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## Predictors in Youth of Adult Cardiovascular Events

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Data availability can be requested from the i3c Steering Committee.

**Author Contributions:**

Nuotio had full access to the data in the study and takes responsibility for the integrity of the data and the accuracy of the data analysis.

Nuotio and Laitinen substantially contributed to the conception and the design of the study, researched the data, wrote the manuscript, and reviewed the manuscript critically for important intellectual content.

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All authors approved the final manuscript as submitted and agree to be accountable for all aspects of the work.

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All authors have reported that they have no relationships relevant to the contents of this paper to disclose.

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## **ABBREVIATIONS AND ACRONYMS**

BMI=body mass index

CVD =cardiovascular disease

i3C=International Childhood Cardiovascular Cohort

ICD=International Classification of Diseases

NHLBI=National Heart, Lung, and Blood Institute

## ABSTRACT

**BACKGROUND AND OBJECTIVES:** Childhood risk factors are associated with cardiovascular events in adulthood. However, further information is needed on clinical-setting risk assessment. We compared the utility of a risk model based solely on nonlaboratory risk factors in adolescence versus a model additionally including lipids to predict cardiovascular events in adulthood.

**METHODS:** The study comprised 11,550 participants from seven longitudinal cohort studies in the United States, Australia, and Finland, with risk factor measurements at 12-19 years of age who were followed into adulthood. The adolescent risk factors were defined using current clinical standards and were overweight/obesity, elevated blood pressure, smoking, and borderline high/high levels of total cholesterol and triglycerides. Main outcomes were medically adjudicated fatal or nonfatal cardiovascular disease events occurring after age 25.

**RESULTS:** Of 11,550 participants (55.1% female, mean age 50.0±7.7 years), 513 (4.4%) had confirmed cardiovascular events. In multivariable model (Hazard Ratio [95% confidence interval]), elevated blood pressure (1.25[1.03–1.52]), overweight (1.76[1.42–2.18]), obesity (2.19[1.62–2.98]), smoking (1.63[1.37–1.95]), and high total cholesterol (1.79[1.39–2.31]) were significant predictors of cardiovascular events ( $P<0.05$ ). Addition of lipids (total cholesterol and triglycerides) into the nonlaboratory model (age, sex, blood pressure, body mass index and smoking) did not improve discrimination in predicting cardiovascular events (C statistics for lipid model 0.75[SD 0.07] and for nonlaboratory model 0.75[0.07],  $P=0.82$ ).

**CONCLUSION:** Nonlaboratory-based risk factors and lipids measured in adolescence independently predicted adult cardiovascular events. The addition of lipid measurements to nonlaboratory risk factors did not improve prediction of cardiovascular events.

Word count: 246 words

**KEY WORDS:** adolescence, adult, cardiovascular risk factors, cardiovascular disease, cohort study.

### Article Summary:

This study examines whether prediction of future cardiovascular events in youth could be alternatively performed without laboratory tests using longitudinal data from seven cohorts.

### What's Known on This Subject:

Cardiovascular disease is a multifactorial disease with its roots in childhood and primordial prevention would ideally be targeted to children and adolescents with modifiable risk factors. Lipid screening in adolescence could allow early identification of dyslipidemia but requires substantial resources.

### What This Study Adds:

An approach that used only nonlaboratory risk factors obtained in youth predicted cardiovascular events as accurately as one additionally containing information on lipids. This nonlaboratory approach offers a simple alternative to identify adolescents at risk when laboratory testing is inconvenient.

## 1 INTRODUCTION

2 Atherosclerosis is a multifactorial disease with its roots in childhood. (1,2) Recently, we showed that  
3 childhood cardiovascular risk factors of body-mass index, systolic blood pressure, total cholesterol  
4 level, triglyceride level, and youth smoking, particularly in combination beginning in early childhood,  
5 were associated with adult cardiovascular events and death from cardiovascular causes before the age  
6 of 60 years. (3) These data suggest that primordial prevention of cardiovascular disease (CVD) should  
7 be targeted to children and adolescents.

8 In 2011, the National Heart, Lung, and Blood Institute recommended universal screening of lipid  
9 levels in youth (4). By contrast, in 2023, the US Preventive Services Task Force did not recommend  
10 screening in general risk assessment, arguing that the evidence to demonstrate its effectiveness was  
11 insufficient.(5) In addition, the 2018 multi-society lipid guideline and the ESC/EAS lipid guideline  
12 recommended lipid screening for children and adolescents with family history of either early CVD  
13 or significant hypercholesterolemia. (6,7) Further, the International Atherosclerosis Society guidance  
14 for familial hypercholesterolemia recently provided recommendations regarding lipid measurements  
15 suggesting that multiple screening strategies (selective, opportunistic and/or universal) should ideally  
16 be used to detect familial hypercholesterolemia. (8) There thus exists inconsistency in the messages  
17 that pediatric care providers are receiving from expert bodies.

18 Efforts to create a risk stratification system that could simplify general risk assessment in situations  
19 where laboratory testing is inconvenient or unavailable are needed. A study in adults (9) showed  
20 promising results supporting this kind of approach, with a nonlaboratory-based risk model predicting  
21 CVD events as accurately as one that relied on laboratory-based measurements. We previously  
22 reported that addition of lipid measurements to traditional clinic-based risk factor assessment  
23 provided a statistically significant but clinically modest improvement on adolescent prediction of  
24 high carotid intima-media thickness in adulthood. (10)

1 In this study, we use data from the International Childhood Cardiovascular Cohort (i3C) Consortium  
2 that includes seven longitudinal cohort studies (Australia, Finland, and five in the United States) of  
3 cardiovascular risk factors initiated in childhood that have followed participants into adulthood. Our  
4 aim was to compare risk prediction models based on nonlaboratory versus nonlaboratory plus lipid  
5 data obtained at ages 12-19 years for predicting adult CVD events. The analyses of this study relate  
6 to the aspect of general pediatric lipid screening and do not address the purpose related to familial  
7 hypercholesterolemia.

## 8 **2. METHODS**

### 9 **2.1. Study Sample**

10 The sample comprised 11,550 participants aged 12-19 years at baseline from the International  
11 Childhood Cardiovascular Cohort (i3C) Consortium, in seven childhood cohorts from the United  
12 States, Australia, and Finland. (11,12) Data from the first available study visit was used within the  
13 age range of 12-19 years of age. All risk factor measurements were derived from the same study visit.  
14 All seven cohorts included in this analysis have been previously described in detail (11), and a brief  
15 description of the cohorts is provided in the online supplement. The cohort studies followed protocols  
16 approved by local ethics committees, with signed informed consent or assent for participants as  
17 children or adolescents. All cohorts had data collected in clinical examinations that obtained the  
18 participants' age, sex, height and weight, and blood pressure. Fasting levels of plasma or serum lipid  
19 and lipoprotein measurements were measured by standard methods. Data on youth smoking was  
20 based on reports by the participants during childhood augmented by adult recall of the smoking  
21 initiation date and was analyzed as a dichotomous variable (yes vs. no). (3)

22 Between 2015-2019 the i3C Consortium conducted a coordinated study to locate and survey the now-  
23 adult participants. (3) US and Australian participants completed a Heart Health Survey to self-report  
24 cardiovascular events and medical procedures and update other relevant information; National Death

1 Indices were also searched to determine cause of death of participants. Cardiovascular event data for  
2 the Finnish participants through December 31, 2018 were obtained from Finland's national medical  
3 registries. Altogether, 20,659 participants were personally located or identified as deceased with a  
4 coded cause of death. Of these 20,659, this report includes 11,550 participants who had data available  
5 between 12-19 years of age, the age range when smoking data were collected.

## 6 **2.2. Definition of Risk Factors During Adolescence**

7 To increase generalizability of these data to the clinical setting and to be consistent with current  
8 recommendations, we analyzed the data by using categorical adolescent risk factors. Overweight  
9 status was defined according to the extended international (International Obesity Task Force; IOTF)  
10 cut-offs for body mass index (BMI).(13) Elevated blood pressure was defined according to the  
11 Clinical Practice Guideline for Screening and Management of High Blood Pressure in Children and  
12 Adolescents.(14) High-risk plasma lipid levels were defined according to the National Heart, Lung,  
13 and Blood Institute guidelines.(4)

## 14 **2.3. Cardiovascular events**

15 The primary study endpoint was the first instance of fatal or non-fatal myocardial infarction, stroke,  
16 transient ischemic attack, ischemic heart failure, angina, peripheral artery disease, carotid  
17 intervention, abdominal aortic aneurysm, or coronary revascularization recorded in physician or  
18 hospital records or identified through coded cause of death. Non-fatal events were self-reported in  
19 the Heart Health Survey by US and Australian participants, and medical records were requested for  
20 confirmation. A physician adjudication committee reviewed the records and classified each event as  
21 confirmed cardiovascular disease, not an event, or not adjudicable. Fatal event diagnoses were  
22 adjudicated using ICD coded causes of death. In Finland, diagnoses of fatal and non- fatal CVD  
23 events were based on ICD codes obtained from the national medical or death registries.

## 24 **2.4. Statistical Methods**

1 Statistical analyses were performed with SAS 9.4. Statistical significance was inferred at a 2-tailed  
2 value of  $P \leq 0.05$ . The normality assumptions of the residuals were assessed by examining histograms  
3 of the residuals and normal probability plots. To examine the associations of exposures in adolescence  
4 and subsequent cardiovascular events, analyses of survival data based on the Cox proportional  
5 hazards model were used. All analyses were adjusted for age, sex and study cohort. The ability of  
6 nonlaboratory model (including age, sex, study cohort, blood pressure, BMI, smoking) and lipid  
7 model (nonlaboratory model and additionally total cholesterol and triglycerides) data in adolescence  
8 to predict CVD events in adulthood was assessed using Uno's C-statistics in all study participants  
9 and in various subgroups. (15) Additionally, a more straightforward yet naïve Harrell's C-statistics  
10 were calculated for similar models to further assess the predictive abilities. While the Harrell's C  
11 statistic calculates the percentage of only comparable pairs whose risk has been correctly identified  
12 by the model and discards the pairs that are incomparable due to censoring, Uno's method is  
13 independent of the censoring. The differences between the AUC functions were calculated using  
14 Uno's inverse probability of censoring weighting technique. The confidence limits were calculated  
15 based on perturbation resampling. (16) We also calculated category-free net reclassification  
16 improvement (NRI) and integrated discrimination improvement (IDI) to examine whether based on  
17 these statistics the addition of lipids enhances prediction of CVD events compared to nonlaboratory  
18 model. (17) Models were tested for multicollinearity using the variance inflation statistic and no sign  
19 of multicollinearity was observed (variance inflation statistic  $< 2.0$  for all variables).

20

## 1 **RESULTS**

### 2 *Characteristics of the study participants*

3 Risk factors of the study participants at ages 12-19 years are described in Table 1. Of 11,550  
4 participants (55.1% female, mean age  $50.0 \pm 7.7$  years when outcome data were obtained during  
5 adulthood), 513 (4.4%) had confirmed cardiovascular events. Characteristics of study participants  
6 and those not included in the analyses due to insufficient data are compared in the Supplemental  
7 Table 1.

### 8 *Nonlaboratory- Versus Lipid- (i.e., Nonlaboratory with Lipid Measurements) Based Risk Assessment* 9 *in Predicting CVD events in Adulthood*

10 Univariable analyses (Table 2) assessing relations between risk factors and CVD events showed  
11 significant associations for age, sex, and most of categorical risk factors (overweight, obesity,  
12 elevated blood pressure, smoking, high total cholesterol, high triglycerides, borderline low HDL  
13 cholesterol, low HDL cholesterol, and high LDL cholesterol). Table 3 shows the results for a  
14 multivariable model assessing risk ratios for CVD events in adulthood according to nonlaboratory  
15 and lipid risk factors measured during adolescence. Among the nonlaboratory risk factors,  
16 overweight, obesity, elevated blood pressure, and smoking remained significantly associated with  
17 CVD events. When lipids (total cholesterol and triglycerides) were introduced into the model, the  
18 significant associations for overweight, obesity, elevated blood pressure, and smoking remained, with  
19 high total cholesterol also significant. When total cholesterol was replaced with LDL-cholesterol and  
20 HDL-cholesterol in the lipid model (lipid model including LDL-cholesterol, HDL-cholesterol, and  
21 triglycerides; N=8,048), the significant association remained for overweight, obesity, elevated blood  
22 pressure, smoking, and high LDL-cholesterol. (Supplemental Table 2).

23 As shown in Figure 1, both in nonlaboratory and lipid (nonlaboratory plus lipids) models the number  
24 of adolescence risk factors was associated with subsequent cardiovascular events.

1 Figure 2 shows the receiver operating characteristic curve values (Uno's C-statistics) for the  
2 nonlaboratory (blood pressure, BMI, smoking) and lipid model (nonlaboratory plus total cholesterol  
3 and triglycerides) prediction of adult CVD events. The addition of lipids to the nonlaboratory model  
4 did not lead to higher C statistics (C statistics for lipid model 0.75 [SD 0.07] and for nonlaboratory  
5 model 0.75 [0.07], P=0.82). When males and females, smokers and non-smokers, participants with  
6 normal weight and overweight, participants within US-cohorts, and participants within non-US-  
7 cohorts were analyzed separately, the results remained essentially similar (Figure 2). When Harrell's  
8 C-statistics, were calculated for similar models (Supplemental Table 3), the results were essentially  
9 similar to those shown in Figure 2. The overall improvement in category-free NRI was 0.11 (95% CI  
10 0.008-0.21); for cases it was -0.03 and for controls 0.14, indicating that the addition of lipids improves  
11 the prediction of non-events rather than events. However, IDI was 0.002 (P-value 0.89) indicating  
12 that the difference in average predicted risks between the individuals with and without the outcome  
13 did not increase significantly when lipids were included in the prediction model.

14 When only fatal CVD events were used as an outcome, the results remained essentially similar. The  
15 number of adolescence risk factors was associated with fatal CVD events in both nonlaboratory and  
16 lipid models (Supplemental Figure 1). In C-statistics, no significant difference was observed when  
17 lipids were added to the nonlaboratory model (C statistics for lipid model 0.75 [SD 0.05] and for  
18 nonlaboratory model 0.72 [0.06], P=0.14).

19

## 1 **DISCUSSION**

2 The findings from seven international longitudinal cohorts examined in this study show that the risk  
3 of CVD events can be predicted by nonlaboratory adolescent risk factors (overweight, obesity,  
4 hypertension, and smoking). Lipid values were also associated with adult CVD events; however,  
5 addition of lipids did not improve models of prediction for CVD events.

6 In our recent report we showed that childhood cardiovascular risk factors, BMI, systolic blood  
7 pressure, smoking, total cholesterol, and triglycerides, were significantly associated with incident  
8 adult CVD events by midlife. (3) Previously, data from the Coronary Artery Risk Development in  
9 Young Adults study showed a relation between the Framingham risk score and cardiovascular events  
10 in a young adult cohort (age 22-36) followed for 20 years. (18) It is noteworthy to mention that the  
11 original Framingham risk score does not include BMI/obesity and when obesity is included the  
12 overall prediction does not change. (19) However, BMI in childhood and overweight/obesity in late  
13 adolescence have been associated with increased cardiovascular morbidity and mortality in  
14 adulthood. (20, 21) The findings of the present study are consistent with the earlier observations  
15 showing the relation of early risk factor profiling to CVD events.

16 In the National Health and Nutrition Examination Survey I adult population (baseline, 25–74 years  
17 of age, N=14,407), Gaziano et al. (9) examined whether a risk prediction model that did not require  
18 any laboratory tests could be as accurate as one requiring laboratory information. They observed that  
19 a model with nonlaboratory-based risk factors predicted CVD events as accurately as one that relied  
20 on laboratory-based values. The nonlaboratory model included age, blood pressure, smoking, BMI,  
21 history of diabetes mellitus, and history of blood pressure treatment, whereas in the laboratory-based  
22 model, BMI was replaced with total cholesterol level. In addition, the Fuster-BEWAT Score (blood  
23 pressure, exercise, weight, alimentation and tobacco) that requires no laboratory tests has been shown  
24 to predict the presence and extent of subclinical atherosclerosis in adults with similar accuracy than

1 the ideal cardiovascular health score that is recommended for use in primary prevention.(22)  
2 Accordingly, we previously reported that the addition of adolescent lipid measurements to traditional  
3 clinic-based risk factor assessment (sex, blood pressure status, body mass index status) provided a  
4 statistically significant but clinically modest improvement on prediction of high carotid intima-media  
5 thickness in adulthood (10). In the present study, our findings from seven cohort studies among youth  
6 12 to 19 years of age were essentially similar. Even though, in line with our prior analyses (3),  
7 adolescent lipid levels in this substudy were related with CV events, nonlaboratory-based risk factors  
8 predicted CVD events as accurately as an approach that additionally considered lipids. Our results  
9 were consistent in several subgroup analyses based on sex, study cohort location, smoking and  
10 adiposity status. Furthermore, we did observe statistically significant improvement in the category-  
11 free NRI. However, there was no improvement in IDI in the prediction of CVD events when  
12 laboratory model was compared to nonlaboratory model. Thus, it is likely that such small movement  
13 noticed in the NRI is not clinically relevant. There are several possible explanations for this finding.  
14 First, within the baseline age range of our study cohort, there are substantial changes in the lipid  
15 profile related especially to pubertal development and growth. (23) These physiologic changes may  
16 reduce the ability of the lipid profile to add to the risk prediction. Second, the variables in the  
17 nonlaboratory model, especially BMI and blood pressure contain information about the lipid levels  
18 (24), so this model partly, implicitly, includes lipids. Third, especially compared to BMI  
19 measurements, there is more physiological (long term) and analytical variation (day-to-day) in lipid  
20 values and thus use of repeated lipid measures instead of a single measure could improve the  
21 predictive performance of lipids (25).

22 Strong evidence suggests that CVD has its origins in childhood. (1,2) Prevention strategies conducted  
23 in children have provided evidence of benefits of lifestyle counselling on risk markers and remain the  
24 cornerstones for promoting cardiovascular health in children at the population level (2). Recently, the  
25 STRIP study (Special Turku Coronary Risk Factor Intervention Project for Children) showed

1 favorable effects on risk factors over a period of 26 years after dietary counselling initiated in infancy  
2 and continued throughout childhood. (26) In addition to the population strategy, the identification of  
3 children who are at high risk of atherosclerosis could be effective in allowing personalized  
4 interventions. However, there is no widely accepted childhood or adolescent risk prediction method  
5 that uses risk factor data obtained from apparently healthy youths. From the Pathobiological  
6 Determinants of Atherosclerosis in Youth data, a risk score has been developed estimating the  
7 probability for coronary artery lesions observed at autopsy, but it is only applicable for individuals  
8 15 to 34 years of age. (27,28)

9 Results from the present study suggest that a risk prediction method based on BMI, blood pressure  
10 and smoking status that does not require any laboratory tests could be non-inferior to one requiring  
11 laboratory information. This nonlaboratory approach would allow an easy and simple initial  
12 evaluation/identification of those youth who might benefit from a further investigation of major  
13 modifiable cardiovascular risk factors, such as lipids, and therapeutic lifestyle and possible medical  
14 interventions. Obvious benefits include avoiding the need to subject a child or adolescent to a blood  
15 draw, as well as reduced financial costs. Earlier (from 2011) pediatric guidelines recommend lipid  
16 screening for identifying familial hypercholesterolemia and predicting atherosclerosis (4). We  
17 acknowledge that our findings do not provide any evidence for or against screening for familial  
18 hypercholesterolemia, which is an important reason to measure lipid levels in childhood as a clearly  
19 defined risk factor for atherosclerotic CVD occurring in 1:250 individuals (29). Furthermore, lipid  
20 measures might enhance the discrimination of individuals already in the high-risk group as  
21 participants with all of 5 risk factors of lipid model had notably higher risk for subsequent  
22 cardiovascular event (HR 6.20; 95%CI 3.59-10.73) compared to participants with all three risk factors  
23 of nonlaboratory model (HR 4.05; 95%CI 2.92-5.64).

## 24 **STUDY LIMITATIONS**

1 Strengths of the study include the large sample size, longitudinal study design, extensive follow-up  
2 of the participants who were very well-phenotyped in adolescence among seven cohorts, and  
3 adjudication of medical records. However, it was not possible to locate half of the original adolescent  
4 participants, and medical records were not available for some participants self-reporting a  
5 cardiovascular event (included in the non-event group). Second, we were unable to consider family  
6 history for e.g. familial hypercholesterolemia or pubertal stage, both of which may have an influence  
7 on CVD risk factors, because data were not available for all cohorts. Third, lipid measurement  
8 methods differed between study cohorts. However, to take this into account, the analyses were  
9 adjusted for cohort. Finally, residual confounding is a possibility in all observational studies.

## 10 **CONCLUSIONS**

11 In summary, our data from seven international cohort studies show that both nonlaboratory risk  
12 factors and lipids in adolescence independently predict adult CVD events. The predictive value of an  
13 approach that additionally considered lipids using current clinical standards was not superior to a  
14 model that only included nonlaboratory factors.

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11

## 12 **FIGURE LEGEND**

13 **Figure 1.** Hazard ratios for cardiovascular disease event according to the number of risk factors  
14 stratified by nonlaboratory and lipid (nonlaboratory plus lipids) models.

15 If a risk factor was above normal cut points derived from the recommendations of the Expert Panel  
16 on Integrated Guidelines for Cardiovascular Health and Risk Reduction in Children and Adolescents  
17 or participant reported smoking, the risk factor was considered positive.

18 **Figure 2.** Receiver operating characteristic (ROC) curve values for a model only including age and  
19 sex and comparisons of nonlaboratory (age, sex, blood pressure, BMI, smoking) with lipid model  
20 (additionally total cholesterol and triglycerides) in adolescents for prediction of adult cardiovascular  
21 events.

**Table 1.** Participant characteristics

	<b>BHS</b>		<b>CDAH</b>		<b>MN</b>		<b>Muscatine*</b>		<b>NGHS</b>		<b>Princeton</b>		<b>YFS</b>		<b>All</b>	
<b>N</b>	2,862		426		362		4,259		436		423		2,782		11,550	
<b>Sex (% female)</b>	56.9		51.4		45.6		52.5		100.0		54.6		52.0		55.1	
<b>Age at baseline, y</b>	13.9	1.5	14.0	1.5	14.5	1.9	14.0	1.6	16.9	2.7	15.1	1.9	14.2	2.4	14.2	2.0
<b>Age at censoring, y</b>	47.2	7.2	46.2	2.2	32.4	2.5	54.9	5.7	40.2	1.3	56.6	5.7	48.8	5.1	50.0	7.7
<b>Total cholesterol, mmol/L</b>	4.16	0.74	4.45	0.75	3.88	0.72	4.02	0.70	4.21	0.83	4.40	0.83	5.14	0.92	4.36	0.90
<b>LDL-C, mmol/L</b>	2.37	0.66	2.68	0.69	2.27	0.62	2.25	0.60	2.53	0.75	2.75	0.76	3.21	0.84	2.69	0.83
<b>HDL-C, mmol/L</b>	1.52	0.49	1.42	0.30	1.13	0.26	1.27	0.26	1.34	0.28	1.33	0.32	1.57	0.32	1.47	0.40
<b>Triglycerides, mmol/L</b>	0.84	0.44	0.75	0.37	1.05	0.61	0.89	0.43	0.98	0.50	0.91	0.42	0.79	0.36	0.86	0.43
<b>BMI, kg/m<sup>2</sup></b>	20.9	4.6	19.5	2.8	23.0	5.5	20.8	3.7	24.2	6.8	21.4	4.5	19.3	3.0	20.6	4.2
<b>Systolic blood pressure, mmHg</b>	107	9	113	13	108	9	115	13	108	9	109	12	115	11	112	12
<b>Diastolic blood pressure, mmHg</b>	54	12	67	12	57	13	66	12	67	9	67	10	67	10	63	13
<b>Smoking (%)</b>	42.8		34.5		34.0		34.7		39.7		35.9		42.6		38.8	
<b>CVD events (%)**</b>	139 (4.9)		4 (0.9)		0 (0)		252 (5.9)		3 (0.7)		31 (7.3)		84 (3.0)		513 (4.4)	

BMI= body mass index, HDL-C = High-density lipoprotein cholesterol, LDL-C = Low-density lipoprotein cholesterol, CVD = Cardiovascular disease

Values are mean (SD) unless otherwise stated.

\*LDL-C and HDL-C only available in subsample of 812 participants in the Muscatine Study

\*\*213 (35%) of the events were fatal

**Table 2.** Hazard Ratios for cardiovascular disease events in adulthood according to nonlaboratory risk factors and lipids.

Adolescent Risk Factor	Number of participants with event / total number	HR	95% CI
<b>Age, y</b>	513/11,550	1.10	1.05-1.16
<b>Sex, male</b>	513/11,550	2.12	1.77-2.54
<b>Blood pressure*</b>			
Normotensive	267/7,383	Ref	
Elevated blood pressure	246/4,167	1.45	1.20-1.75
<b>Body mass index**</b>			
Normal weight	314/9,098	Ref	
Overweight	118/ 1,754	1.96	1.59-2.42
Obese	54/ 698	2.73	2.04-3.65
<b>Smoking</b>			
Non-smoker	237/7,070	Ref	
Smoker	276 /4,480	1.67	1.40-1.99
<b>Total cholesterol</b>			
Normal (<4.40 mmol/L)	287/6,660	Ref.	
Borderline high (≥4.40-5.17)	122/2,940	1.17	0.95-1.46
High (≥5.18)	104/1,950	2.03	1.58-2.61
<b>Triglycerides</b>			
Normal (<1.02 mmol/L)	339/8,599	Ref	
Borderline high (≥1.02–1.46 mmol/L)	107/2,072	1.19	0.95-1.48
High (≥1.46 mmol/L)	67/879	1.82	1.39-2.37
<b>LDL cholesterol</b>			
Normal (<2.85 mmol/L)	169/5,093	Ref.	
Borderline high (≥2.85–3.36 mmol/L)	43/1,456	1.16	0.82-1.66
High (≥3.37 mmol/L)	68/1,511	1.93	1.39-2.68
<b>HDL cholesterol</b>			
Normal (>1.16 mmol/L)	205/6,419	Ref.	
Borderline low (1.16-1.03 mmol/L)	32/785	1.53	1.05-2.24
Low (<1.03 mmol/L)	42/872	1.74	1.23-2.44

\*Age- and sex-specific values defined according to the Clinical Practice Guideline for Screening and Management of High Blood Pressure in Children and Adolescents.

\*\*Age- and sex-specific values defined according to the Cole classification.

Analyses adjusted additionally for age in adolescence, sex and study cohort.

**Table 3.** Multivariable Hazard Ratios for cardiovascular disease event according to a nonlaboratory model and a lipid model including additionally total cholesterol and triglycerides.

Number of participants with event / total number Adolescent Risk Factor	Nonlaboratory model		Lipid Model	
	HR	95 % CI	HR	95 % CI
	513/11,550		513/11,550	
<b>Blood pressure*</b>				
Normotensive	Ref.		Ref.	
Elevated blood pressure	1.27	1.04-1.54	1.25	1.03-1.52
<b>Body mass index**</b>				
Normal weight	Ref.		Ref.	
Overweight	1.83	1.48-2.27	1.76	1.42-2.18
Obese	2.48	1.84-3.33	2.19	1.62-2.98
<b>Smoking</b>				
Non-smoker	Ref.		Ref.	
Smoker	1.63	1.37-1.94	1.63	1.37-1.95
<b>Total Cholesterol</b>				
Normal (<4.40 mmol/L)			Ref.	
Borderline high (≥4.40-5.17)		N/A	1.10	0.88-1.37
High (≥5.18)			1.79	1.39-2.31
<b>Triglycerides</b>				
Normal (<1.02 mmol/L)			Ref.	
Borderline high (≥1.02–1.46 mmol/L)		N/A	1.03	0.82-1.28
High (≥1.46 mmol/L)			1.27	0.96-1.69

\*Age- and sex-specific values defined according to Clinical Practice Guideline for Screening and Management of High Blood Pressure in Children and Adolescents.

\*\*Age- and sex-specific values defined according to the Cole classification.

Analyses adjusted additionally for age in adolescence, sex, and study cohort.

Figure 1.

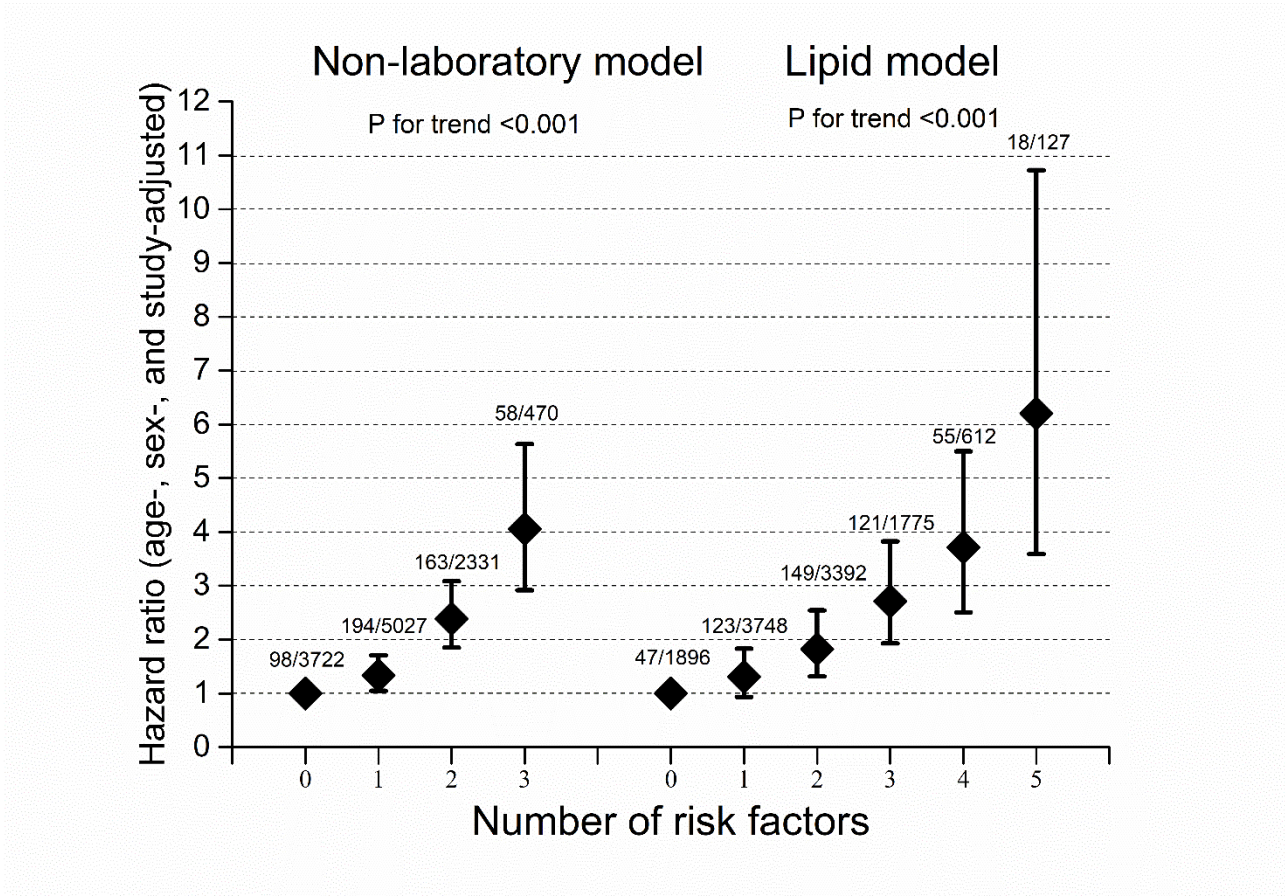


Figure 2.

