing variable associations with individual cancers (Moore et al., 2010; Wolin et al., 2009; Wu et al., 2013) while those based on cardiorespiratory fitness show that a stable or increased cardiorespiratory fitness is associated with lower cancer incidence and mortality (Robsahm et al., 2019; Zhang et al., 2014). There is, therefore, a need for further studies exploring the association between achievement of combined lifestyle recommendations and changes in adherence to lifestyle recommendations at an individual level and future incidence of potentially preventable cancers collectively.

The Swedish Västerbotten Intervention Programme (VIP) (Norberg et al., 2010a; Hallmans et al., 2003) combines population-based strategies with invitations for middle-aged inhabitants to attend individual cardiovascular risk factor screening. Although the primary intention of VIP was not to reduce morbidity and mortality from cancer, repeated lifestyle measures are available for participants and the programme has been associated with decreased smoking prevalence (Norberg et al., 2011), a decrease in the overall trend of increasing obesity (Norberg et al., 2010b) and an increase in physical activity (Ng et al., 2011). It therefore provides a unique opportunity to examine the association between achievement, and change in achievement, of lifestyle recommendations in middle-age and risk of cancer.

We aimed to use data from the VIP cohort to assess the association between achievement of lifestyle recommendations in middle age and within-person change in achievement of lifestyle recommendations in middle-age and risk and population burden of the most common potentially preventable cancers.

## 2. Methods

### 2.1. Population

Within VIP, inhabitants in Västerbotten Country in Sweden are invited to attend a health check at age 40, 50 and 60 years of age. Full details of the programme and the health checks are described elsewhere (Norberg et al., 2010a). For this study eligible participants were individuals within the VIP cohort who had attended at least two health checks between 9 and 11 years apart (hereafter referred to as baseline and 10-year health check) between 1985 and 2008 and who did not have a prior diagnosis of any cancer (excluding basal cell carcinoma) at six months after the date of the 10-year health check. If participants had more than two health checks only the earliest two were used for the analysis.

### 2.2. Outcome

The outcome was a new diagnosis of one or more of the eight most common potentially preventable cancers (lung, bowel, female breast, oesophagus, bladder, kidney, stomach and pancreas) at least six months after the date of the 10 year health check. The eight cancers were identified from published data on the number of cases of each cancer
that are potentially preventable in the UK based on estimates of cancer incidence, risk factor prevalence and the published relative risks for risk factors classified by the International Agency for Research on Cancer (IARC) or the World Cancer Research Fund (WRCF) as having 'sufficient' (IARC) or 'convincing' (WRCF) evidence of a causal association for each cancer (Brown et al., 2018). We excluded melanoma as there is inadequate evidence to suggest that modifiable behaviour in adulthood (such as sun protection habits) can reduce risk (Usher-Smith et al., 2014). Participants with one or more of these cancers were identified through linked data from the Regional Cancer Registry using the ICD-7 codes in Appendix Table A.1. Participants were censored at the date of the first incident cancer. Dates of emigration and of death were retrieved from the population register through the linkage to the Swedish tax agency.

### 2.3. Assessment of lifestyle factors

We considered seven lifestyle factors: tobacco use, physical activity, body mass index (BMI), dietary fibre intake, alcohol intake, red and processed meat consumption, and fruit and vegetable consumption. Table 1 shows which of these risk factors have been associated with which of the eight chosen cancers based on judgements by the WRCF (World Cancer Research Fund, 2021b) and IARC (International Agency for Research on Cancer, n.d.; International Agency for Research on Cancer, 2018).

Weight and height were measured. All other factors were selfreported using previously validated measures. Details of how each lifestyle factor was measured and categorised for analysis are given in Appendix B.

We converted each of the seven lifestyle behaviours into dichotomous achievements of recommendations ( $0=$ no, $1=$ yes) (Long et al., 2015; Feldman et al., 2017) (Table 2). We then summed them to produce a lifestyle behaviour score ranging from 0 to 7 for both the baseline and 10-year health checks; 0 indicating that no recommendations were achieved, and 7 indicating achievement of all recommendations. For tobacco use, physical activity and BMI we used international recommendations (World Cancer Research Fund, 2021a). For dietary factors, we considered both the Nordic Nutrition Recommendations (Nordic Nutrition Recommendations, 2012) and the Public Health England recommendations (Public Health England, 2016), generating separate scores for each

### 2.4. Statistical analysis

All analyses were performed using Stata (version 15.1) software and stratified by sex.

The association between i) the achievement of each lifestyle factor and mean lifestyle score in the preceding 10 years and ii) withinindividual change in achievement of each lifestyle factor and the change in lifestyle score over the preceding 10 years, and risk of one or more of the chosen cancers was assessed using Cox regression. Participants were followed from 6 months after their 10-year health check until the earliest of: date of first diagnosis of one of the chosen cancers; date of emigration; date of death; or date of administrative end of follow-up (31/10/2018). For both analyses, we developed separate models to estimate hazard ratios (HRs) for each of the lifestyle recommendations and for the mean or change in lifestyle score, first for univariate analyses (Model 1), then adjusting for baseline age, sex (male/female), marital status (single/widowed/divorced vs married/partner), education (primary/secondary/university or college) and calendar year (1985-1989/ 1990-1994/1995-1999/2000-2004/2005-2008) (Model 2) and finally additionally adjusting for the achievement status of all recommendations at the baseline and 10-year health checks (Model 3).

The mean lifestyle score in the preceding 10 years was calculated as the mean of the lifestyle scores at the baseline and 10-year health checks. It was included in the models both as a categorical variable, each value between 0 and 7 representing a separate category with a score of 3

Table 1
Details of which of the chosen lifestyle factors have been associated with which of the eight chosen cancers based on judgements by the WRCF and IARC.


IARC - International Agency for Research on Cancer.
WCRF - World Cancer Research Fund. Level of evidence indicated by +++ convincing, ++ probable, + limited suggestive.

Table 2
Definitions for achievement of lifestyle recommendations.

| Lifestyle <br> factor | Measure | Nordic <br> Recommendations | UK Recommendations |
| :--- | :--- | :--- | :--- |
| Tobacco use <br> Physical <br> activity | Smoking status <br> Cambridge <br> physical activity | Never or ex-smoker <br> index | At least moderately active |
| BMI | $\mathrm{kg} / \mathrm{m}^{2}$ | $<25 \mathrm{~kg} / \mathrm{m}^{2}$ |  |
| Dietary fibre <br> intake | $\mathrm{g} /$ day | $25-35 \mathrm{~g}$ | $\geq 30 \mathrm{~g}$ |
| Alcohol <br> intake | $\mathrm{g} / \mathrm{week}$ | Women $<70 \mathrm{~g}$, men | $<112 \mathrm{~g}$ (no more than |
| Red and <br> processed <br> meat | $\mathrm{g} /$ week | $<140 \mathrm{~g}$ | 14 units of 8 g$)$ |
| Fruit and <br> vegetables | $\mathrm{g} /$ day | $<500 \mathrm{~g}$ | $<500 \mathrm{~g}$ (no more than |

defined as the reference category, and continuously as a score. Achievement of each lifestyle behaviour in the preceding 10 years was categorised into three groups, those achieving the recommendation at: neither baseline nor 10-year health check; at baseline or 10-year health check; and at both baseline and 10-year health check. Those who achieved the recommendation at neither baseline nor 10-year health check were the reference group.

Change in the lifestyle behaviour score over the preceding 10 years was also included both as a categorical variable and a continuous variable with change in unit of the score compared with baseline. For the categorical analyses, two comparisons were performed. In the first, those who met the recommendation at the baseline and 10-year health check (the maintenance group) were compared to those who met the recommendation only at baseline (the no maintenance group). In the second, those who did not meet the recommendation either at the baseline or 10-year health check (the no improvement group) were compared to those who did not meet the recommendation at baseline but did at the 10-year health check (the improvement group). In both cases the reference group was the group with no change (the maintenance group in the first comparison and the no improvement group in the second). The hazard ratios for each comparison were calculated from a single Cox regression model including all four groups using the postestimation command 'lincom' in Stata.

We estimated the population attributable fraction (PAF) for those who achieved a mean lifestyle score of $\geq 6$ in the preceding 10 years compared to those with a lower mean score and for those whose lifestyle score improved in the preceding 10 years $\geq 1$ and $\geq 2$ compared to those who improved less or declined in achievement, under the assumption of causality. Both were calculated using the "punafcc" command in Stata (Wolin et al., 2009) based on the most adjusted model.

### 2.5. Sensitivity analysis

In a sensitivity analysis, we investigated the impact on the results of missing data for educational level and marital status at baseline and the seven chosen lifestyle factors at both baseline and follow-up using the Multiple Imputation by Chained Equations (MICE) method ( $N=20$ imputed datasets, Stata command "mi"). The baseline year of health check, age, cancer status and Nelson-Aalen estimate of cumulative hazard were included in the imputation model, with separate imputations for men and women. This method assumes that the data were missing at random.

We also performed a second sensitivity analysis with the Nordic recommendations after removing cases of breast cancer among women to enable comparison between men and women across the same seven cancers (lung, bowel, oesophagus, bladder, kidney, stomach and pancreas).

### 2.6. Ethical approval

Written informed consent was obtained from VIP participants and ethical approval was granted by the Regional Ethical Review Board in Umeå (Nr 2017/08-31 with addendum 2018/390-32 M and 2019/ 01217).

## 3. Results

From 182,483 VIP participants, we included 44,572 in the analysis (Fig. 1).

The mean duration of follow-up after the second health check was $11.0 \pm 4.9$ years. During that time, there were 1711 (3.8\%) incident cases of potentially preventable cancer. The incidence was higher in women (1091, 4.7\%), for whom breast cancer and bowel cancer were the dominant cancer types, than in men (620, 2.9\%), for whom the dominant cancer types were bowel and bladder (Table 3).

The demographic characteristics of the participants are shown in Table 4 (and stratified by sex in Appendix Table A.2). 38,049 (85.4\%) were aged either 40 or 50 at baseline, with the majority of baseline assessments taking place 1990-99. Complete data on all the lifestyle behaviours considered were available at both the baseline and 10 year health checks for 32,767 participants (Table 5). Levels of missing data were highest for dietary factors at baseline ( $17.8 \%$ of participants). The proportion meeting the recommendation for each behaviour at baseline ranged from $80.2 \%$ for alcohol consumption to $14.3 \%$ for fruit and vegetable consumption. The proportion of participants achieving each recommendation increased between the baseline and 10-year health checks by $7.1 \%$ for tobacco use, $6.1 \%$ for physical activity, $1.0 \%$ for fibre intake, $24.2 \%$ for red and processed meat intake, $1.6 \%$ for fruit and vegetable intake and $10.9 \%$ for alcohol intake. The proportion of participants with a BMI $<25 \mathrm{~kg} / \mathrm{m}^{2}$ fell by $12.5 \%$. The median lifestyle behaviour score for the Nordic recommendations was 3 (IQR 3-4) at


Fig. 1. Participant selection.

Table 3
Incident cases of chosen cancer.

| Cancer | Male n (\%) | Female n (\%) | Total n (\%) |
| :--- | :--- | :--- | :--- |
| Bladder | $122(0.57)$ | $26(0.11)$ | $148(0.33)$ |
| Bowel | $237(1.10)$ | $209(0.91)$ | $446(1.00)$ |
| Breast | $0(0)$ | $630(2.74)$ | $630(1.41)$ |
| Kidney | $63(0.29)$ | $31(0.13)$ | $94(0.21)$ |
| Lung | $84(0.39)$ | $105(0.46)$ | $189(0.42)$ |
| Oesophagus | $21(0.10)$ | $6(0.03)$ | $27(0.06)$ |
| Pancreas | $57(0.26)$ | $59(0.26)$ | $116(0.26)$ |
| Stomach | $36(0.17)$ | $25(0.11)$ | $61(0.14)$ |
| Total cases | $620(2.88)$ | $1091(4.74)$ | $1711(3.84)$ |

baseline and 4 (IQR 3-4) at 10 years. Similar patterns were seen when considering the UK recommendations (Appendix Table A.3).

The distribution of mean lifestyle score in the 10 years preceding follow-up and the association with incident cancer is shown in Fig. 2 (data in Appendix Tables A.4a and A.4b). After adjusting for marital status, education, calendar year and age at baseline, a higher mean lifestyle score was associated with a lower hazard of cancer in both men and women. There was a suggestion that the association was stronger for men (HR $0.81(0.74-0.90)$ per unit increase in the score) than for women (HR 0.90 ( $0.84-0.96$ )). For those with a mean lifestyle score of $\geq 6$ vs those with a mean lifestyle score $<6$, the HR for men was 0.41 ( $0.15-1.10$ ) and the HR for women was 0.75 ( $0.55-1.02$ ). When excluding breast cancer cases among women, the association in women was comparable with that in men (HR $0.83(0.75-0.93)$ and the HR for those with a mean lifestyle score of $\geq 6$ vs those with a mean lifestyle score $<6$ was 0.45 (0.24-0.85) (Appendix Tables A. 5 and A. 6 and Appendix Fig. C.3).

After adjustment for marital status, education, calendar year, age at baseline and achievement status of all other recommendations at baseline and 10-year health check, only smoking status was associated with

Table 4
Demographic characteristics of study population at baseline.

|  | All study participants |  | No incident cancer |  | One or more of the chosen cancers |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | n | \% | n | \% | n | \% |
| Total | 44,572 | 100.0 | 42,861 | 100.0 | 1711 | 100.0 |
| Age at baseline, years |  |  |  |  |  |  |
| 30 | 6430 | 14.4 | 6316 | 14.7 | 114 | 6.7 |
| 40 | 20,401 | 45.8 | 19,885 | 46.4 | 516 | 30.2 |
| 50 | 17,648 | 39.6 | 16,570 | 38.7 | 1078 | 63.0 |
| 60 | 93 | 0.2 | 90 | 0.2 | 3 | 0.2 |
| Sex |  |  |  |  |  |  |
| Men | 21,538 | 48.3 | 20,918 | 48.8 | 620 | 36.2 |
| Women | 23,034 | 51.7 | 21,943 | 51.2 | 1091 | 63.8 |
| Year at baseline |  |  |  |  |  |  |
| 1985-1989 | 1974 | 4.4 | 1844 | 4.3 | 130 | 7.6 |
| 1990-1994 | 16,350 | 36.7 | 15,440 | 36.0 | 910 | 53.2 |
| 1995-1999 | 15,662 | 35.1 | 15,122 | 35.3 | 540 | 31.6 |
| 2000-2004 | 6600 | 14.8 | 6487 | 15.1 | 113 | 6.6 |
| 2005-2008 | 3986 | 8.9 | 3968 | 9.3 | 18 | 1.1 |
| Education at baseline |  |  |  |  |  |  |
| Primary | 7851 | 17.6 | 7404 | 17.3 | 447 | 26.1 |
| Any secondary | 24,475 | 54.9 | 23,625 | 55.1 | 850 | 49.7 |
| University/College | 11,462 | 25.7 | 11,098 | 25.9 | 364 | 21.3 |
| Missing | 784 | 1.8 | 734 | 1.7 | 50 | 2.9 |
| Marital status at baseline |  |  |  |  |  |  |
| Single/Widowed/ <br> Divorced | 7516 | 16.9 | 7248 | 16.9 | 268 | 15.7 |
| Married/Partner | 36,669 | 82.3 | 35,244 | 82.2 | 1425 | 83.3 |
| Missing | 387 | 0.9 | 369 | 0.9 | 18 | 1.1 |

hazard of cancer (Appendix Tables A.4a and A.4b). Compared with those who were current smokers at both baseline and the 10 -year health check, those who were non-smokers at both time points were less likely to develop cancer (HR 0.51 ( $0.40-0.66$ ) in men and HR 0.78 ( $0.65-0.95$ )

Table 5
Achievement of Nordic recommendations and lifestyle behaviour score at baseline and 10-year health check.

|  | All participants ( $n=44,572$ ) |  |  |  | No incident cancer ( $n=42,861$ ) |  |  |  | One or more of the chosen cancers$(n=1711)$ |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | Baseline |  | 10-year health check |  | Baseline |  | 10-year health check |  | Baseline |  | 10-year health check |  |
|  | n | \% | n | \% | n | \% | n | \% | n | \% | n | \% |
| Tobacco use |  |  |  |  |  |  |  |  |  |  |  |  |
| Recommendation met (non-users/past users) | 33,814 | 75.9 | 36,986 | 83.0 | 32,681 | 76.3 | 35,695 | 83.3 | 1133 | 66.2 | 1291 | 75.5 |
| Missing | 784 | 1.8 | 645 | 1.5 | 760 | 1.8 | 616 | 1.4 | 24 | 1.4 | 29 | 1.7 |
| BMI, $\mathrm{kg} / \mathrm{m}^{2}$ (mean, SD) | 25.2 | 3.8 | 26.5 | 4.3 | 25.2 | 3.9 | 26.5 | 4.3 | 25.2 | 3.7 | 26.6 | 4.3 |
| Recommendation met ( $<25 \mathrm{~kg} / \mathrm{m}^{2}$ ) | 23,277 | 52.2 | 17,672 | 39.7 | 22,415 | 52.3 | 16,996 | 39.7 | 862 | 50.4 | 676 | 39.5 |
| Missing | 679 | 1.5 | 41 | 0.1 | 645 | 1.5 | 36 | 0.1 | 34 | 2.0 | 6 | 0.4 |
| Physical activity |  |  |  |  |  |  |  |  |  |  |  |  |
| Inactive | 7107 | 15.9 | 7612 | 17.1 | 6839 | 16.0 | 7261 | 16.9 | 268 | 15.7 | 351 | 20.5 |
| Moderately inactive | 13,622 | 30.6 | 12,790 | 28.7 | 13,047 | 30.4 | 12,249 | 28.6 | 575 | 33.6 | 541 | 31.6 |
| Moderately active | 12,068 | 27.1 | 12,538 | 28.1 | 11,637 | 27.2 | 12,087 | 28.2 | 431 | 25.2 | 451 | 26.4 |
| Active | 9123 | 20.5 | 11,359 | 25.5 | 8846 | 20.6 | 11,006 | 25.7 | 277 | 16.2 | 353 | 20.6 |
| Recommendation met (active/moderately active) | 21,191 | 47.5 | 23,897 | 53.6 | 20,483 | 47.8 | 23,093 | 53.9 | 708 | 41.4 | 804 | 47.0 |
| Missing | 2652 | 6.0 | 273 | 0.6 | 2492 | 5.8 | 258 | 0.6 | 160 | 9.4 | 15 | 0.9 |
| Dietary fibre intake, $\mathrm{g} /$ day (mean, SD) | 19.0 | 7.4 | 18.4 | 7.5 | 19.0 | 7.4 | 18.4 | 7.6 | 18.5 | 6.8 | 18.4 | 7.3 |
| Nordic recommendation met ( $\geq 25 \mathrm{~g} /$ day) | 7022 | 15.8 | 7502 | 16.8 | 6812 | 15.9 | 7230 | 16.9 | 210 | 12.3 | 272 | 15.9 |
| Missing | 7938 | 17.8 | 2493 | 5.6 | 7517 | 17.5 | 2402 | 5.6 | 421 | 24.6 | 91 | 5.3 |
| Red and processed meat, g/week (mean, SD) | 885.6 | 611.6 | 582.9 | 357.1 | 884.9 | 612.6 | 585.5 | 358.2 | 906.3 | 582.8 | 519.9 | 322.2 |
| Recommendation met ( $<500 \mathrm{~g} /$ week) | 9588 | 22.1 | 20,635 | 46.3 | 9573 | 22.3 | 19,671 | 45.9 | 282 | 16.5 | 964 | 56.3 |
| Missing | 7938 | 17.8 | 2493 | 5.6 | 7517 | 17.5 | 2402 | 5.6 | 421 | 24.6 | 91 | 5.3 |
| Fruit and vegetable intake, g/day (mean, SD) | 315.0 | 241.2 | 306.1 | 233.6 | 314.4 | 241.1 | 305.7 | 233.7 | 333.2 | 243.8 | 316.3 | 233.4 |
| Nordic recommendation met ( $\geq 500 \mathrm{~g} /$ day) | 6368 | 14.3 | 7065 | 15.9 | 6125 | 14.3 | 6760 | 15.8 | 243 | 14.2 | 305 | 17.8 |
| Missing | 7938 | 17.8 | 2493 | 5.6 | 7517 | 17.5 | 2402 | 5.6 | 421 | 24.6 | 91 | 5.3 |
| Alcohol intake, g ethanol/week (mean, SD) | 29.4 | 32.1 | 31.4 | 34.8 | 29.5 | 32.2 | 31.5 | 34.9 | 27.2 | 30.2 | 28.8 | 31.1 |
| Nordic recommendation met ( $<70 \mathrm{~g} /$ week for women; $<140 \mathrm{~g} /$ week for men) | 35,755 | 80.2 | 40,621 | 91.1 | 34,501 | 80.5 | 39,061 | 91.1 | 1254 | 73.3 | 1560 | 91.2 |
| Missing | 7938 | 17.8 | 2493 | 5.6 | 7517 | 17.5 | 2402 | 5.6 | 421 | 24.6 | 91 | 5.3 |
| Nordic lifestyle behaviour score (median, IQR) | 3 | 3-4 | 4 | 3-4 | 3 | 3-4 | 4 | 3-4 | 3 | 2-4 | 4 | 3-4 |
| $\leq 1$ | 1351 | 3.0 | 1018 | 2.3 | 1258 | 2.94 | 978 | 2.28 | 93 | 5.44 | 40 | 2.34 |
| 2 | 6607 | 14.8 | 6429 | 14.4 | 6342 | 14.8 | 6174 | 14.4 | 265 | 15.49 | 255 | 14.9 |
| 3 | 11,644 | 26.1 | 12,942 | 29.0 | 11,210 | 26.15 | 12,451 | 29.05 | 434 | 25.37 | 491 | 28.7 |
| 4 | 9974 | 22.4 | 12,176 | 27.3 | 9668 | 22.56 | 11,688 | 27.27 | 306 | 17.88 | 488 | 28.52 |
| 5 | 4746 | 10.7 | 6380 | 14.3 | 4626 | 10.79 | 6152 | 14.35 | 120 | 7.01 | 228 | 13.33 |
| $\geq 6$ | 1679 | 3.8 | 2465 | 5.5 | 1626 | 3.79 | 2382 | 5.56 | 53 | 3.1 | 83 | 4.85 |
| Missing | 8571 | 19.2 | 3162 | 7.1 | 8131 | 18.97 | 3036 | 7.08 | 440 | 25.72 | 126 | 7.36 |

BMI: Body mass index, IQR: Inter-quartile range, SD: Standard deviation.
in women). Findings were similar when considering the UK recommendations (Appendix Fig. C. 1 and Appendix Tables A.7a and A.7b)) and in women after excluding breast cancer (Appendix Tables A. 5 and A. 6 and Appendix Fig. C.3).

Of the 16,034 men with complete data, 5686 (35.5\%) increased their lifestyle score between the baseline and 10-year health checks and 4504 (28.1\%) decreased their score. There was no evidence of a linear association (HR 0.93 (0.85-1.03) per unit change of the score) (Fig. 3). However, when comparing men with an increase in lifestyle score of $\geq 2$ with those with an increase $<2$, the HR was 0.74 ( $0.54-1.00$ ) (Appendix Table A.8).

Of the 17,805 women with complete data, 7322 ( $41.1 \%$ ) increased their lifestyle score between the baseline and 10-year health checks and 4771 (26.8\%) decreased their score. There was no association between change in lifestyle score and hazard of cancer (HR 1.004 (0.94-1.07) per unit change of the score). When comparing women with an increase in lifestyle score of $\geq 2$ with those with an increase $<2$, the HR was 1.02 (0.84-1.24) (Appendix Table A.8).

After adjustment for marital status, education, calendar year, age at baseline and achievement status of all other recommendations at baseline and 10-year health check, only a change in smoking status was associated with hazard of cancer (Appendix Tables A.9a and A.9b). Men who stopped smoking between the baseline and 10-year health checks were less likely to develop cancer than those who continued to smoke (HR 0.64 ( $0.45-0.92$ )) and women who started smoking between the baseline and 10-year health checks were more likely to develop cancer than those who remained non-smokers (HR 1.55 (1.03-2.34)). Findings
were similar when considering the UK recommendations (Fig. C. 2 and Appendix Tables A.8, A.10a and A.10b)) and in women after excluding breast cancer (Appendix Tables A. 6 and A. 11 and Appendix Fig. C.4).

## 4. Discussion

In this cohort of over 40,000 participants from a community-based cardiovascular disease prevention programme, we have shown that achieving more lifestyle recommendations on average over a 10-year period in middle-age is associated with a lower hazard of the most common preventable cancers in both men and women. There was a suggestion that the association was stronger for men than for women, with achievement of each additional lifestyle recommendation associated with a $19 \%$ (10-26\%) decrease in hazard in men and a $10 \%$ (4-16\%) decrease in women.

There was no evidence of a linear association between change in achievement of recommendations and hazard of cancer in either men or women. However, if all men had increased the number of Nordic recommendations they met by two or more we estimated that up to $23 \%$ of incident cases of these cancers, and $7 \%$ of all cancers, might have been prevented. This association was not seen in women and of the seven individual lifestyle recommendations considered, only cigarette smoking was associated with developing one of the chosen cancers.

The stronger associations in men than women may reflect the different relative distribution of the chosen cancers and the different contributions of lifestyle factors across the cancers. In women, breast cancer accounted for $57.7 \%$ ( $n=630 / 1091$ ) of incident cases, with


Fig. 2. Distribution of mean Nordic lifestyle score in the preceding 10 years (bars, left axis) and association between mean Nordic lifestyle score and cancer incidence (forest plot, right axis in men (A) and women (B). HRs adjusted for age group at baseline, baseline year, education level and marital status. CI confidence interval, HR hazard ratio.
bowel cancer (19.2\%) and lung cancer (9.6\%) the next most common. In men, bowel cancer was the most common (38.2\%), followed by bladder cancer (19.7\%) and lung cancer (13.5\%). While breast cancer has been associated with BMI, alcohol consumption, physical activity and fruit and vegetable consumption, smoking, dietary fibre intake and red/ processed meat consumption are also additional established risk factors for bowel cancer, making it the only one of the chosen cancers to be associated with all the included lifestyle factors (Brown et al., 2018). Smoking is also a strong risk factor for lung cancer and bladder cancer, with relative risks from cohort studies assessing between individual differences two to four-fold greater than any of the other lifestyle risk factors for breast cancer (Brown et al., 2018). It is, therefore, not surprising that the overall association between lifestyle factors and hazard of the most common preventable cancers in each sex was found to be different between men and women. For the association between the mean lifestyle score in the previous 10 years and the hazard of cancer, the hazards for men and women were comparable when breast cancer was excluded. This is consistent with previous studies on individual cancers where the relative risks for lifestyle factors are similar between men and women. The difference between men and women for the association between the change in lifestyle score in the previous 10 years and the hazard of cancer persisted after exclusion of breast cancer among women. This may be because of the smaller number of cancer cases in women after exclusion of breast cancer or may reflect a true


Fig. 3. Distribution of change in Nordic lifestyle score in the preceding 10 years (baseline to 10-year health check) (bars, left axis) and association between change in Nordic lifestyle score and cancer incidence (forest plot, right axis in men (A) and women (B). HRs adjusted for age group at baseline, baseline year, education level and marital status. CI confidence interval, HR hazard ratio.
biological difference between men and women.
The different contributions of lifestyle factors to the chosen cancers likely also explains why only cigarette smoking was associated with developing one or more of the chosen cancers: cigarette smoking is associated with all the chosen cancers except breast cancer and has the highest relative risks for most. This reinforces the importance of smoking as a risk factor for cancer and the benefits of smoking cessation on future hazard of the most common potentially preventable cancers collectively (Pirie et al., 2013; Jha et al., 2013).

The difference in both sexes between the association observed for mean lifestyle achievement and cancer incidence, and the absence of a linear association with change in achievement of lifestyle recommendations, suggests that the reductions in cancer risk over 11 years achievable through individuals changing lifestyle in middle-age are small compared with those associated with between-individual differences. This is consistent with other studies. For example, a large cohort study among 328,781 participants across Europe found that a higher BMI at recruitment (mean age 50 years) was associated with an increase in colon cancer incidence in men (HR 1.04; 95\% CI 1.02-1.07) but subsequent weight gain or loss was not related to colon or rectal cancer risk in men or women (Bisschop et al., 2014). Weight gain of 2.0 kg or more since age 18 years has also been estimated to explain 15\% of breast cancer cases, with only $4.4 \%$ of cases of breast cancer attributable to the same weight gain since menopause (Eliassen et al., 2006). As has
previously been suggested, this lack of effect of change in middle-age may be because gaining weight later in life is less detrimental than gaining weight earlier in life (Bisschop et al., 2014). Similar explanations may be the case for the other lifestyle risk factors included in this study.

We considered a number of limitations when interpreting the findings. In particular, there were few incident cancers, particularly among those under 50 years of age. Additionally, less than $20 \%$ of participants changed their lifestyle score by two or more between baseline and 10year health checks and the median lifestyle behaviour score only increased from 3 (IQR 3-4) at baseline to 4 (IQR 3-4) at the 10-year health check. Although small, these changes are comparable with other population-based interventions (Blomstedt et al., 2015; Record et al., 2015), and therefore are likely to reflect the magnitude of changes realistically achievable among middle-age individuals. While we used validated measures, imprecise self-report of lifestyle behaviours may have led to regression dilution bias and introduced recall and social desirability bias. We also considered only seven lifestyle factors and assessed the number of lifestyle recommendations achieved on the basis of the dichotomized value of each lifestyle factor, treating all as equally important and potentially missing small changes in lifestyle insufficient to move between categories. Finally, we cannot exclude residual confounding.

## 5. Conclusion

Our data confirm the association between achievement of lifestyle recommendations and cancer in middle-age (Brown et al., 2018; Li et al., 2018; Li et al., 2020) and support the inclusion of lifestyle recommendations in national and international cancer prevention guidelines. They further suggest that the development and implementation of individual and population-based approaches to change health behaviours in middle-age may reduce risk of the most common preventable cancers in men, but this association was not observed in women. Strategies to encourage the adoption and maintenance of healthy lifestyles earlier in the life course may be more effective.

## Availability of data and materials

All relevant aggregated data are presented in this article. Requests for the individual-level data can be made to the Department of Biobank Research, Umeå University (http://www.biobank.umu.se/biobank/nsh ds/), and will be subject to ethical review and assessment by a panel of scientists. Individual-level data cannot be made publically available due to legal restrictions imposed by the Swedish Authority for Privacy Protection.

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## Declaration of Competing Interest

The authors declare that there are no competing interests.

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## Appendix. Supplementary data

Supplementary data to this article can be found online at https://doi. org/10.1016/j.ypmed.2021.106712.

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