



Early View

Original article

Patterns and determinants of exhaled nitric oxide trajectories in schoolchildren over a 7-year period

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Please cite this article as: Garcia E, Zhang Y, Rappaport EB, *et al.* Patterns and determinants of exhaled nitric oxide trajectories in schoolchildren over a 7-year period. *Eur Respir J* 2020; in press (<https://doi.org/10.1183/13993003.00011-2020>).

This manuscript has recently been accepted for publication in the *European Respiratory Journal*. It is published here in its accepted form prior to copyediting and typesetting by our production team. After these production processes are complete and the authors have approved the resulting proofs, the article will move to the latest issue of the ERJ online.

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Title

Patterns and determinants of exhaled nitric oxide trajectories in schoolchildren over a 7-year period

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Take home message of paper

Longitudinal $F_{E}NO_{50}$ trajectories in healthy children ages 8-16 displayed a similar upward trend in males and females until age 11.5, after which males had higher $F_{E}NO_{50}$. Males with higher starting BMI percentile had attenuated $F_{E}NO_{50}$ slopes in age.

ABSTRACT

Fractional exhaled nitric oxide ($F_{E}NO_{50}$), a marker of allergic airway inflammation, is used in respiratory research and asthma clinical care; however, its trajectory with increasing age during childhood has not been well characterized. We examined $F_{E}NO_{50}$ longitudinally during a period of important somatic growth to describe trajectories across childhood and adolescence in healthy participants and evaluate clinical factors as potential determinants of trajectories.

$F_{E}NO_{50}$ was collected at six visits over eight years in a population-based cohort of 1791 schoolchildren without asthma (median age at entry 8.4). Smooth sex-specific $F_{E}NO_{50}$ trajectories were estimated using generalized additive mixed models, with participant-level random effects. We evaluated whether sex-specific trajectories were influenced by race/ethnicity, BMI percentile, allergic rhinitis, or puberty.

Different $F_{E}NO_{50}$ patterns were observed by sex in later childhood and several factors were associated with either $F_{E}NO_{50}$ level or change in $F_{E}NO_{50}$ as participants aged. $F_{E}NO_{50}$ -age trajectories were similar by sex until age ~11.5, after which males had greater $F_{E}NO_{50}$ change than females. This divergence in $F_{E}NO_{50}$ -age trajectories coincides with puberty. Males with higher starting BMI percentile had attenuated $F_{E}NO_{50}$ -age slopes. Among males, $F_{E}NO_{50}$ levels were lower in non-Hispanic Whites. Among both sexes, participants with rhinitis had higher $F_{E}NO_{50}$. $F_{E}NO_{50}$ levels within individuals tracked over time; however, there was considerable variation in $F_{E}NO_{50}$ patterns across participants.

$F_{E}NO_{50}$ trajectories from longitudinal data provide evidence of sex differences coinciding with puberty, suggesting potential hormone link. Improved understanding of determinants of $F_{E}NO_{50}$ trajectories is needed to realize the potential for using individualized predicted $F_{E}NO_{50}$ trajectories.

Key words:

Adolescence, breath test, $F_{E}NO_{50}$, pediatric, reference value

Introduction

There is increasing evidence of the utility of fractional exhaled nitric oxide ($F_{E}NO_{50}$)—a noninvasive biomarker of allergic airway inflammation—for research, patient management of asthma treatment and in providing supporting evidence for asthma diagnosis [1-4]. Examining trends with age in $F_{E}NO_{50}$ among healthy children during this critical period of growth as well as the impact of clinical factors such as sex, race/ethnicity, and allergic disease may enhance the utility of $F_{E}NO_{50}$ in clinical and research settings.

Prior studies of the distribution and determinants of $F_{E}NO_{50}$ in healthy pediatric populations were based on single cross-sectional measurements among children across a range of ages [5-11] which may have missed important patterns in $F_{E}NO_{50}$ change as children grow. Serial measurements within the same set of children as they age is likely to be more informative for understanding trajectory of $F_{E}NO_{50}$ across childhood and adolescence as well as potential determinants of this evolution.

Furthermore, during childhood and adolescence there is an important epidemiological shift in the rates of allergic diseases, including asthma and allergic rhinitis, with higher rates among males during childhood, then in adolescence rates are higher among females—a reversal that maybe puberty related [12-14]. A better understanding of $F_{E}NO_{50}$ trajectories coinciding with the timing of this transition is needed for improved use of $F_{E}NO_{50}$ in research and clinical medicine.

The aim of this study was to examine $F_{E}NO_{50}$ trajectories across childhood and adolescences in a unique data resource of healthy children from the Southern California Children's Health Study (CHS) with serial $F_{E}NO_{50}$ measurements during a period of rapid somatic growth, ages 8-16 years. We investigate sex-specific $F_{E}NO_{50}$ trajectories as a function of age and height, and evaluate potential determinants of $F_{E}NO_{50}$ trajectories including race/ethnicity, body mass index (BMI), allergic rhinitis, and puberty.

Material and methods

Study design and study population

This study was performed within a cohort of the population-based CHS, described in detail previously [15]. Briefly, in 2002-2003, a prospective cohort of children primarily aged 6-7 years was enrolled from kindergarten and first grade public school classrooms from 13 communities. Follow-up for

F_ENO₅₀ began in study year 3. Ethical approval of the protocol was obtained from the University of Southern California Institutional Review Board (approval # HS-13-00150, continuing review date April 17, 2019). Informed consent was obtained from a parent or guardian at first and follow-up visits through 2007-2008, and informed assent was obtained from each child at visits after 2008.

Because the study aim was to examine F_ENO₅₀ trajectories in healthy children, we excluded participants with any history of asthma based on all study questionnaire data (n=618). We sequentially excluded F_ENO₅₀ measurements conducted when height was not recorded (29 observations), or the participant had reported respiratory infection within the past 3 days (389 observations), or the participant had reported personal smoking within the last month (56 observations). These last eligibility criteria excluded that year's F_ENO₅₀ measurements and not the participants themselves, who could contribute F_ENO₅₀ measurements in years when they met eligibility criteria for F_ENO₅₀ measurements. The final study population consisted of 1791 healthy children with 7185 F_ENO₅₀ measurements.

Measurement of Exhaled Nitric Oxide

F_ENO₅₀ assessment in the CHS has been described in detail previously [16-18]. Briefly, F_ENO₅₀ was collected at schools using an offline breath collection technique in years 3-4 at 100 mL/s flow using Sievers sampling kits and analyzed with a Sievers Model 280i NO analyzer, and online using ECO MEDICS CLD-88-SP instruments (with DeNO_x) at 50mL/s flow during years 5, 6, 8, and 10 following manufacturers' instructions and professional societies guidelines [19, 20] (Table 1; additional details in eMethods). Offline F_ENO₅₀ values were converted to online values at 50mL/s using a prediction model developed internally ($R^2 = 0.94$) from a pilot study including concurrent offline and online measurements among 362 schoolchildren in 2006-2007 [17]. Prediction model inputs included offline F_ENO₅₀, ambient NO, and lag time before analysis [17]. Model-predicted online F_ENO₅₀ estimates produced results similar to observed online F_ENO₅₀ measures in analysis of school and age differences [17].

Covariate assessment

Parents/guardians completed written questionnaires at first and follow-up visits (children responded beginning year 8 when they were aged 13.5 years (standard deviation (SD):0.63) providing

information on child's sex, race/ethnicity, date of birth, allergic rhinitis, and history of doctor-diagnosed asthma. Ever reported allergic rhinitis at year 3 was defined based on responses to the questions "has your child ever/in the past 12 months had a problem with sneezing or a runny or blocked nose, when he/she did not have a cold or the 'flu?'" and "in the past 12 months, has this nose problem been accompanied by itchy-watery eyes?" We categorized a positive response to both questions as "allergic rhinitis." Children were classified as having asthma if it was reported on any questionnaire that a doctor had "ever diagnosed this child as having asthma." Reported respiratory infection within the past 3 days was based on questionnaire data from parents (through year 6) or participants (years 8 and 10). Starting year 6, children were asked about personal smoking (cigarettes or anything else) [15, 18]. Height and weight measurements were used to calculate age- and sex-specific BMI percentiles (BMI%) from the Centers for Disease Control and Prevention growth charts [21]. Height velocity was calculated as the difference in height divided by the difference in age between consecutive annual study visits. Age at peak height velocity—a proxy for puberty [22]—was then determined and subsequently categorized as "early" or "late" based on sex-specific median.

Statistical analysis

$F_E\text{NO}_{50}$ values are right skewed. Therefore, unless otherwise specified, we performed analyses with natural log-transformed $F_E\text{NO}_{50}$ ($\log F_E\text{NO}_{50}$), with results presented using back-transformed values. Analyses were stratified by sex *a priori*, based on reported differences in $F_E\text{NO}_{50}$ between male and female children [5].

Descriptive analyses present study population characteristics and describe sex-specific associations of these characteristics with year 3 $F_E\text{NO}_{50}$ in the subset of $n=1429$ participants with available $F_E\text{NO}_{50}$ and with percent change in $F_E\text{NO}_{50}$ from year 3 (median age 8.4 years [interquartile range [IQR]: 7.9-8.9) to year 10 (median age 15.3 years [IQR:14.7-15.8]) in the subset of $n=681$ children with $F_E\text{NO}_{50}$ measured in both years. Percent change relates the geometric mean of $F_E\text{NO}_{50}$ at year 10 to the geometric mean of $F_E\text{NO}_{50}$ at year 3 (i.e., exponentiated mean difference in $\log F_E\text{NO}_{50}$ from year 3 to 10). We evaluated statistical significance of differences between categorical covariates for year 3 $F_E\text{NO}_{50}$ using one-way analysis of variance and for year 3 to 10 $F_E\text{NO}_{50}$ percent change using a non-parametric Kruskal-Wallis test. To quantify the correlation of repeated, longitudinal measurements of

$\log F_{E}NO_{50}$ in participants over the 8-year period, we calculated intraclass correlation coefficients (ICC).

Sex-specific $F_{E}NO_{50}$ trajectories as function of age and/or height were modeled by fitting generalized additive mixed models [23, 24], with a participant-level random intercept and random slope on age (or on height for height-only model), to all available data on the 1791 participants using the R package ‘mgcv’ [24]. Smooth functions of only height or only age were fitted using a penalized regression spline [24]. A joint smooth function of age and height was fitted using a penalized tensor product smooth [24]. Next, using data on 1717 participants with complete year 3 BMI%, we evaluated whether sex-specific age trajectories were influenced by: (a) year 3 BMI%, (b) race/ethnicity (Hispanic, White/non-Hispanic, other (includes missing)), or (c) year 3 ever reported allergic rhinitis (yes, no, missing), using parameterizations that allowed for quantification of age interactions (see online supplement eMethods). Based on statistical significance in bivariate analyses, final models for $F_{E}NO_{50}$ -age trajectories were then developed. Lastly, we stratified final models by dichotomized (early or late) age at peak height velocity as a proxy for puberty. Sensitivity analysis included analyses: (i) with height instead of age trajectories, (ii) with time-varying BMI% collected over follow-up instead of year 3 BMI%, (iii) restricted to 1062 children who never reported allergic rhinitis through year 10, (iv) restricted to 1526 children who never reported wheeze or whistling in the chest through year 10, and (v) restricted to online $F_{E}NO_{50}$ measurements only. All statistical analyses were performed using R 3.5.1 [25].

Results

Participants’ mean age was 8.4 years (SD: 0.65) in study year 3, the initial year of $F_{E}NO_{50}$ follow up. In year 3 (n=1429), geometric mean $F_{E}NO_{50}$ was 10.6 parts per billion (ppb) (geometric SD: 1.84), with no difference by sex (p=0.90). Median follow-up time from first to last $F_{E}NO_{50}$ measurement was 5.2 years (interquartile range: 2.0-6.8) and 46.6% of participants had 5 or 6 $F_{E}NO_{50}$ measurements (mean: 4.0; Table E1). See Figure E1 for example trajectories. The ICC was 0.57 for males and 0.59 for females, indicating moderately strong within-participant correlation of $F_{E}NO_{50}$. $F_{E}NO_{50}$ generally increased from year 3 to 10. Percent change in $F_{E}NO_{50}$ from year 3 to 10 in the n=681 children with available data, was higher in males than females (53.2% vs 14.4%, respectively,

$p < 0.001$). There were no statistically significant differences in covariate distributions between participants with and without year 10 data (Table E1).

In descriptive analyses, determinants of year 3 $F_{E}NO_{50}$ were different from determinants of $F_{E}NO_{50}$ change from year 3 to 10 as shown in Tables 2a (males) and Table 2b (females). In year 3, $F_{E}NO_{50}$ was statistically significantly different by race/ethnicity for males and by age and allergic rhinitis for females. From year 3 to 10, there was modest evidence for differences in percent change in $F_{E}NO_{50}$ by year 3 BMI% in males ($p = 0.07$), with an attenuated increase in $F_{E}NO_{50}$ for those with higher year 3 BMI%. Among females, percent change in $F_{E}NO_{50}$ differed by age and height in year 3, with larger $F_{E}NO_{50}$ change among those younger or shorter in year 3.

Estimates of population-averaged sex-specific trajectories of $F_{E}NO_{50}$ by age and/or height ($n = 1791$) are displayed in Figure 1 and summarized in Table E2. As a function of age, estimated geometric mean $F_{E}NO_{50}$ at age 8 was similar by sex (10.6 and 10.7 ppb for males and females, respectively) and the nonlinear $F_{E}NO_{50}$ trajectory was similar by sex through approximately age 11.5. After age 11.5, males tended to have a larger increase in $F_{E}NO_{50}$ than females. By age 15, predicted geometric mean $F_{E}NO_{50}$ for an average male was 16.5 (95%CI: 15.4, 17.6) ppb and for an average female 12.6 (11.9, 13.4) ppb. This translates to an increase from age 8 to 15 of 54.9% (44.8, 65.8) for the average male and 17.8% (11.0, 25.0) for the average female. As a function of height, $F_{E}NO_{50}$ trajectory for an average child was nearly linear for males and nonlinear, with a shallower slope for females. When considering joint smooths of age and height, there was evidence of an interaction (Figure 1c-d, Table E2). For example, for females (Figure 1d) the positive association between age and $F_{E}NO_{50}$ was attenuated for taller younger females (approximately height > 140 cm, age < 13) and negative for taller older females (approximately height > 140 cm, age ≥ 13).

There was considerable between-participant heterogeneity (i.e., nonuniformity) as shown in the participant-specific predicted trajectories (Figure 2). To put estimated random intercept SDs into context (males: 0.50; females: 0.47 (log $F_{E}NO_{50}$ scale)), estimated average $F_{E}NO_{50}$ for males at age 8 was 10.6 ppb, but with a 95% CI that ranged from 4.0 ppb to 28.2 ppb ($\exp(2.36 \pm 1.96 * 0.50)$).

Subsequent “tracking” of participant-specific predicted trajectories is apparent in Figure 2, with participants with high (or low) $F_{E}NO_{50}$ at start of follow up generally having high (or low) $F_{E}NO_{50}$

through end of follow up. There was also considerable heterogeneity in the random slopes on age (SD: males: 0.051; females: 0.052). For context, linear mixed effects models assuming a linear (rather than smooth) trajectory of $\log F_{E}NO_{50}$ in age had population average slopes on age of 0.061 for males and 0.022 for females.

The estimated sex-specific age trajectories of $F_{E}NO_{50}$ by categories of sex, race/ethnicity, and allergic rhinitis, and year 3 BMI% (n=1717) are displayed in Figure 3 and summarized in Tables 3 and E3.

The only covariate that significantly modified the average $F_{E}NO_{50}$ -age trajectory (i.e., $F_{E}NO_{50}$ change from age 8 to 16 years) was year 3 BMI% in males. Males with higher year 3 BMI% had a lower rate of $F_{E}NO_{50}$ increase than males with lower BMI (interaction $p=0.009$) as demonstrated in Figures 3 and E3c-d. Year 3 allergic rhinitis in both sexes and race/ethnicity in males shifted the intercept of, but did not modify, $F_{E}NO_{50}$ -age trajectories. At any given age, children reporting allergic rhinitis ever in year 3 had higher $F_{E}NO_{50}$ ($p<0.001$) and $F_{E}NO_{50}$ was higher for males in the “Other” race/ethnicity group (composed of Black, Asian, other and missing) than in the Hispanic group ($p=0.02$).

Finally, we estimated sex-specific models including the joint smooth function of age and year 3 BMI% and main effects of race/ethnicity and year 3 allergic rhinitis. Associations were similar to those reported in models including one covariate at a time (Table 3). Predictions for participants with selected covariate values are provided in Table E4 to demonstrate the range of $F_{E}NO_{50}$ values and rates of change over time. Despite statistically significant evidence for covariate associations with $F_{E}NO_{50}$ levels and trajectories, inclusion of the three covariates in the final model did not considerably reduce the SD of the random intercept (males: 0.49; females: 0.47) or random slope (males: 0.049; females: 0.052), nor did it improve model fit based on Bayesian Information Criterion (BIC) (Table E3).

Analyses stratifying $F_{E}NO_{50}$ trajectories by age at peak height velocity reduced the sample size to 611 participants due to insufficient height data needed to identify age at peak height velocity; sex-specific $F_{E}NO_{50}$ -age trajectories, however, were similar in this subset compared with the full study population (Figure E2). Separation in $F_{E}NO_{50}$ trajectories between males and females occurred at younger ages among children with early age at peak height velocity and at older ages among children with late age at peak height velocity (Figure 4 and Table E5).

The main findings of diverging $F_{E}NO_{50}$ trajectories between males and females in later childhood and attenuated $F_{E}NO_{50}$ trajectory slopes for males with higher year 3 BMI% were robust in sensitivity analyses (trajectories in height rather than age, Table E6 and Figure E3; trajectories in age using time-varying BMI% instead of year 3 BMI%, Figure E4; trajectories in age in children without allergic rhinitis, Figures E5-E6; trajectories in age in children without wheeze or whistling in the chest, Figures E7-E8; and restricting to online $F_{E}NO_{50}$ measurements, Figures E9-E10). Although year 3 BMI% did not reach statistical significance as a modifier of $F_{E}NO_{50}$ trajectories when restricting to online $F_{E}NO_{50}$ measurements, the patterns observed by year 3 BMI% was similar for the overlapping ages in the two analyses (~10 to ~16). Additionally, we further excluded $F_{E}NO_{50}$ observations with reported respiratory infection in the last month and results were not markedly different (data not shown).

Discussion

Using repeated $F_{E}NO_{50}$ measurements from a large, population-based sample of healthy children during a period of prepubescent/pubescent growth (median starting age 8.4 years through median age at end of follow up 15.3 years), we report longitudinal evidence that on average $F_{E}NO_{50}$ increased nonlinearly with age, with larger increases in males than females at older ages. Interestingly, when stratified by early or late age at peak height velocity, this departure in $F_{E}NO_{50}$ trajectories between the sexes shifted to younger or older ages coinciding with early/late estimated timing of puberty.

Additionally, males with higher year 3 BMI% had attenuated $F_{E}NO_{50}$ slopes in age and race/ethnicity in males and year 3 allergic rhinitis in both sexes affected $F_{E}NO_{50}$ level but did not have impact on $F_{E}NO_{50}$ trajectories. We also observed considerable unexplained variation in $F_{E}NO_{50}$ level and $F_{E}NO_{50}$ change across age between children (large SD of random intercept and slope).

Longitudinal trends in $F_{E}NO_{50}$ among children as they age observed in this study confirm reports of age association from previous cross-sectional studies in children and adolescents [5, 7, 10, 26].

Combining both sexes, linear increases in $F_{E}NO_{50}$ were reported by Buchvald et al. over ages 4-17 [7] and Yao et al. over ages 5-18 [26], while Jacinto et al. reported linear increases in $F_{E}NO_{50}$ through 14.1 years old in females and 15.7 years in males, after which point $F_{E}NO_{50}$ levels plateaued until late middle age [5]. Brody et al. reported no difference in $F_{E}NO_{50}$ levels for males and females ages 6-11

years, but at ages 12-19 females had lower $F_{E}NO_{50}$ levels than males [10]. The $F_{E}NO_{50}$ levels reported here are slightly larger compared with these earlier studies, but this may be due in part to the large percentage (69%) of non-White participants (see discussion below regarding race/ethnicity and $F_{E}NO_{50}$). Overall, these earlier studies are generally consistent with our findings that males and females have similar $F_{E}NO_{50}$ trajectories until early adolescence, after which males exhibit continued increases while females appear to plateau. Somatic growth and the increase in anatomic dead space volume may be a biological rationale for increases in $F_{E}NO_{50}$ with age and differences between males and females in later childhood [5]. Development and growth of the bronchial tree leads to larger total airway mucosal surface area available for NO diffusion, thus higher $F_{E}NO_{50}$ [5]. Potential impacts of alveolar growth on $F_{E}NO_{50}$ trajectories could be investigated in future studies of alveolar versus airway NO concentrations [27, 28]. Although we did not have data on pubertal staging for participants, we were able to use a proxy for puberty—age at peak height velocity—to assign children as either early or late “maturers.” Timing of divergence between the sexes in $F_{E}NO_{50}$ trajectories corresponded with this estimate of early versus late onset of puberty. Sex hormones have been suggested by animal studies to be involved in mechanisms of lung inflammation and asthma [29], with ovarian hormones found to increase and testosterone found to decrease airway inflammation in asthma; however, there are discrepancies between experimental and epidemiologic studies [14]. The mechanism by which puberty may affect $F_{E}NO_{50}$ trajectories is unclear but may shed light on sex differences trends in asthma and other allergic diseases.

With these longitudinal data, we were able to observe differences in $F_{E}NO_{50}$ slopes by BMI% among male children, with participants with higher year 3 BMI% having attenuated $F_{E}NO_{50}$ slopes which persisted after controlling for race/ethnicity and year 3 allergic rhinitis. Differences in slope are primarily observed in earlier ages (8-10 years). This pattern was observed both for year 3 BMI% and time-varying BMI%. Previous studies have found no association between $F_{E}NO_{50}$ in children and weight [6-8], body surface area [8], or BMI [7, 10, 30], with exception of a reported negative association with BMI z-score, primarily in atopic children [31] and weak positive correlation for body surface area [7]. BMI%, which is considered in the present study, may better represent being under/over-weight at a given age and sex. Furthermore, the longitudinal associations we examined—

the impact of prepubescent BMI% on $F_{E}NO_{50}$ trajectory during adolescence—may differ from cross-sectional associations. A recent study found individuals with higher BMI to have greater adipose tissue area within airway walls and greater airway wall thickness [32]. This structural change in the airways could potentially impact airway NO production/diffusion as well as $F_{E}NO_{50}$ measured at the mouth.

We also observed an association between allergic rhinitis and $F_{E}NO_{50}$, which is supported by the literature [7, 8, 33, 34], although some studies report no association [6]. Some studies of $F_{E}NO_{50}$ in healthy children exclude those with reported rhinitis [34], but results were similar in our sensitivity analyses excluding children with allergic rhinitis.

Non-Hispanic white males had lower $F_{E}NO_{50}$ levels across age compared with Hispanic and all other race males. Similar patterns were observed for females, but results did not reach statistical significance. Evidence from cross-sectional studies supports an association between race/ethnicity and $F_{E}NO_{50}$. A 2017 review reported that among eight studies with children, seven found race/ethnicity to be a significant influencing factor for $F_{E}NO_{50}$, with six observing higher $F_{E}NO_{50}$ levels in the non-Caucasian ethnic groups (including African American, Hispanic, and Asian) compared with Caucasian levels [35]. Higher $F_{E}NO_{50}$ has been reported in non-Hispanic blacks and Hispanics compared to non-Hispanic whites among children in the U.S. aged 6-19 years [10]. In a separate study, non-Caucasian subjects (African American, Asian, and Hispanic subjects) had higher $F_{E}NO_{50}$ compared with Caucasian subjects, but this difference was only borderline significant after controlling for age, sex, and self-reported atopy [7]. Whether differences are driven by genetic versus contextual factors is unclear and warrants further investigation.

This study has limitations. First, the age range is limited thus it is unclear whether differences between males and females persist into early adulthood. Second, due to budgetary constraints $F_{E}NO_{50}$ assessments were conducted every two years in years 6-10; however, because there was a range of ages at study entry inference regarding $F_{E}NO_{50}$ trajectory in early and mid-teenage years are well-supported by the data. Third, the first two years of $F_{E}NO_{50}$ data (years 3 and 4) were collected using offline methods, while $F_{E}NO_{50}$ data for the remainder of the study (years 5-10) were collected using online methods. Although offline $F_{E}NO_{50}$ measurement were converted to online values based on a

published internally-developed prediction model with an $R^2 = 0.94$ [17], there remains a possibility that this change in breath collection technique during the study could influence $F_{E}NO_{50}$ trajectories in age, especially for estimated trajectories around ages 9-10 years when the change in collection method occurred which coincides with an apparent attenuate in $F_{E}NO_{50}$ slope. However, in sensitivity analyses restricted to online $F_{E}NO_{50}$ measurements, patterns in $F_{E}NO_{50}$ trajectories, including the divergence between the sexes in later childhood, were similar to those in the main analysis, although the attenuation in slope around ages 9-11 years was less evident and remained only for males. The only other difference was in the findings for year 3 BMI%, which is likely due to lack of data in younger ages—the age period when $F_{E}NO_{50}$ slope was most different by BMI% in the main analysis. Fourth, guidelines have been updated after the conclusion of data collection, but these would not have substantively impacted our $F_{E}NO_{50}$ collection protocol [36]. Last, an objective measure of atopy (e.g., skin prick test, IgE sensitization) was not available and we instead relied on questionnaire assessment of allergic rhinitis. IgE sensitization may be present without obvious symptoms and may still cause increased $F_{E}NO_{50}$ but would not have been captured by our classification of allergic rhinitis. Without such data we were unable to investigate the potential for effect modification by atopy.

This study has several strengths. First, we leveraged a large unique longitudinal data resource to be the first study to use serial measurements to examine $F_{E}NO_{50}$ -age trajectories in healthy children. Second, $F_{E}NO_{50}$ trajectories are investigated during an important period of growth for children. Last, the study population is diverse, with over 50% Hispanic, allowing for identification of racial/ethnic differences in $F_{E}NO_{50}$ -age trajectories.

In conclusion, we reported novel longitudinal evidence for nonlinear trajectories of $F_{E}NO_{50}$ in healthy children followed from ages ~8 to ~15 years, with differences in trajectories by sex coinciding with puberty and prepubescent BMI%, and differences in level by allergic rhinitis and race/ethnicity. The considerable remaining unexplained between-child variability in trajectories highlights the limitations of fixed $F_{E}NO_{50}$ reference values. As such, our results are not intended as reference growth curves, but to provide information on population average $F_{E}NO_{50}$ trajectories in healthy children during a period of growth. However, the moderately strong within-participant correlation of $F_{E}NO_{50}$ over an 8-

year period suggests that tracking personalized $F_{E}NO_{50}$ measurements over time (to exploit this high within-participant correlation) may maximize the clinical utility of $F_{E}NO_{50}$ measurements [37, 38].

Acknowledgements

We thank the participating students and their families, the school staff and administrators, and the study field team for their efforts.

Funding

This work was supported by the National Heart, Lung and Blood Institute (grants R01HL61768 and R01HL76647); the Southern California Environmental Health Sciences Center (grant P30ES007048) funded by the National Institute of Environmental Health Sciences; the Children's Environmental Health Center (grants P01ES009581, R826708-01 and RD831861-01) funded by the National Institute of Environmental Health Sciences and the Environmental Protection Agency; the National Institute of Environmental Health Sciences (grants P01ES011627, R01ES023262, R01ES027860, and T32ES013678); the James H. Zumberge Research and Innovation Fund, and the Hastings Foundation.

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Figure Legends

Figure 1. Population-averaged sex-specific trajectories of fractional exhaled nitric oxide ($F_E\text{NO}_{50}$) (solid lines) (N=851 males, N=940 females) and 95% Confidence Intervals (dashed lines) modeled as a: (a) smooth function of age only, (b) a smooth function of height only, or a joint smooth of age and height for males (c) or females (d). In panels (c-d), the contour lines labels refer to predicted geometric mean $F_E\text{NO}_{50}$ in ppb. Analyses performed using $\log F_E\text{NO}_{50}$ with results here presented using back-transformed values on an axis scaled using natural log.

Figure 2. Participant-specific predicted trajectories of fractional exhaled nitric oxide ($F_E\text{NO}_{50}$), modeled as a smooth function of age, for 40 randomly selected males and 40 randomly selected females. Analyses performed using $\log F_E\text{NO}_{50}$ with results here presented using back-transformed values on an axis scaled using natural log. The population average predictions (identical to Figure 1a) are plotted with a heavy black line.

Figure 3. Modeled sex-specific trajectory of fractional exhaled nitric oxide ($F_E\text{NO}_{50}$) (N=809 males, N=908 females) as a joint smooth of age and year 3 body mass index percentile or as smooths of age that vary by race/ethnicity or ever reported allergic rhinitis in year 3. Analyses performed using $\log F_E\text{NO}_{50}$ with results here presented using back-transformed values on an axis scaled using natural log.

Figure 4. Modeled sex-specific trajectory of fractional exhaled nitric oxide ($F_E\text{NO}_{50}$) (N=288 males, N=323 females) as a joint smooth of age that vary by early (solid line) or late (dashed line) age at peak height velocity for males (blue) and females (yellow). Sex-specific models including a joint smooth of age and year 3 body mass index percentile by category of age at peak height velocity and adjustments for race/ethnicity and year 3 allergic rhinitis status. Grey bars at bottom is histogram of age.

Tables

Table 1. Study design information including type and number of $F_E NO_{50}$ measurements and average participant age over the study period. Over the entire study period 1791 children contributed $F_E NO_{50}$ measurements.

Study Year	1	2	3*	4	5	6	8	10
Calendar Years	2002-03	2003-04	2004-05	2005-06	2006-07	2007-08	2009-10	2011-12
$F_E NO_{50}$ measure type	None		Offline		Online			
Participants with $F_E NO_{50}$ data (N)			1429	1498	1364	1100	938	856
Mean age (years)			8.4	9.3	10.3	11.4	13.5	15.3

No $F_E NO_{50}$ data collected study years 1 and 2.

No follow-up, $F_E NO_{50}$ or otherwise, conducted in study years 7 (2008-09) or 9 (2010-11)

*The start of follow up for the current study

Table 2a. For males, participant characteristics at year 3 and associations with fractional exhaled nitric oxide ($F_{E}NO_{50}$) or percent change in $F_{E}NO_{50}$ over approximately 7 years.

Year 3 Characteristic	Year 3 $F_{E}NO_{50}$ (N=672)				% Change in $F_{E}NO_{50}$, year 3 to 10 (N=318)			
	N	(%)	Geometric mean	p- value*	N	(%)	Estimate	p- value†
Age, years				0.178				0.749
7	48	(7%)	9.2		25	(8%)	60.4	
8	313	(47%)	10.3		144	(45%)	52.1	
9	276	(41%)	11.0		133	(42%)	56.5	
10	35	(5%)	11.6		16	(5%)	26.8	
Height, cm				0.140				0.816
≤125	129	(19%)	9.9		50	(16%)	56.7	
(125, 130]	168	(25%)	10.9		73	(23%)	46.1	
(130, 135]	205	(31%)	10.1		114	(36%)	60.7	
>135	170	(25%)	11.4		81	(25%)	47.2	
BMI percentile				0.957				0.067
0-15	41	(6%)	10.4		22	(7%)	45.6	
15-85	359	(53%)	10.7		169	(53%)	68.2	
85-95	122	(18%)	10.6		61	(19%)	44.5	
95+	150	(22%)	10.4		66	(21%)	29.3	
Race/ethnicity				<0.001				0.468
Hispanic	386	(57%)	11.0		177	(56%)	62.9	
White/non-Hispanic	226	(34%)	9.5		115	(36%)	48.2	
Black	12	(2%)	10.4		4	(1%)	67.0	
Asian	27	(4%)	18.1		11	(3%)	28.4	
Other	19	(3%)	8.0		10	(3%)	72.2	
Missing	2	(0.3%)	17.1		1	(0.3%)	-35.4	
Ever reported allergic rhinitis				0.109				0.779
No	380	(57%)	10.2		180	(57%)	51.2	
Yes	193	(29%)	11.5		94	(30%)	57.7	
Missing	99	(15%)	10.3		44	(14%)	51.5	

* Analysis of variance (ANOVA) F-test (excluding missing categories, if applicable)

† Kruskal-Wallis test, a non-parametric alternative to ANOVA (excluding missing categories, if applicable)

Table 2b. For females, participant characteristics at year 3 and associations with fractional exhaled nitric oxide ($F_{E}NO_{50}$) or percent change in $F_{E}NO_{50}$ over approximately 7 years.

Year 3 Characteristic	Year 3 $F_{E}NO_{50}$ (N=757)				% Change in $F_{E}NO_{50}$, year 3 to 10 (N=363)			
	N	(%)	Geometric mean	p-value*	N	(%)	Estimate	p-value†
Age, years				0.001				0.069
7	65	(9%)	8.7		33	(9%)	34.5	
8	381	(50%)	10.3		179	(49%)	18.6	
9	288	(38%)	11.7		136	(37%)	4.3	
10	23	(3%)	10.0		15	(4%)	22.1	
Height, cm				0.166				0.040
≤125	202	(27%)	10.2		92	(25%)	31.4	
(125, 130]	143	(19%)	11.6		68	(19%)	2.1	
(130, 135]	236	(31%)	10.3		117	(32%)	16.4	
>135	176	(23%)	10.8		86	(24%)	5.6	
BMI percentile				0.962				0.445
0-15	58	(8%)	10.5		21	(6%)	30.3	
15-85	452	(60%)	10.5		223	(61%)	16.1	
85-95	127	(17%)	10.8		64	(18%)	13.5	
95+	120	(16%)	10.8		55	(15%)	3.8	
Race/ethnicity				0.131				0.394
Hispanic	449	(59%)	11.1		203	(56%)	14.2	
White/non-Hispanic	219	(29%)	9.8		114	(31%)	11.4	
Black	14	(2%)	13.0		6	(2%)	8.0	
Asian	31	(4%)	10.6		14	(4%)	44.9	
Other	41	(5%)	9.6		25	(7%)	24.9	
Missing	3	(0.4%)	10.7		1	(0.3%)	102.2	
Ever reported allergic rhinitis				0.022				0.122
No	467	(62%)	10.2		238	(66%)	14.7	
Yes	206	(27%)	11.7		84	(23%)	20.6	
Missing	84	(11%)	10.7		41	(11%)	1.4	

* Analysis of variance (ANOVA) F-test (excluding missing categories, if applicable)

† Kruskal-Wallis test, a non-parametric alternative to ANOVA (excluding missing categories, if applicable)

Table 3. Summary of fitted Generalized Additive Mixed Models that model longitudinal log fractional exhaled nitric oxide ($\log F_{E}NO_{50}$) trajectories as smooth functions of time-varying age and a time-constant covariate plus a participant-level random intercept and random slope on age.

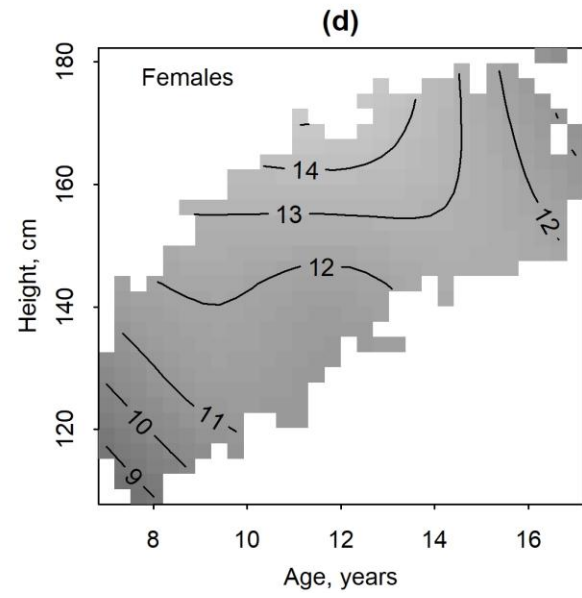
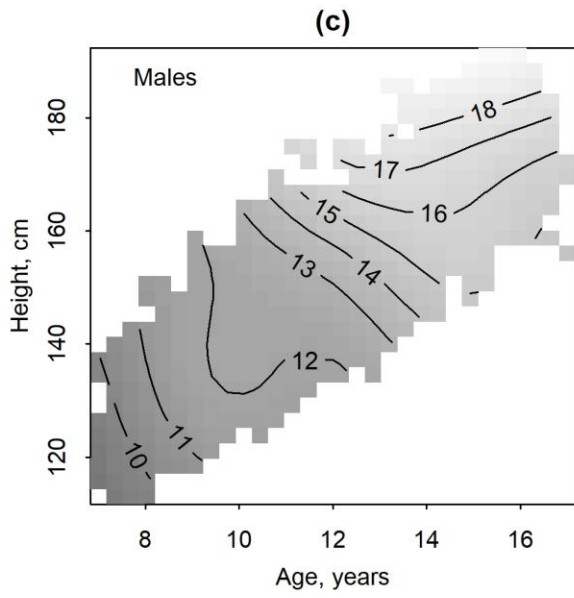
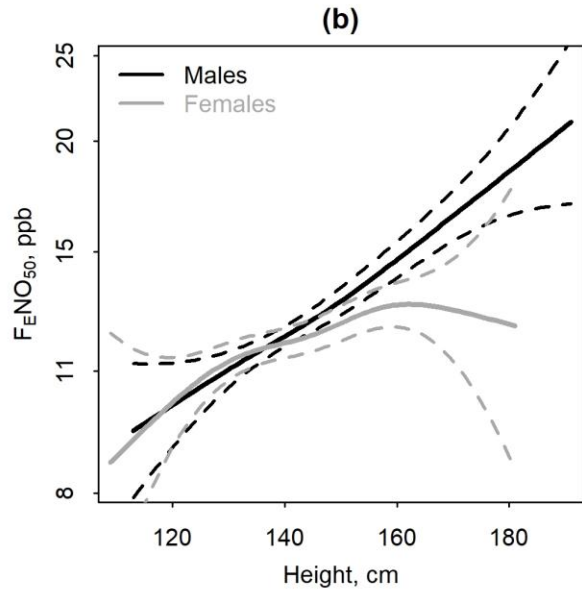
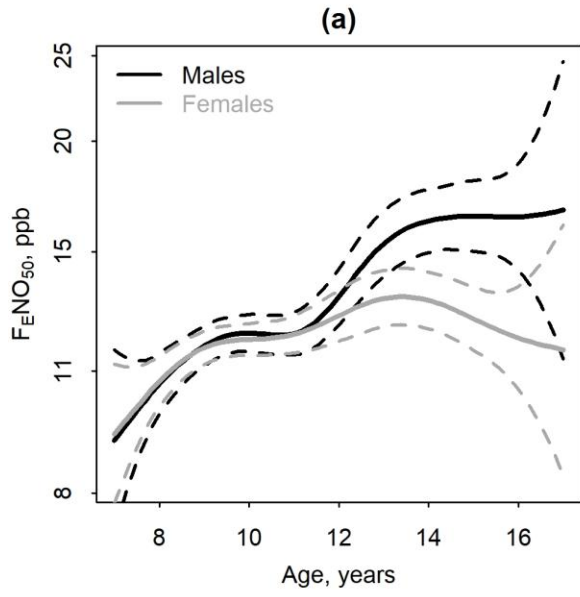
Model	Parameter*	Males (N=809)			Females (N=908)		
		Regression coefficient**	EDF†	p-value	Regression coefficient**	EDF†	p-value
Age only	s(age)		5.6	<0.0001		5.1	<0.0001
	te(age, bmi %)		8.4	<0.0001		7.6	<0.0001
Age and year 3 BMI %	ti(age)		3.8	<0.0001		3.6	<0.0001
	ti(bmi %)		1.0	0.02		1.0	0.43
	ti(age, bmi %)		1.7	0.009		2.7	0.07
Age and race/ ethnicity‡	Intercept	2.55		<0.0001	2.49		<0.0001
	White/non-Hispanic	-0.07		0.11	-0.06		0.13
	Other	0.16		0.02	0.07		0.21
	s(age)		5.4	<0.0001		5.1	<0.0001
	s(age:Hispanic)		1.6	0.13		0.5	0.23
	s(age:White/non-Hisp)		<0.1	0.31		<0.1	0.51
	s(age:Other)		<0.1	0.70		1.2	0.11
Age and ever reported allergic rhinitis at year 3	Intercept	2.50		<0.0001	2.45		<0.0001
	Allergic Rhinitis	0.15		0.001	0.14		0.0005
	Missing	-0.01		0.83	-0.02		0.70
	s(age)		5.5	<0.0001		5.0	<0.0001
	s(age:None)		<0.1	0.40		<0.1	0.62
	s(age:AllergicRhinitis)		2.7	0.07		<0.1	0.51
	s(age:Missing)		1.0	0.16		<0.1	0.74
Full model	Intercept	2.52		<0.0001	2.46		<0.0001
	White/non-Hispanic	-0.10		0.02	-0.07		0.09
	Other	0.13		0.07	0.05		0.35
	Allergic Rhinitis	0.15		0.001	0.15		0.0004
	Missing	-0.02		0.79	-0.03		0.56
	te(age, bmi %)		8.4	<0.0001		7.6	<0.0001
Full model	Intercept	2.52		<0.0001	2.46		<0.0001
	White/non-Hispanic	-0.10		0.02	-0.07		0.10
	Other	0.13		0.07	0.05		0.35
	Allergic Rhinitis	0.15		0.001	0.15		0.0004
	Missing	-0.02		0.79	-0.03		0.57
	ti(age)		3.8	<0.0001		3.6	<0.0001
	ti(bmi %)		1.0	0.01		1.0	0.40
ti(age, bmi %)		1.5	0.02		2.7	0.07	

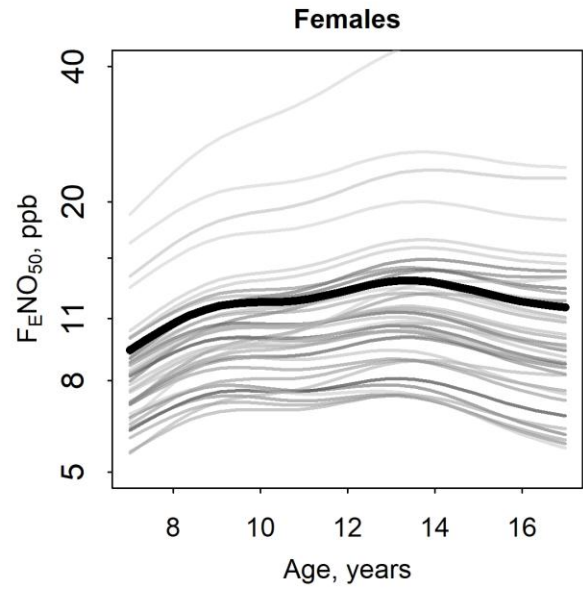
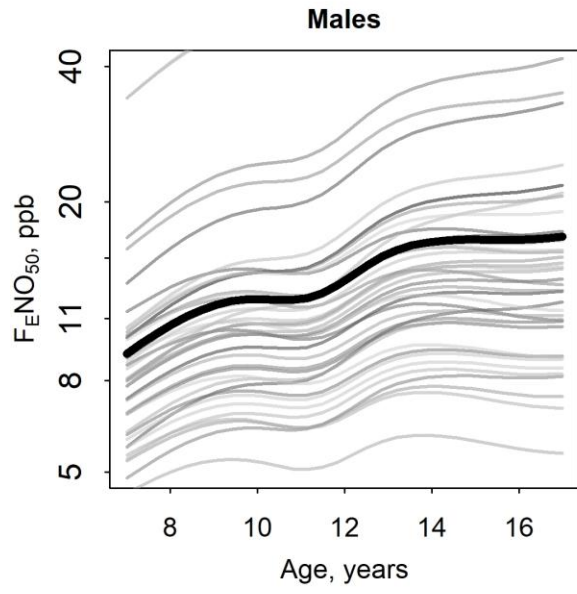
* Smooth terms definitions: s(): penalized regression spline; ti():tensor product interaction; te():tensor product smooth.

** For categorical variables; on $\log F_{E}NO_{50}$ scale

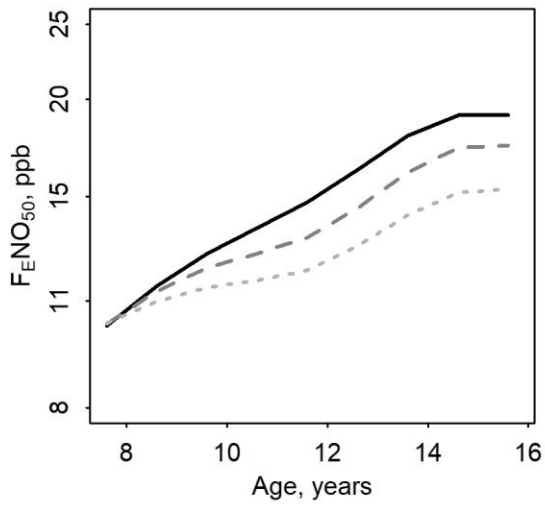
† Effective degrees of freedom (EDF) for the smooth term; a value of 1 indicates a linear effect, higher values indicate a higher degree of non-linearity

‡ k=5 specified in the s(age, by=race, m=1, k=5) term for improved model convergence

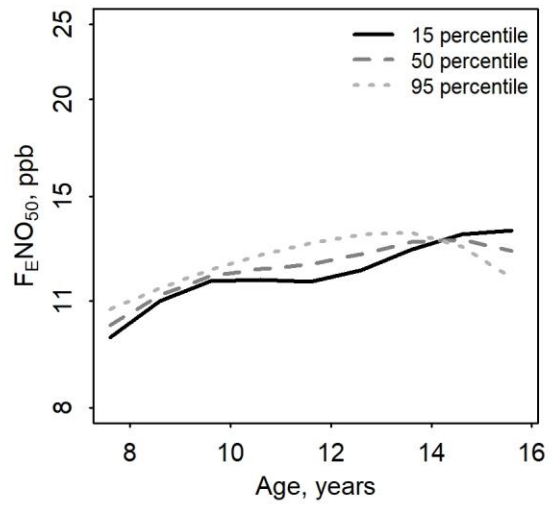




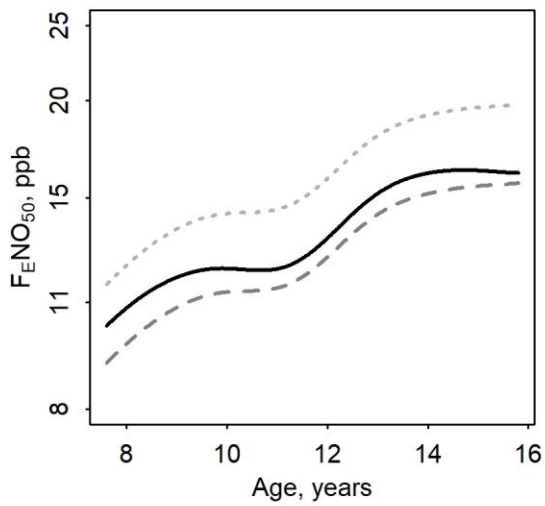
Males by baseline BMI%



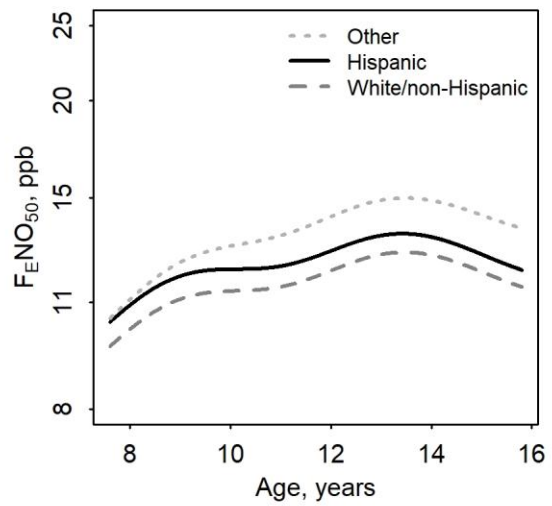
Females by baseline BMI%



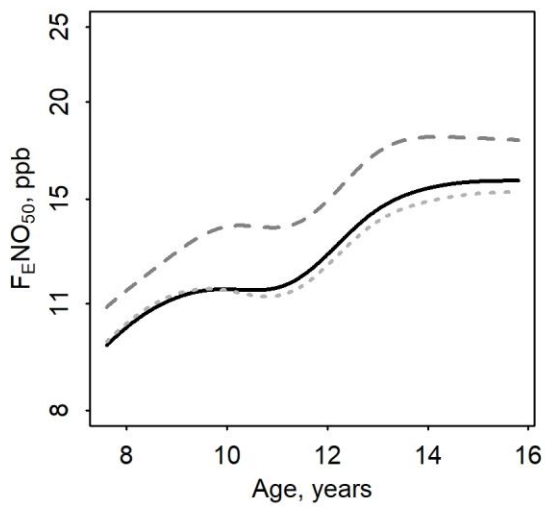
Males by race/ethnicity



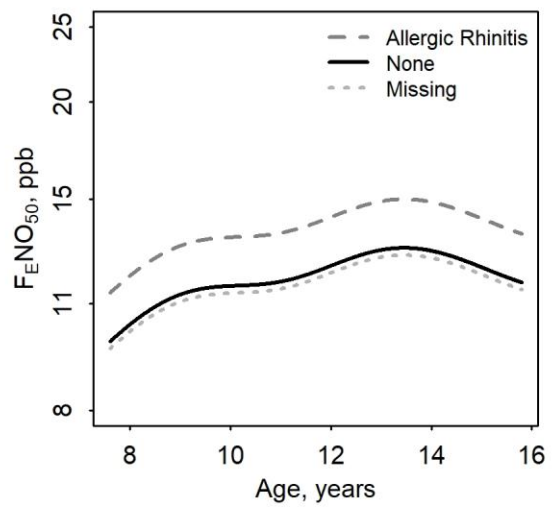
Females by race/ethnicity



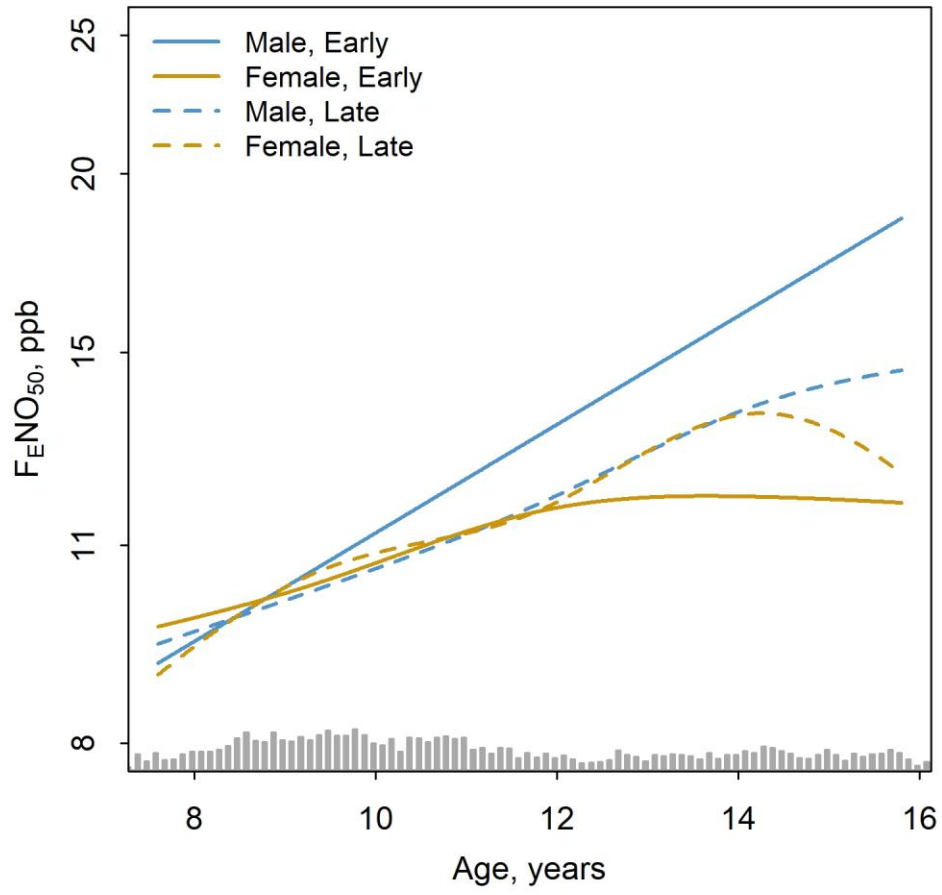
Males by baseline allergic rhinitis



Females by baseline allergic rhinitis



Males and females by age peak height velocity



Supplementary materials for

“Patterns and determinants of exhaled nitric oxide trajectories in schoolchildren over a 7-year period”

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Supplementary references Modeled sex-specific trajectories of $F_{E}NO_{50}$ by clinical factors among participants

eMethods: Additional details on the methods

Measurement of Exhaled Nitric Oxide

In years 5 and 6 five 50mL/s eNO samples were collected per subject and $F_{E}NO_{50}$ was calculated as the mean of the 2-3 most reproducible plateau estimates within 10%. In years 8 and 10 three 50mL/s eNO samples were collected per subject as part of a multiple flow protocol and $F_{E}NO_{50}$ was calculated as the mean of 2-3 plateau estimates within 15%.

Statistical analysis

The intra-class correlation of repeated measurements of $F_{E}NO_{50}$ was calculated using the ratio of between-participant variance to the total variance from sex-specific linear mixed effects models of $\log F_{E}NO_{50}$ with only a random intercept for participant.

Model fit was assessed by the Bayesian Information Criterion (BIC) [1]. Generalized Additive Mixed Models (GAMMs) were estimated using restricted maximum likelihood except when reporting model fit according to the BIC [1] when we refit models using maximum likelihood.

To determine whether there was evidence for a joint smooth with age and year 3 BMI percentile (a continuous variable), we first fit models using a tensor product interaction, an ANOVA-like decomposition of the joint smooth. Given evidence of an interaction ($p < 0.05$) in either sex, we then refit using the standard tensor product smooth which allows for more flexibility in the smooth surface. For categorical variables (race/ethnicity and year 3 ever reported allergic rhinitis), we fit a model with a single common smooth surface for age in addition to “difference” surfaces for age for each level of the categorical variable using the “by” variable approach in `gamm()`. This parameterization of the model permitted testing whether the smooth for a given group was

different from that of the overall population smooth and allows for potentially only one complex smooth surface to be estimated [2]. We imposed a first order penalty (rather than a second order penalty) on the difference smooths for identifiability, encouraging shrinkage to the mean.

Table E1: Distribution of demographic characteristics in full study population and three subsets used in the analyses. N (%), unless otherwise specified.

	Full Study Population	Participants Not Missing Year 3 BMI	Participants Not Missing Year 3 F _E NO ₅₀	Participants Not Missing Year 3 or Year 10 F _E NO ₅₀
Participants	1791	1717	1429 ^a	681 ^b
Total observations	7185	6989	-	-
<i>Observations per participant, median (IQR)</i>	4 (2)	4 (2)	-	-
1	214 (11.9%)	195 (10.9%)		
2	163 (9.1%)	144 (8.0%)		
3	236 (13.2%)	223 (12.5%)		
4	344 (19.2%)	329 (18.4%)		
5	443 (24.7%)	435 (24.3%)		
6	391 (21.8%)	391 (21.8%)		
<i>Sex</i>				
Male	851 (47.5%)	809 (47.1%)	672 (47.0%)	318 (46.7%)
Female	940 (52.5%)	908 (52.9%)	757 (53.0%)	363 (53.3%)
<i>Race</i>				
Hispanic	1072 (59.9%)	1022 (59.5%)	835 (58.4%)	380 (55.8%)
White/non-Hispanic	525 (29.3%)	507 (29.5%)	445 (31.3%)	229 (33.6%)
Black	39 (2.2%)	39 (2.3%)	26 (1.8%)	10 (1.5%)
Asian	75 (4.2%)	73 (4.3%)	58 (4.1%)	25 (3.7%)
Other	71 (4.0%)	69 (4.0%)	60 (4.2%)	35 (5.1%)
Missing	9 (0.5%)	7 (0.4%)	5 (0.3%)	2 (0.3%)
<i>Year 3 covariates</i>				
F _E NO ₅₀ , ppb, median (IQR)	9.7 (7.6)	9.7 (7.6)	9.7 (7.6)	9.7 (7.5)
Missing*	362 (20.2%)	288 (16.8%)	0	0
BMI Percentile, median (IQR)	72.7 (48.7)	72.7 (48.7)	72.7 (48.7)	73.1 (47.4)
Missing*	362 (20.2%)	288 (16.8%)	0	0
Ever reported allergic rhinitis				
No	847 (47.3%)	847 (49.3%)	847 (59.3%)	418 (61.4%)
Yes	399 (22.3%)	399 (22.3%)	399 (27.9%)	178 (26.1%)
Missing*	545 (30.4%)	471 (27.4%)	183 (12.8%)	85 (12.5%)
Related tables/figures	Table E2, Figures 1-2	Tables 2-3, Figure 3	Tables 1a-1b [column 1]	Tables 1a-1b [column 2]

* Counts both participants without a year 3 visit and participants with a year 3 visit but who were missing this variable.

^a Only year 3 data used.

^b Only year 3 and year 10 data used.

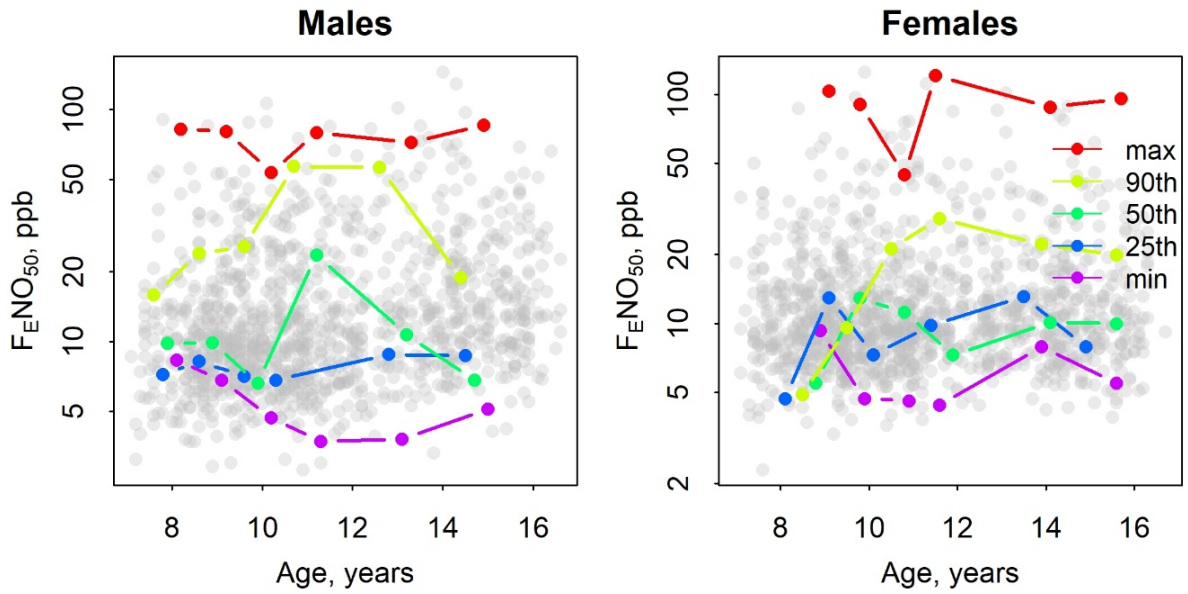


Figure E1. Selected F_ENO₅₀ trajectories for participants with 6 measurements and whose median detrended residuals of log F_ENO₅₀ on age were at selected sex-specific percentiles (min, 25th, 50th, 90th and max).

Table E2. Summary of fitted Generalized Additive Mixed Models presented in Figure 1 that model longitudinal logF_ENO₅₀ trajectories as smooth functions of: time-varying age (centered at age 8) with a random intercept and slope on age at the participant-level, time-varying height (centered at 130 cm) with a random intercept and slope on height, and two different parameterizations of a joint smooth of age and height with a random intercept and slope on age.

Model	Smooth term	Males (N=851)			Females (N=940)		
		EDF*	p-value	BIC†	EDF*	p-value	BIC†
Age only	s(age)	5.7	<0.0001	5539	5.1	<0.0001	5688
Height only	s(height)	2.2	<0.0001	5544	3.8	<0.0001	5679
Age and height	te(age, height)	8.8	<0.0001	5554	7.9	<0.0001	5701
	ti(age)	1.0	0.08	5566	1.0	0.93	5713
	ti(height)	1.0	0.33		1.0	0.05	
	ti(age,height)	6.5	0.001		4.7	0.0002	

* Effective degrees of freedom (EDF) for the smooth term; a value of 1 indicates a linear effect, higher values indicate a higher degree of non-linearity

† Bayesian Information Criterion (BIC)

Table E3. Bayesian Information Criteria (BIC) for fitted Generalized Additive Mixed Models presented in Table 3 that model longitudinal log fractional exhaled nitric oxide ($\log F_{E}NO_{50}$) trajectories as smooth functions of time-varying age and a time-constant covariate plus a participant-level random intercept and random slope on age. Model fit is measured by the BIC.

Model	BIC	
	Males (N=809)	Females (N=908)
Age only	5338	5580
Age and year 3 BMI%		
Using a tensor product interaction for BMI%	5358	5601
Using a tensor product smooth for BMI%	5369	5616
Age and race/ethnicity	5367	5616
Age and ever reported allergic rhinitis at year 3	5367	5608
Full model		
Using a tensor product interaction for BMI%	5368	5615
Using a tensor product smooth for BMI%	5379	5630

Table E4. Predicted geometric mean F_ENO₅₀ (and 95% CI) at ages 8 and 15, as well as the percent difference from age 8 to age 15, from the sex-specific model with only a smooth function of age and for specific covariate combinations from the sex-specific “final” models including a joint smooth of age and year 3 BMI percentile and adjustments for race/ethnicity and allergic rhinitis status at year 3.

Sex	Model	Year 3 child characteristics (BMI%, Race/Ethnicity, Allergic rhinitis)	Age 8, Geo. Mean	Age 15, Geo. Mean	Percent Difference
Male	s(age) only model		10.6 (10.1, 11.2)	16.5 (15.4,17.6)	54.9 (44.8, 65.8)
		15%, Hispanic, No	10.5 (9.3, 11.9)	18.9 (16.5, 21.7)	80.0 (58.5, 104.4)
	Final model	15%, White/non-Hispanic, No	9.5 (8.4, 10.8)	17.1 (14.9, 19.7)	80.0 (58.5, 104.4)
		15%, Other, No	12.0 (10.1, 14.2)	21.6 (18.0, 25.8)	80.0 (58.5, 104.4)
		15%, Hispanic, Yes	12.2 (10.7, 13.9)	21.9 (19.0, 25.4)	80.0 (58.5, 104.4)
		15%, White/non-Hispanic, Yes	11.0 (9.7, 12.6)	19.8 (17.2, 22.9)	80.0 (58.5, 104.4)
		15%, Other, Yes	13.9 (11.7, 16.5)	25.0 (20.8, 30.0)	80.0 (58.5, 104.4)
		95%, Hispanic, No	10.4 (9.5, 11.2)	15.0 (13.7, 16.5)	45.1 (33.5, 57.7)
		95%, White/non-Hispanic, No	9.4 (8.5, 10.3)	13.6 (12.2, 15.1)	45.1 (33.5, 57.7)
		95%, Other, No	11.8 (10.2, 13.7)	17.1 (14.7, 20.0)	45.1 (33.5, 57.7)
		95%, Hispanic, Yes	12.0 (10.9, 13.3)	17.4 (15.6, 19.4)	45.1 (33.5, 57.7)
		95%, White/non-Hispanic, Yes	10.8 (9.7, 12.1)	15.7 (14.0, 17.7)	45.1 (33.5, 57.7)
		95%, Other, Yes	13.6 (11.7, 15.9)	19.8 (16.9, 23.3)	45.1 (33.5, 57.7)
		Female	s(age) only model		10.7 (10.2, 11.2)
15%, Hispanic, No	10.1 (9.1, 11.1)			13.2 (11.7, 14.9)	31.0 (17.3, 46.3)
Final model	15%, White/non-Hispanic, No		9.4 (8.5, 10.4)	12.3 (10.9, 14.0)	31.0 (17.3, 46.3)
	15%, Other, No		10.6 (9.3, 12.0)	13.9 (12.0, 16.1)	31.0 (17.3, 46.3)
	15%, Hispanic, Yes		11.7 (10.4, 13.0)	15.3 (13.4, 17.4)	31.0 (17.3, 46.3)
	15%, White/non-Hispanic, Yes		10.9 (9.7, 12.2)	14.3 (12.5, 16.3)	31.0 (17.3, 46.3)
	15%, Other, Yes		12.3 (10.7, 14.0)	16.1 (13.8, 18.7)	31.0 (17.3, 46.3)
	95%, Hispanic, No		10.8 (10.0, 11.6)	12.2 (11.2, 13.4)	13.7 (4.9, 23.3)
	95%, White/non-Hispanic, No		10.1 (9.2, 11.0)	11.4 (10.3, 12.7)	13.7 (4.9, 23.3)
	95%, Other, No		11.3 (10.1, 12.8)	12.9 (11.3, 14.7)	13.7 (4.9, 23.3)
	95%, Hispanic, Yes		12.5 (11.4, 13.7)	14.2 (12.8, 15.7)	13.7 (4.9, 23.3)
	95%, White/non-Hispanic, Yes		11.6 (10.5, 12.9)	13.2 (11.8, 14.9)	13.7 (4.9, 23.3)
	95%, Other, Yes		13.1 (11.6, 14.9)	14.9 (13.0, 17.1)	13.7 (4.9, 23.3)

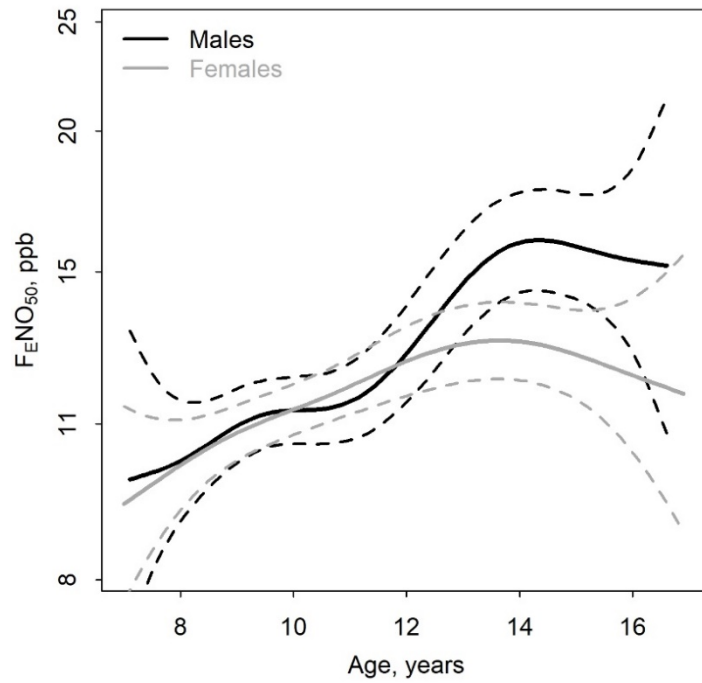


Figure E2. Population average sex-specific trajectories of $F_{E}NO_{50}$ (solid lines) and 95% Confidence Intervals (dashed lines) in subset of participants with data on age at peak height velocity (N=288 males, N=323 females) modeled as a smooth function of age only, for males (black) or females (grey). Analyses performed using $\log F_{E}NO_{50}$ with results here presented using back-transformed values on an axis scaled using natural log.

Table E5. Predicted geometric mean $F_{E}NO_{50}$ (and 95% CI) at selected ages, from the sex-specific model with a joint smooth of age and year 3 BMI percentile by age at peak height velocity (dichotomized based on sex-specific median) and adjustments for race/ethnicity and allergic rhinitis status at year 3.

Age (yrs)	Age at Peak Height Velocity			
	Early		Late	
	Male	Female	Male	Female
9	10.3 (8.9, 11.8)	10.2 (8.9, 11.6)	10.1 (8.8, 11.5)	10.3 (9.2, 11.5)
10	11.2 (9.8, 12.9)	10.7 (9.4, 12.2)	10.6 (9.3, 12.1)	10.9 (9.7, 12.1)
12	13.4 (11.6, 15.4)	11.7 (10.1, 13.5)	11.9 (10.4, 13.7)	11.8 (10.4, 13.3)
14	15.9 (13.6, 18.6)	11.9 (10.2, 13.9)	13.6 (11.8, 15.7)	13.6 (11.9, 15.4)
16	18.9 (15.8, 22.7)	11.8 (9.7, 14.2)	14.6 (12.3, 17.4)	12.1 (10.2, 14.3)

Table E6. Summary of fitted Generalized Additive Mixed Models that model longitudinal logF_ENO₅₀ trajectories as smooth functions of time-varying **height** and a time-constant covariate. Model fit is measured by the Bayesian Information Criterion (BIC).

Model	Parameter*	Males (N=809)				Females (N=908)			
		Regression coefficient **	EDF†	p-value	BIC	Regression coefficient **	EDF†	p-value	BIC
Height only	s(height)		2.0	<0.0001	5339		3.7	<0.0001	5571
	te(height, bmi)		5.5	<0.0001	5350		6.2	<0.0001	5595
Height and year 3 BMI %	ti(height)		1.9	<0.0001	5366		3.4	<0.0001	5610
	ti(bmi)		1.0	0.0008			1.0	0.89	
	ti(height, bmi)		1.0	0.03			1.0	0.78	
Height and race/ethnicity‡	Intercept	2.55		<0.0001	5370	2.50		<0.0001	5607
	White/non-Hispanic	-0.08		0.08		-0.07		0.11	
	Other	0.15		0.04		0.06		0.33	
	s(height)		1.3	<0.0001			3.5	<0.0001	
	s(height:Hispanic)		<0.1	0.31			1.2	0.15	
	s(height:White/non-Hisp)		1.4	0.18			<0.1	0.99	
	s(height:Other)		<0.1	0.72			<0.1	0.36	
Height and ever reported allergic rhinitis at year 3	Intercept	2.50		<0.0001	5366	2.45		<0.0001	5596
	Allergic Rhinitis	0.15		0.001		0.15		0.0002	
	Missing	-0.01		0.92		-0.03		0.63	
	s(height)		1.0	<0.0001			3.7	<0.0001	
	s(height:None)		2.5	0.04			<0.1	0.99	
	s(height:AllergicRhinitis)		<0.1	0.61			<0.1	0.91	
	s(height:Missing)		1.5	0.12			<0.1	0.56	
Full model	Intercept	2.53		<0.0001	5360	2.47		<0.0001	5606
	White/non-Hispanic	-0.11		0.01		-0.08		0.05	
	Other	0.12		0.10		0.04		0.45	
	Allergic Rhinitis	0.15		0.001		0.16		0.0002	
	Missing	-0.01		0.87		-0.04		0.52	
	te(height, bmi)		5.0	<0.0001			6.3	<0.0001	
		Intercept	2.53		<0.0001	5376	2.47		<0.0001
	White/non-Hispanic	-0.11		0.01		-0.08		0.05	
	Other	0.12		0.10		0.04		0.46	
	Allergic Rhinitis	0.14		0.001		0.16		0.0002	
	Missing	-0.01		0.87		-0.04		0.52	
	ti(height)		1.9	<0.0001			3.4	<0.0001	
	ti(bmi)		1.0	0.0005			1.0	0.87	
	ti(height, bmi)		1.2	0.03			1.0	0.71	

* Smooth terms definitions: s(): penalized regression spline; ti():tensor product interaction; te():tensor product smooth.

** For categorical variables; on logF_ENO₅₀ scale

† Effective degrees of freedom (EDF) for the smooth term; a value of 1 indicates a linear effect, higher values indicate a higher degree of non-linearity

‡ k=5 specified in the s(age, by=race, m=1, k=5) term for improved model convergence

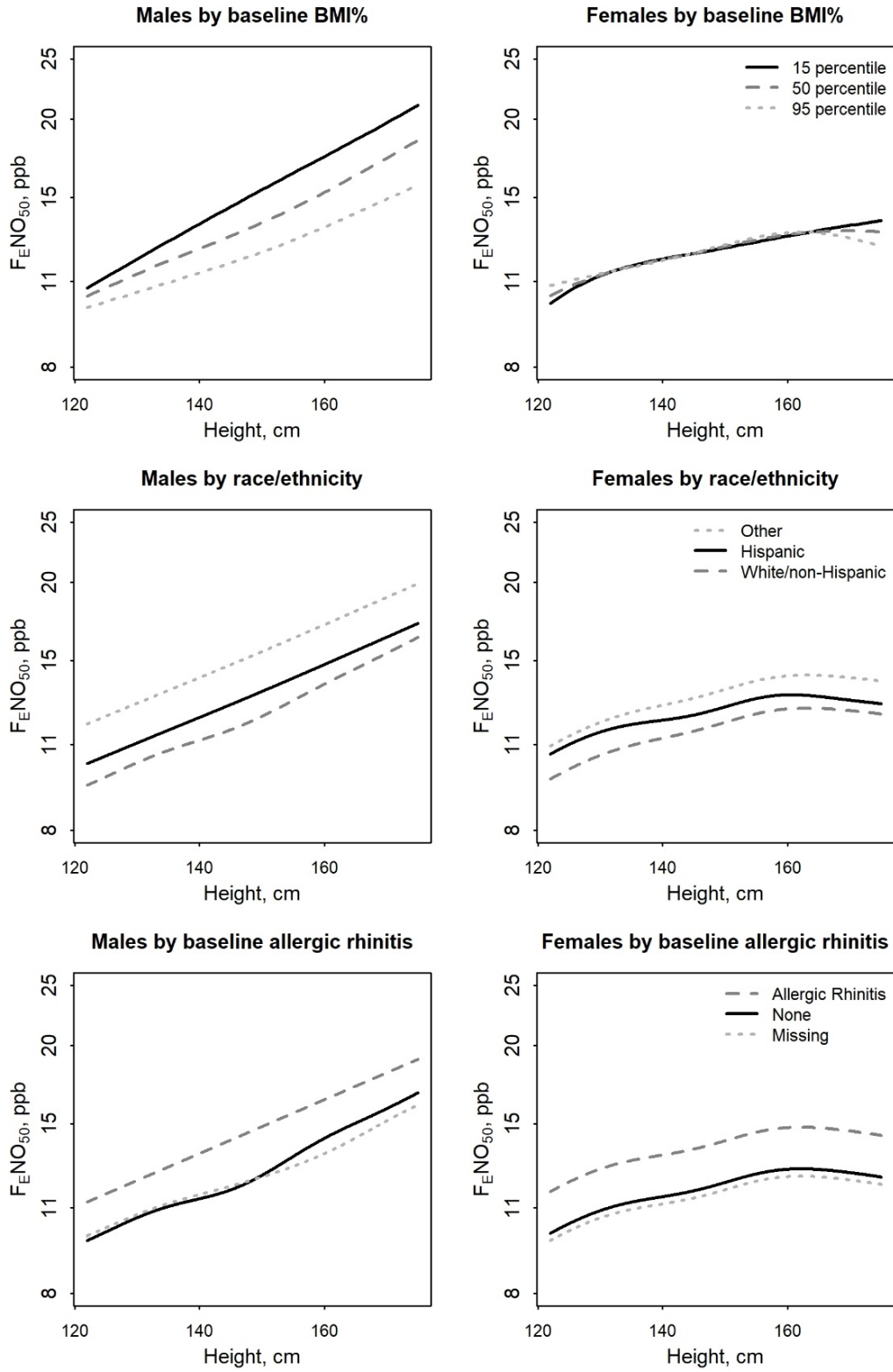


Figure E3. Modeled sex-specific trajectory of $F_{E}NO_{50}$ as a joint smooth of **height** and year 3 BMI percentile or as smooths of **height** that vary by race/ethnicity or ever reported allergic rhinitis at year 3.

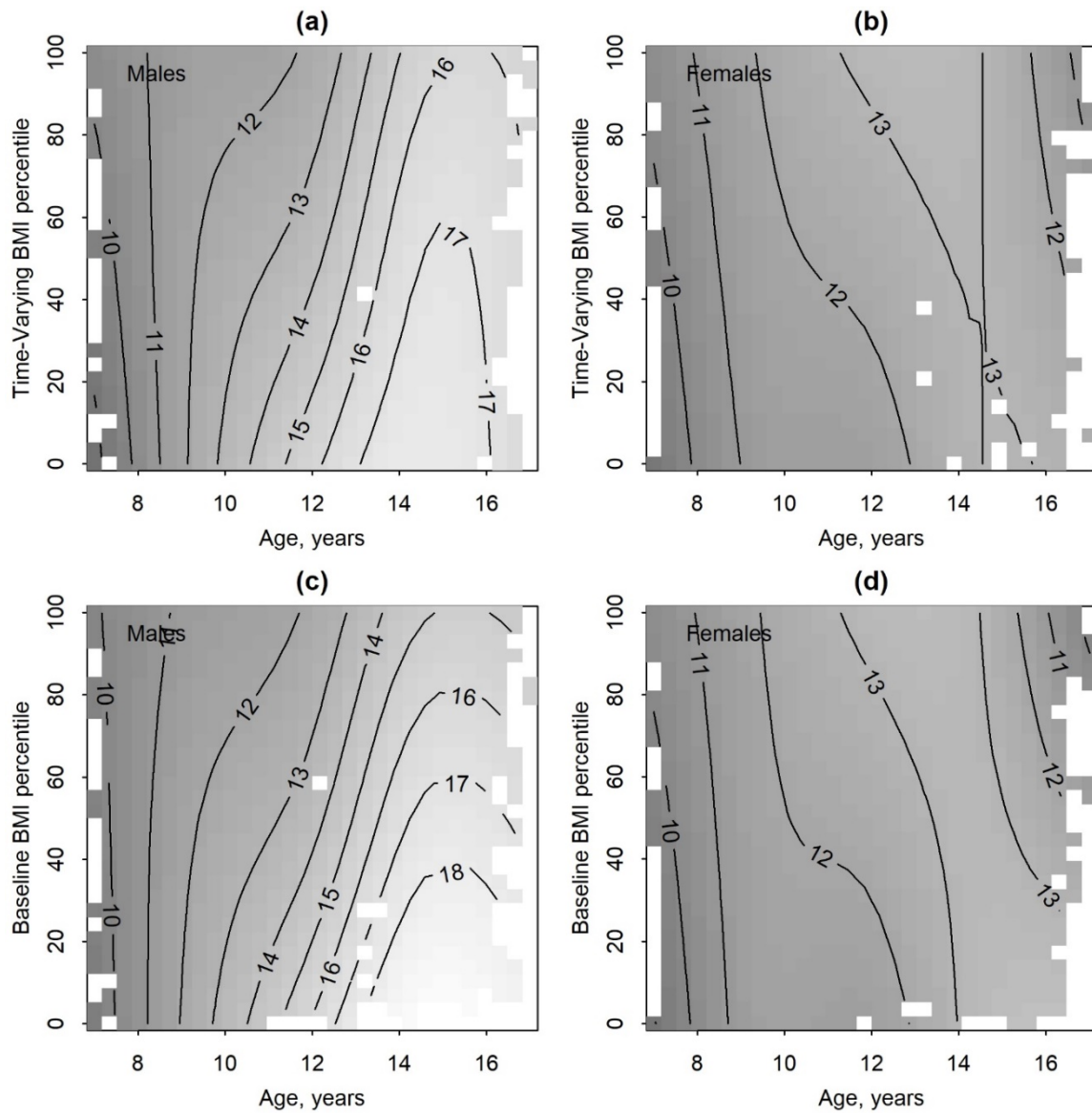


Figure E4. Modeled sex-specific trajectory of $F_{E}NO_{50}$ as a joint smooth of age and time-varying BMI percentile for males (a) or females (b) (N=851 males, N=940 females), or a joint smooth of age and year 3 BMI percentile for males (c) or females (d) (N=809 males, N=908 females). The contour lines labels refer to predicted geometric mean $F_{E}NO_{50}$ in ppb. Analyses performed using $\log F_{E}NO_{50}$ with results here presented using back-transformed values on an axis scaled using natural log.

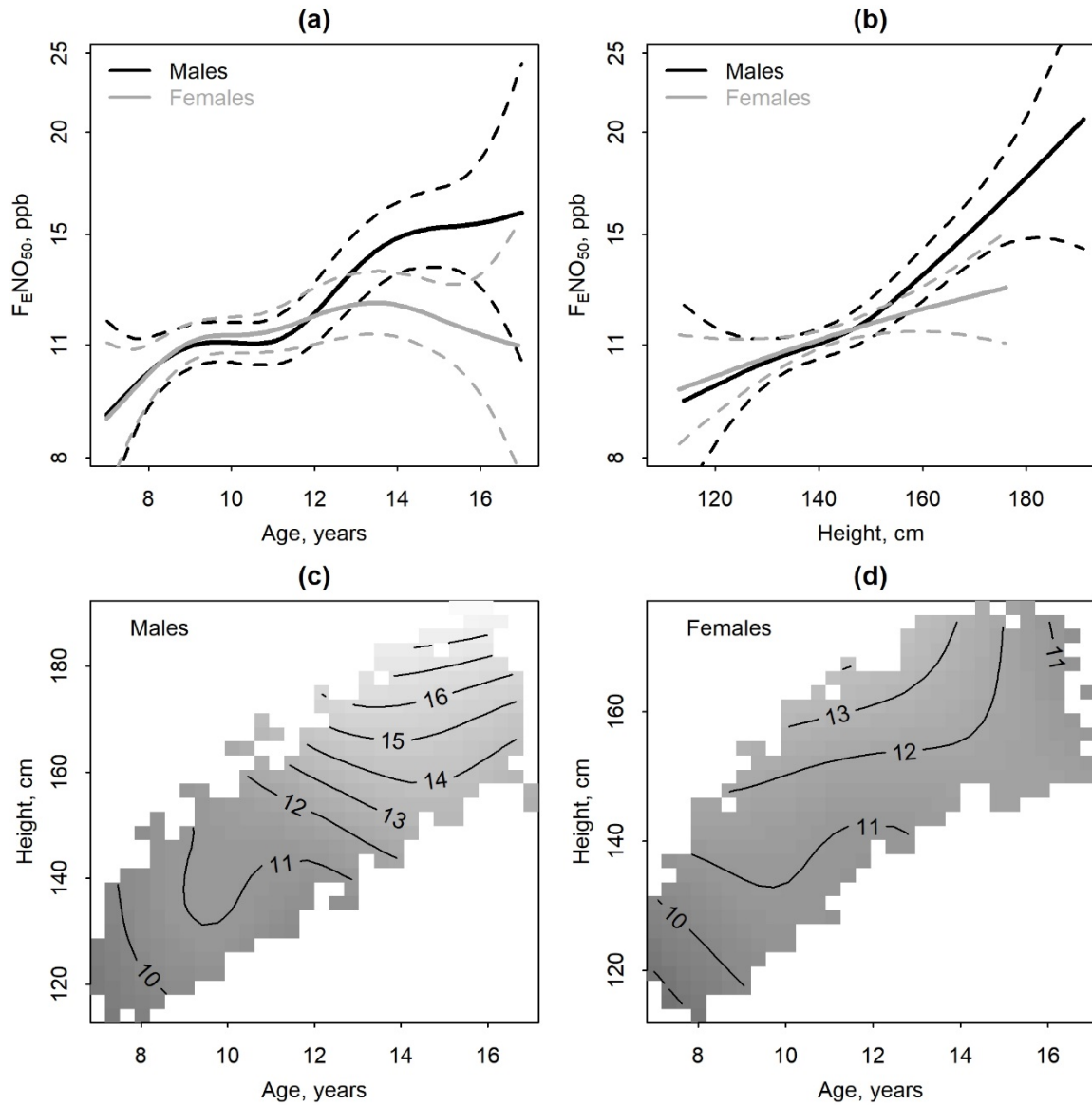


Figure E5. Modeled sex-specific trajectory of $F_{E}NO_{50}$ as a: (a) smooth function of age only*, (b) a smooth function of height only*, or a joint smooth of age and height for males (c) or females (d) among participants who never reported allergic rhinitis through year 10 of the study (N=512 males, N=550 females).

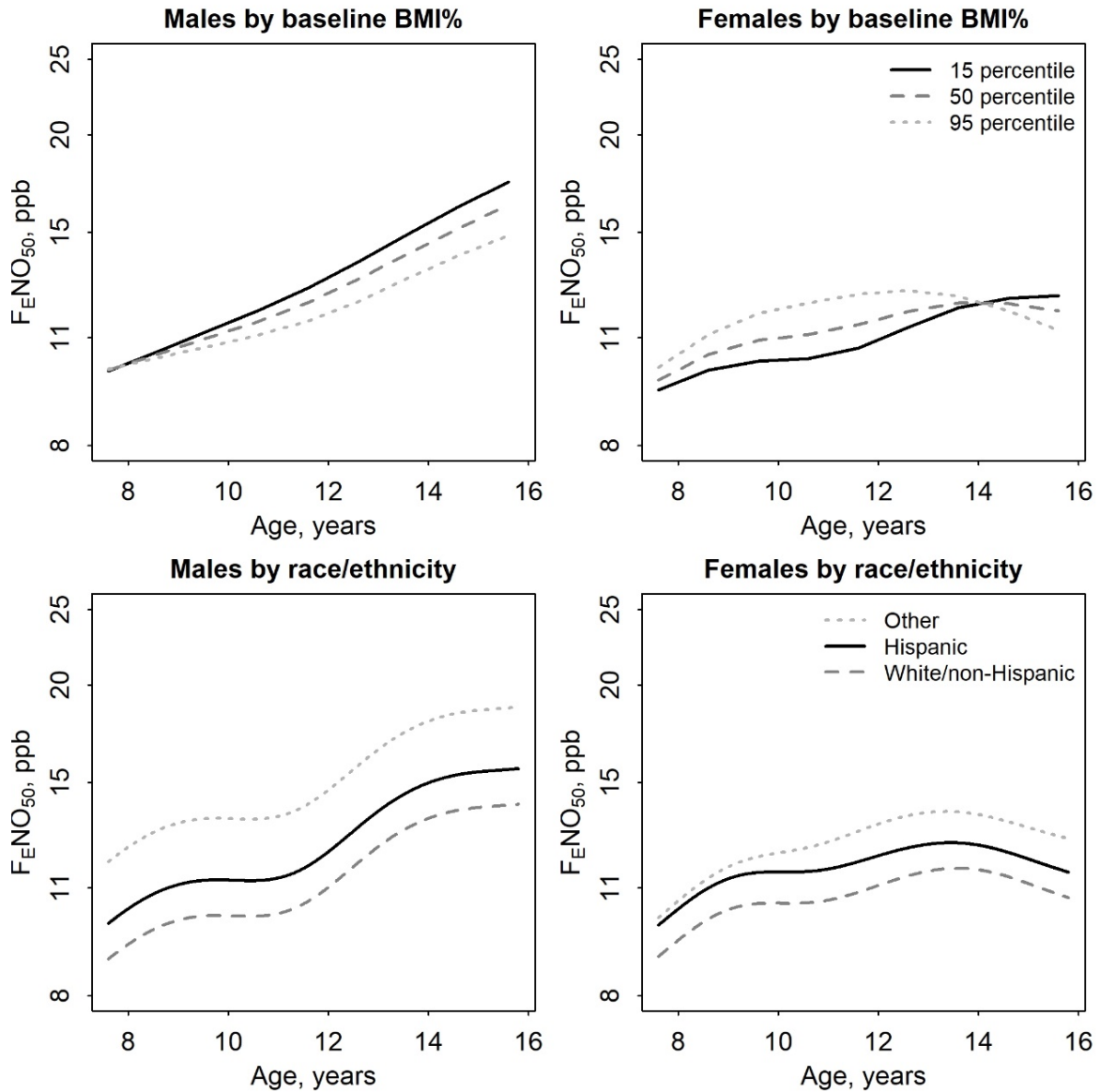


Figure E6. Modeled sex-specific trajectory of F_ENO₅₀ as a joint smooth of age and year 3 BMI percentile or as smooths of age that vary by race/ethnicity among participants who never reported allergic rhinitis through year 10 of the study and without missing year 3 BMI percentile (N=485 males, N=527 females).

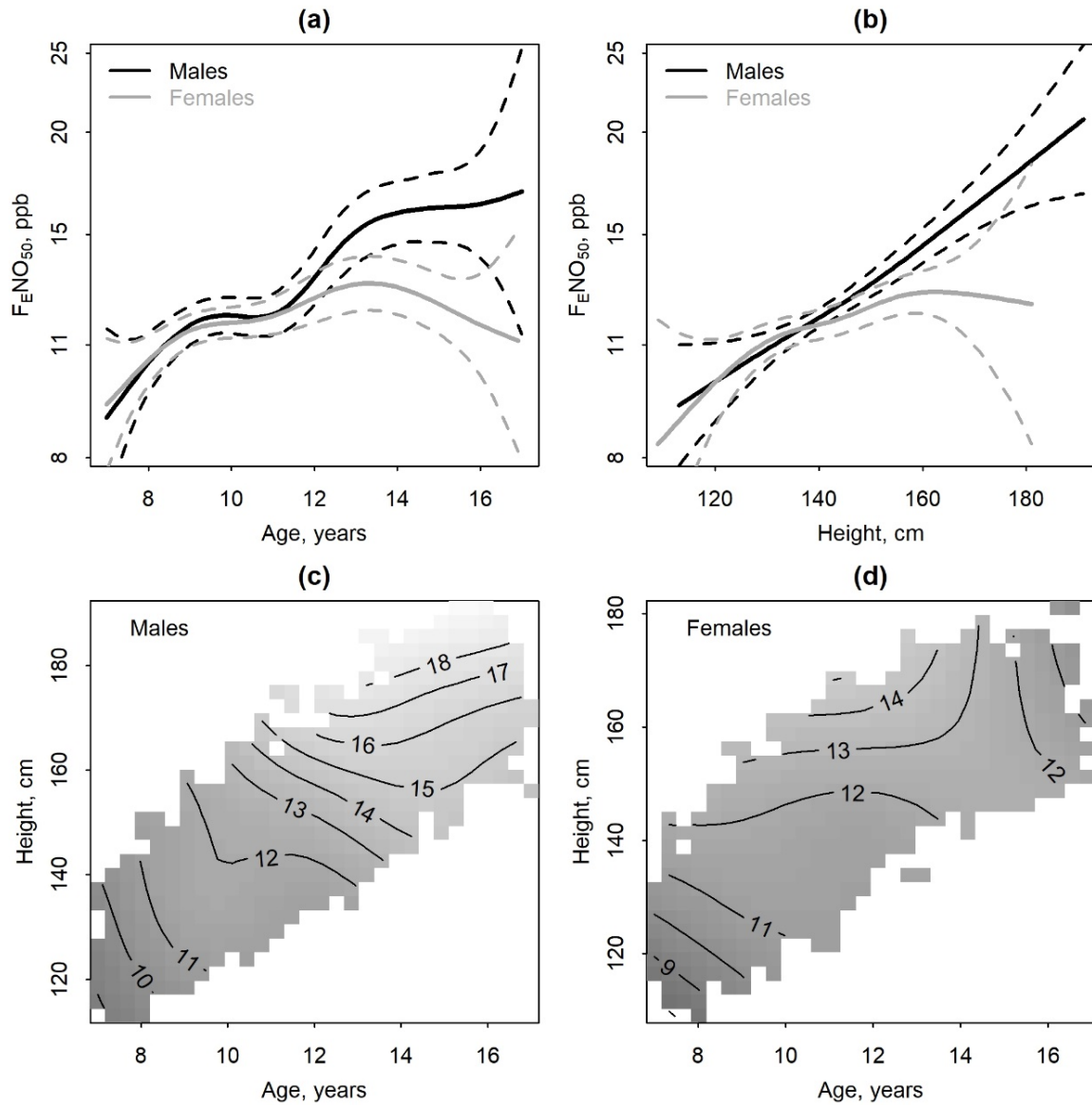


Figure E7. Modeled sex-specific trajectory of $F_{E}NO_{50}$ as a: (a) smooth function of age only*, (b) a smooth function of height only*, or a joint smooth of age and height for males (c) or females (d) among participants who never reported wheeze or whistling in the chest through year 10 of the study (N=735 males, N=791 females).

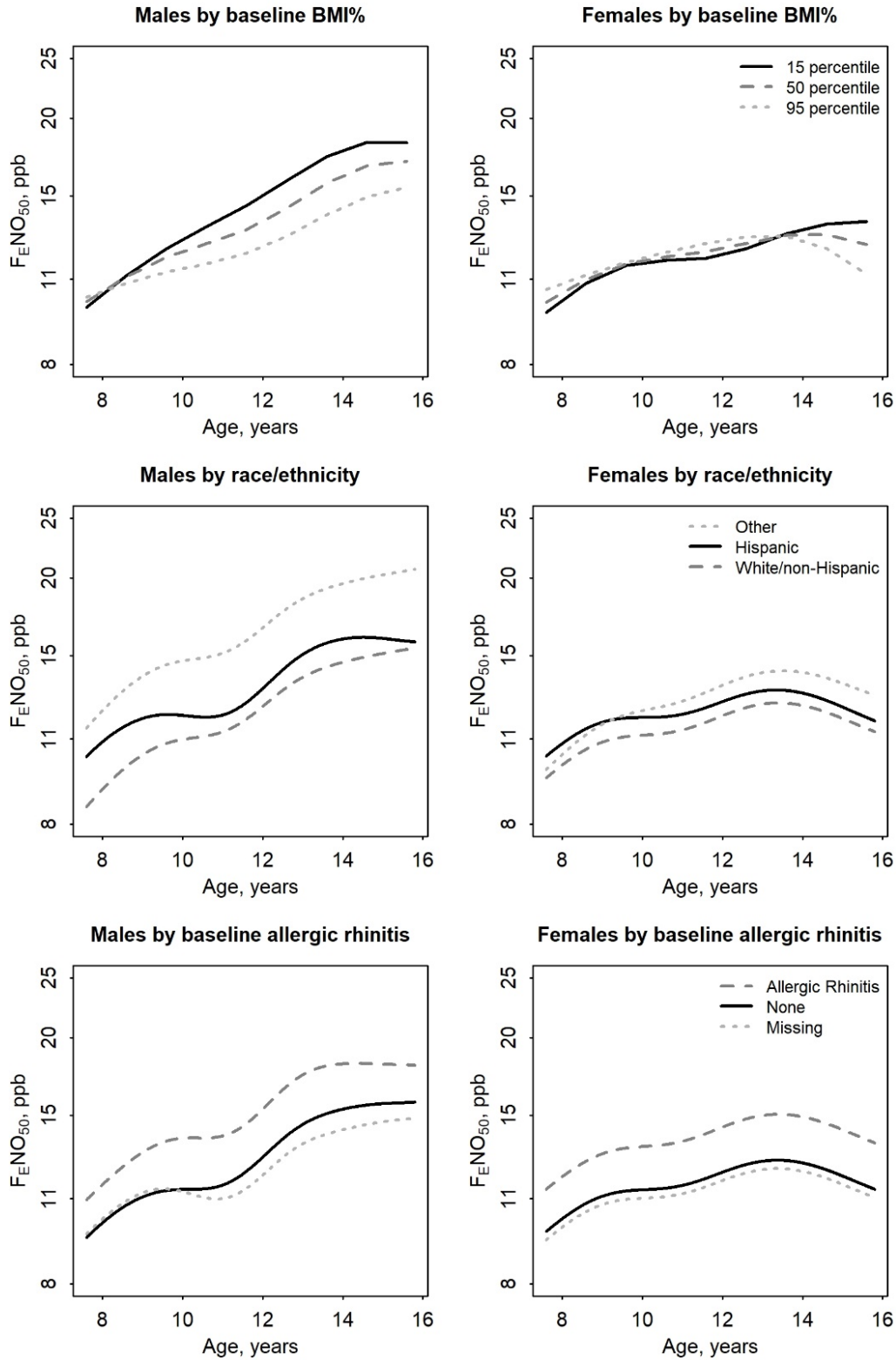


Figure E8. Modeled sex-specific trajectory of F_ENO₅₀ as a joint smooth of age and year 3 BMI percentile or as smooths of age that vary by race/ethnicity among participants who never reported wheeze or whistling in the chest through year 10 of the study and without missing year 3 BMI percentile (N=697 males, N=768 females).

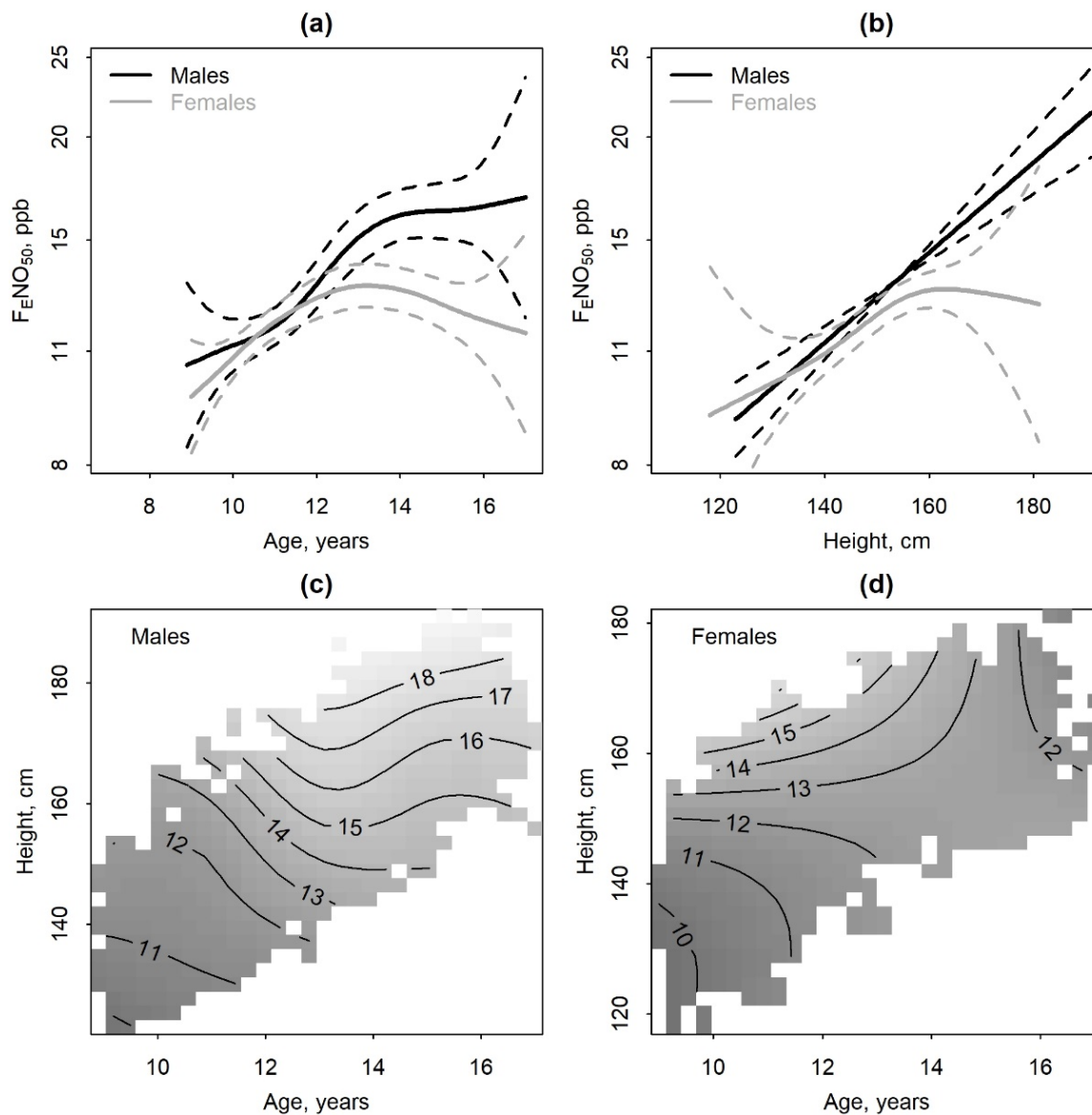


Figure E9. Modeled sex-specific trajectory of $F_{E}NO_{50}$ as a: (a) smooth function of age only*, (b) a smooth function of height only*, or a joint smooth of age and height for males (c) or females (d) restricting to online $F_{E}NO_{50}$ measurements (N=740 males, N=818 females).

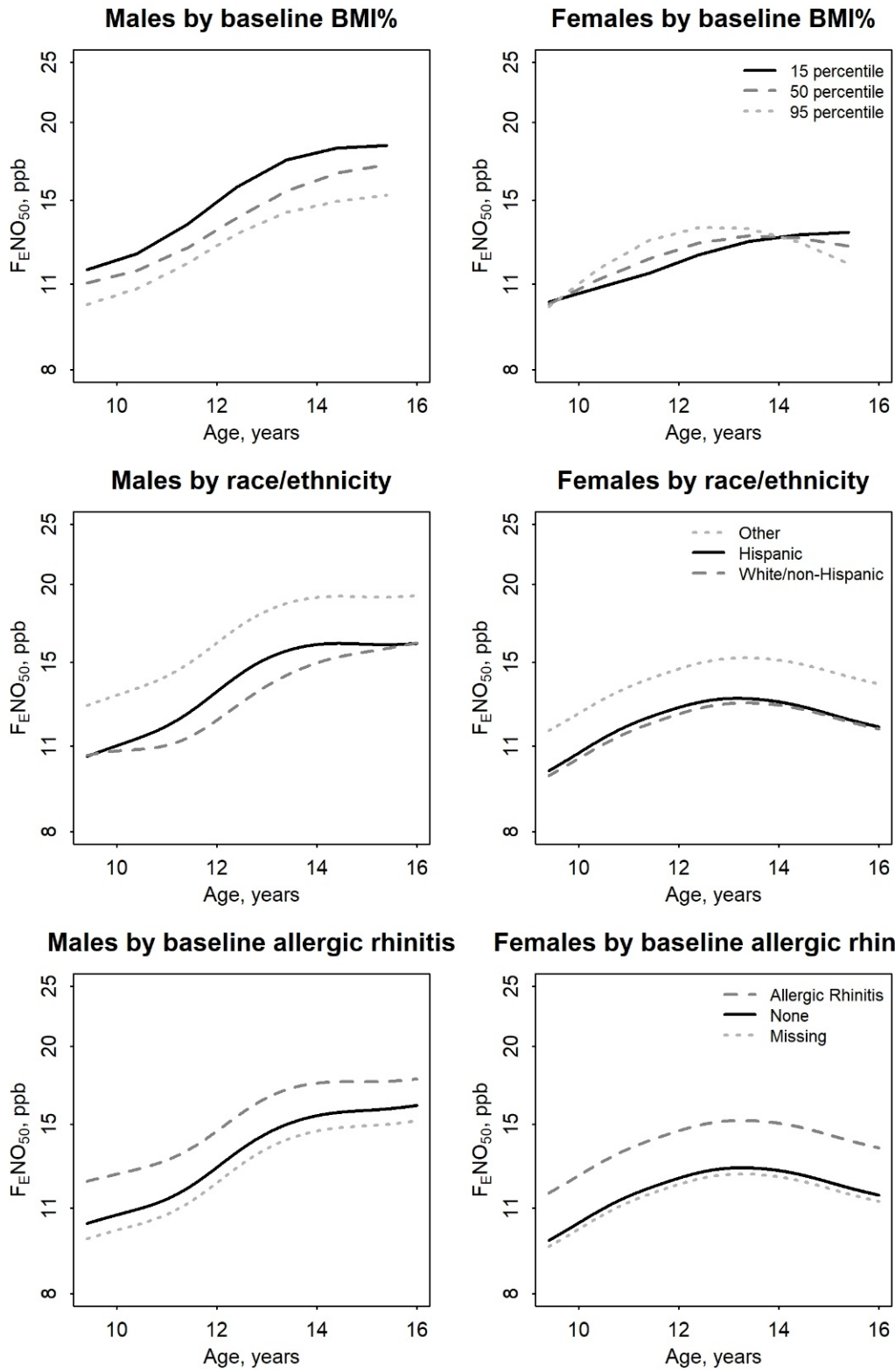


Figure E10. Modeled sex-specific trajectory of $F_{E}NO_{50}$ as a joint smooth of age and year 3 BMI percentile or as smooths of age that vary by race/ethnicity among participants without missing year 3 BMI percentile and restricting to online $F_{E}NO_{50}$ measurements (N=700 males, N=788 females).

Supplementary references

1. Gurka MJ. Selecting the best linear mixed model under REML. *The American Statistician* 2006; 60(1): 19-26.
2. Wood SN. Generalized additive models: an introduction with R. CRC press, 2017.