IMPORTANCE Biological aging is a distinct construct from health; however, people who age quickly are more likely to experience poor health. Identifying pediatric health conditions associated with accelerated aging could help develop treatment approaches to slow midlife aging and prevent poor health in later life.

OBJECTIVE To examine the association between 4 treatable health conditions in adolescence and accelerated aging at midlife.

DESIGN, SETTING, AND PARTICIPANTS This cohort study analyzed data from participants in the Dunedin Study, a longitudinal investigation of health and behavior among a birth cohort born between April 1, 1972, and March 31, 1973, in Dunedin, New Zealand, and followed up until age 45 years. Participants underwent an assessment at age 45 years and had data for at least 1 adolescent health condition (asthma, smoking, obesity, and psychological disorders) and outcome measure (pace of aging, gait speed, brain age, and facial age). Data analysis was performed from February 11 to September 27, 2021.

EXPOSURES Asthma, cigarette smoking, obesity, and psychological disorders were assessed at age 11, 13, and 15 years.

MAIN OUTCOMES AND MEASURES The outcome was a midlife aging factor composite score comprising 4 measures of biological aging: pace of aging, gait speed, brain age (specifically, BrainAge score), and facial age.

RESULTS A total of 910 participants (459 men [50.4%]) met the inclusion criteria, including an assessment at age 45 years. Participants who had smoked daily (0.61 [95% CI, 0.43-0.79] SD units), had obesity (0.82 [95% CI, 0.59-1.06] SD units), or had a psychological disorder diagnosis (0.43 [95% CI, 0.29-0.56] SD units) during adolescence were biologically older at midlife compared with participants without these conditions. Participants with asthma were not biologically older at midlife (0.02 [95% CI, −0.14 to 0.19] SD units) compared with those without asthma. These results remained unchanged after adjusting for childhood risk factors such as poor health, socioeconomic disadvantage, and adverse experiences.

CONCLUSIONS AND RELEVANCE This study found that adolescent smoking, obesity, and psychological disorder diagnoses were associated with older biological age at midlife. These health conditions could be treated during adolescence to reduce the risk of accelerated biological aging later in life.
Childrenhood experiences, behaviors, and characteristics are associated with trajectories of health across the life span.\(^1\) International comparative studies have shown that poor health among adult populations can largely be explained by poor health in early life.\(^1\) The risk of poor adult health that accumulates also presents an opportunity for intervention. Intervening to mitigate risk factors before adulthood could prevent poor health as people age.\(^2\) Realizing the potential of this opportunity, however, requires identifying the relevant risk factors to target.

One of the factors associated with chronic disease morbidity and mortality is biological aging, which is defined as gradual physiological decline across multiple organ systems over time.\(^3-5\) Although biological aging is a distinct construct from health, people who age more quickly are more likely to accumulate chronic disease, develop functional disability, and experience early mortality.\(^2-7\) The wide array of poor health outcomes associated with aging suggests that interventions that slow the aging process could improve health later in life, reducing morbidity, disability, and mortality.\(^8-10\)

We conducted a cohort study to examine the association of 4 health conditions commonly seen in clinical practice by physicians who treat adolescents (ie, asthma,\(^11\) cigarette smoking,\(^12\) obesity,\(^13\) and psychological disorders\(^14,15\)) with midlife aging. These 4 conditions have high population prevalence, peak onset early in life, high levels of chronicity, and known modifiability.\(^16-22\) The Dunedin Study, a longitudinal investigation of health and behavior of a birth cohort in Dunedin, New Zealand, tracked these conditions in childhood and used multiple validated assessments of biological age during midlife. Identifying the conditions associated with accelerated biological age could help in ascertaining which interventions might slow aging before health consequences accumulate. We hypothesized that adolescent asthma, cigarette smoking, obesity, and psychological disorders would be associated with older biological age at midlife.

### Methods

**Participants and Study Design**

This cohort study analyzed data of the participants in the Dunedin Study. Written informed consent was obtained from all participants. Study protocols were approved by the Southern Health and Disability Ethics Committee at the New Zealand Ministry of Health and Duke University Health System Institutional Review Board. We followed the Strengthening the Reporting of Observational Studies in Epidemiology (STROBE) reporting guideline.

The full cohort of the Dunedin Study comprised all individuals who were born between April 1, 1972, and March 31, 1973, in Dunedin, New Zealand, and were eligible on the basis of their residency in the province and participation in the first assessment at 3 years of age.\(^23\) The cohort represented the full range of socioeconomic status (SES) in the general population of the South Island. As adults, the cohort matched the results of key health indicators from the New Zealand Health Survey and National Nutrition Survey\(^23\) as well as the distribution of educational attainment among citizens of the same age from the Census of Population and Dwellings.\(^24\)

Ninety-three percent of the cohort self-reported as White, consistent with the predominant racial and ethnic group in the South Island. Other self-reported race and ethnicity categories were Asian (<1%) and Maori or Pacific Islander (7%). Assessments were performed at birth; at 3, 5, 7, 9, 11, 13, 15, 18, 21, 26, 32, and 38 years of age; and, most recently, at age 45 years (completed in April 2019). In the present study, we included participants who underwent an assessment at age 45 years and had data for at least 1 adolescent health condition (asthma, smoking, obesity, and psychological disorders) and outcome measure (pace of aging, gait speed, brain age, and facial age).

**Measures**

We used a midlife aging factor comprising 4 continuous measures of aging that were previously identified in this cohort\(^6,25-27\): pace of aging, gait speed, brain age (specifically, BrainAGE score), and facial age. These measures were given a z score and coded such that the higher scores represented relatively older biological age at age 45 years. Principal component analysis was used to obtain the standardized composite factor score representing midlife biological age. This outcome was used to represent biological age at midlife, as assessed across the 4 measures. Full information maximum likelihood estimation was used to account for participants who were missing data on 1 (n = 41), 2 (n = 2), or 3 (n = 22) of the aging outcome measures.

The pace of aging was measured with repeated assessments of a panel of 19 biomarkers taken at age 26, 32, 38, and 45 years.\(^6\) The 19 biomarkers were body mass index (BMI; calculated as weight in kilograms divided by height in meters squared), waist to hip ratio, hemoglobin A\(_\text{1c}\), leptin, mean arterial pressure, cardiorespiratory fitness, forced expiratory volume in first second of expiration (FEV\(_1\)), FEV\(_1\) to forced vital capacity ratio, total cholesterol, triglycerides, high-density lipoprotein cholesterol, apolipoprotein B\(_{100}\) to A\(_1\) ratio, lipoprotein a, creatinine clearance, urea nitrogen, C-reactive protein, white blood cell count, periodontal disease, and caries-affected tooth surfaces. The linear change in each biomarker...
for each study member was assessed using mixed modeling; the 19 resulting slopes were then summed and scaled so that 1 year of chronological age equated to approximately 1 year of mean change in physiological functioning in the sample.

Gait speed was assessed using a 6-m-long electronic walkway (GAITRite; CIR Systems Inc) with 2-m acceleration before and 2-m deceleration after the walkway. Gait speed was assessed under 3 walk conditions: usual gait speed, dual-task gait speed (walking and reciting aloud the alternate letters of the alphabet), and maximum gait speed. These walk conditions were correlated, and the mean speed was used to generate a composite gait speed.25

Brain age at age 45 years was derived from structural magnetic resonance imaging (MRI) data using a 3T scanner equipped with a 64-channel head/neck coil (Siemens Skyra 3T; Siemens Healthcare). BrainAGE score26 was calculated as the difference between a participant’s predicted age (derived from structural MRI data using a publicly available algorithm27 that was trained on vertex-wise cortical thickness and surface area data as well as subcortical volume) and exact chronological age at the date of the MRI scan. We chose the BrainAGE algorithm because of its performance in predicting chronological age in independent samples and its sensitivity to age-related cognitive impairment in older age.27 Test-retest reliability (mean interval, 79 days) of brain age was found to be excellent in 20 participants in the Dunedin Study (intraclass correlation coefficient, 0.81).

Facial age was based on 2 measurements of perceived age28 using ratings of each participant’s facial photograph by an independent panel of 8 raters. First, age range was assessed by an independent panel of 4 raters who were presented with standardized facial photographs of participants and were blinded to their actual age. Raters used a Likert scale to categorize each participant into a 5-year age range such as 20 to 24 years (intrater reliability, 0.77), and mean scores across all raters were calculated. Second, relative age was assessed by a different panel of 4 raters, who were told that all of the people in the photographs were age 45 years. Raters then used a 7-item Likert scale to assign a relative age to each participant (intrater reliability, 0.79). Perceived age at age 45 years was obtained by standardizing and calculating the mean age range and relative age scores.

Adolescent Health Conditions
We tested 4 health conditions that were previously examined in this cohort22-24,31 at 11, 13, and 15 years of age. At each assessment age, interviewers were masked to the participants’ previous health status. Participants were coded as having a health condition if they met the criteria for that condition during at least 1 of the study assessments. The main study findings were unchanged when using a count of visits in which participants had one of the health conditions (eMethods 1 in the Supplement).

Asthma status was assessed using standardized interviews of participants by pulmonary specialists.22,31,32 Participants were required to have a diagnosis of asthma in addition to either showing symptoms (asthma attack or recurrent wheeze; participants who reported ≤2 episodes lasting ≤1 hour were excluded) or undergoing medical treatment over the past 12 months.

Smoking status was assessed using self-reported cigarette smoking from in-person interviews.29

Obesity was assessed using participants’ BMI.30 Height was measured with a portable stadiometer (Harpenden), and weight was measured in light clothing using a calibrated scale. Obesity was defined as BMI greater than or equal to the 95th percentile of the pediatric growth chart, which was in line with recommendations of the Centers for Disease Control and Prevention and similar to the BMI cutoffs of the International Obesity Task Force.33

Psychological disorders were assessed in standardized interviews using the Diagnostic Interview Schedule for Children34 according to the then-current criteria of the Diagnostic and Statistical Manual of Mental Disorders (Third Edition)35 at 11, 13, and 15 years of age.16 Diagnoses included anxiety disorders, depressive disorders, conduct disorder, and attention-deficit/hyperactivity disorder.

Childhood Covariates
Three childhood covariates were assessed between birth and age 15 years: childhood health, adverse childhood experiences (ACEs), and childhood SES. These 3 covariates were correlated with midlife aging (eTable in the Supplement).

Childhood health from birth to age 11 years was assessed using a panel of biomarkers and clinical ratings. Two Dunedin Study staff members rated participants’ overall health at age 3, 5, 7, 9, and 11 years by reviewing birth records and assessment dossiers.36 Documents included assessments by pediatric clinicians and reports of infections, diseases, injuries, hospitalizations, and other health problems collected from participants’ mothers during standardized interviews. Clinical tests of motor development and measures of body mass, triceps and subscapular skinfold thickness, resting blood pressure, FEV1, and the ratio of FEV1 to forced vital capacity were also included. The mean score of these assessments was calculated to create a standardized score of childhood health whereby higher scores represented greater health problems.

Archival study records were reviewed by 4 independent raters to yield a prospective measure comprising 10 ACEs, which were identified in the ACE study,27 from birth to age 15 years. This measure included 5 types of child harm and 5 types of household dysfunction. The 4 raters showed substantial intrater agreement across all ACEs (κ = 0.79). Counts greater than 4 were recoded as 4, which was in line with the ACE study.28

The SES of the childhood families of participants was measured using the 6-point Elley-Irving socioeconomic index for New Zealand.39 Childhood SES represented the mean of the highest SES levels of either parent reported in assessments from birth through age 15 years.

Statistical Analysis
Data analysis was performed from February 11 to September 27, 2021. We used multiple regression models to test the associations between each adolescent health condition (asthma, smoking, obesity, and psychological disorders) and the midlife...
Association of Adolescent Asthma, Smoking, Obesity, and Psychological Disorders With Accelerated Aging at Midlife

Adolescents who smoked daily (0.61 [95% CI, 0.43-0.79] SD units), had obesity (0.82 [95% CI, 0.59-1.06] SD units), or had a psychological disorder diagnosis (0.43 [95% CI, 0.29-0.56] SD units) were biologically older at midlife according to the aging factor composite score (outcome). First, we tested the association between each health condition and aging at midlife in 4 unadjusted models. Second, we tested a multivariable model that included all 4 health conditions. Third, we tested previous models while adjusting for childhood covariates. Fourth, we tested the association between the health conditions and each of the 4 outcome measures (pace of aging, gait speed, brain age [BrainAGE score], and facial age).

All models were run in Mplus, version 8.3, using full maximum likelihood estimation to account for missing data and including sex as a covariate. Outcomes were reported in SD units of the aging outcomes associated with each of the childhood health conditions to contextualize the size of the associations between the risk factors and the biological age outcomes at midlife. Analyses were checked for reproducibility by an independent data analyst (R.M.H.) using code that was created from the manuscript and applied to a copy of the original data.

**Results**

Of the 1037 original participants in the Dunedin Study, 938 were alive and underwent an assessment at age 45 years and 910 (451 women [49.6%] and 459 men [50.4%]) met the inclusion criteria for the present study. The Supplement presents descriptive statistics and a correlation matrix of study variables (eTable), the aging outcome distributions (eFigure 1), the attrition analyses at the age-45-years assessment (eFigure 2), and a conceptual model of the primary analyses (eFigure 3).

### Association of Adolescent Asthma, Smoking, Obesity, and Psychological Disorders With Accelerated Aging at Midlife

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**Figure 1. Midlife Aging by Number of Adolescent Health Conditions**

Circles indicated the unadjusted mean midlife aging factor scores with 95% CIs (error bars), and comorbid indicated 2 or more conditions. As the number of conditions increased, midlife age advanced (0.45 [95% CI, 0.36-0.53] SD units).

### Association of Adolescent Health Conditions With Pace of Aging, Gait Speed, Brain Age, and Facial Age

We conducted secondary analyses to test whether the health conditions were associated with each of the 4 outcome measures of the midlife aging factor composite score (Table 2). Adolescents who smoked daily had a faster pace of aging, slower gait speed, older brain age, and older facial age at midlife than adolescents without a daily smoking status (with associations between 0.31 and 0.54 SD units). Adolescents with obesity had a faster pace of aging, slower gait speed, and older facial age (with associations between 0.29 and 0.79 SD units) but did not have a significantly older brain age compared with adolescents without obesity (association = 0.14 SD units). Adolescents with a psychological disorder had a faster pace of aging,
slower gait speed, and older facial age (with associations between 0.25 and 0.35 SD units) but did not have an older brain age (association = 0.09 SD units) compared with adolescents without a psychological disorder diagnosis.

In summing the results of smoking, obesity, and psychological disorders, we found that adolescents with more health conditions had a faster pace of aging (0.38 [95% CI, 0.29-0.47] SD units), slower gait speed (0.27 [95% CI, 0.17-0.36] SD units), older brain age (0.14 [95% CI, 0.04-0.23] SD units), and older facial age (0.33 [95% CI, 0.24-0.42] SD units) at midlife (Figure 2). Compared with participants who had none of these health conditions during adolescence, participants with comorbid conditions were biologically aging at a faster rate by 2.8 (95% CI, 2.1-3.4) months per year, were slower in gait speed by 11.2 (95% CI, 7.5-14.8) cm/s, had an older brain age by 2.5 (95% CI, 0.9-4.1) years, and had an older facial age by 3.9 (95% CI, 2.7-5.1) years at midlife.

### Discussion

This cohort study examined the association between 4 adolescent health conditions and accelerated aging at midlife among individuals in the Dunedin Study birth cohort, who underwent assessment from birth up to age 45 years. Adolescents with a daily smoking status, obesity, or a psychological disorder diagnosis were biologically older at midlife. These associations remained after adjusting for 3 childhood covariates and leading risk factors for poor midlife health and accelerated aging: poor health, SES disadvantage, and ACEs. These results aligned with previous empirical evidence that smoking, obesity, and psychological disorders were associated with poor adult health and accelerated aging as measured by DNA methylation clocks. The findings of the present study extend this previous work by linking adolescent conditions to direct measures of midlife aging.

There are several reasons that these health conditions may accelerate aging. Smoking can directly alter the physiological functions associated with aging, such as changes in gene expression and increased oxidative stress, which might explain why the associations between smoking and brain age exceeded those for both obesity and psychological disorders. Smoking and obesity can also play a factor in increased systemic inflammation, which is associated with accelerated aging. Moreover, the environments or behaviors of adolescents who smoke or have obesity could also indirectly increase the risk of accelerated aging. Similarly, behavioral or environmental factors, such as poor health behaviors, less access to health care, and socioeconomic disadvantage, could be associated with psychopathology and accelerated aging. Alternatively, psychological disorders could be a factor in increased systemic inflammation through greater stress. Genetic vulnerability for these conditions could also match the vulnerability to accelerated aging.

Studies have proposed that asthma accelerates aging because of increased inflammation; however, adolescent asthma was not associated with accelerated aging in this study. Previous research found that childhood asthma was a factor in accelerated aging and poor health, although other studies found mixed evidence or no association. This discrepancy may reflect the inclusion of adolescent-limited asthma in this study, given that previous research found that chronic asthma persisting into adulthood was most relevant to health. Alternatively, asthma was more often managed during the 1980s compared with the other health conditions. For example, no adolescents in this cohort were prescribed stimulants for attention-deficit/hyperactivity disorder, and selective serotonin reuptake inhibitors were not yet in use for adolescent depression and anxiety during the study period, whereas 81.1% of the adolescents with asthma received some type of treatment, which could have mitigated the implications for biological aging. Future studies may examine whether asthma treatments, including corticosteroid inhalers, are associated with differences in biological age.

The bivariate associations for smoking (r = 0.22), obesity (r = 0.22), and psychological disorders (r = 0.21) were similar to the associations for established childhood risk factors for accelerated aging such as SES disadvantage (r = 0.29), ACEs (r = 0.22), and poor health (r = 0.25). Although no clinical cutoffs for accelerated biological aging have yet been established, similarities in effect sizes compared with traditional risk factors for biological aging may reflect the inclusion of adolescent-limited asthma in this study, given that previous research found that chronic asthma persisting into adulthood was most relevant to health. Alternatively, asthma was more often managed during the 1980s compared with the other health conditions.

The present study extends this previous work by linking adolescent conditions to direct measures of midlife aging.
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Conflict of Interest Disclosures: Dr Bourassa reported receiving grants from the National Institute on Aging (NIA); Drs Moffitt and Caspi reported receiving grants from the NIA, UK Medical Research Council, and Jacobs Foundation during the conduct of the study. No other disclosures were reported.

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