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Limitations of Contemporary Guidelines for Managing Patients at High Genetic Risk of Coronary Artery Disease

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Abstract

Background: Polygenic risk scores (PRS) for coronary artery disease (CAD) identify high-risk individuals more likely to benefit from primary prevention statin therapy. Whether polygenic CAD risk is captured by conventional paradigms for assessing clinical cardiovascular risk remains unclear.

Objectives: To intersect polygenic risk with guideline-based recommendations and management patterns for CAD primary prevention.

Methods: We applied a genome-wide CAD PRS to 47,108 individuals across three U.S. healthcare systems. We then assessed whether primary prevention patients at high polygenic risk might be distinguished on the basis of greater guideline-recommended statin eligibility and higher rates of statin therapy.

Results: Of 47,108 study participants, mean age was 60 years, and 11,020 (23.4%) had CAD. The CAD PRS strongly associated with prevalent CAD (OR=1.4 per SD increase in PRS; p<0.0001). High polygenic risk (top 20% of PRS) conferred 1.9-fold odds of developing CAD (p<0.0001). However, among primary prevention patients (N=33,251), high polygenic risk did not correspond with increased recommendations for statin therapy - per the American College of Cardiology/American Heart Association (46.2% for those with high PRS versus 46.8% for all others, p=0.54) or U.S. Preventive Services Task Force (43.7% versus 43.7%, p=0.99) - or higher rates of statin prescriptions (25.0% versus 23.8%, p=0.04). An additional 4.1% of primary prevention patients may be recommended for statin therapy if high CAD PRS were considered a guideline-based, "risk-enhancing factor."

Conclusions: Current paradigms for primary cardiovascular prevention incompletely capture a polygenic susceptibility to CAD. An opportunity may exist to improve CAD prevention efforts by integrating both genetic and clinical risk.

Condensed Abstract:

Polygenic risk scores (PRS) robustly prognosticate coronary artery disease (CAD) risk in the general population, but their utility within the healthcare setting - and in the context of guidelinebased primary prevention strategies - remains unexplored. We applied a CAD PRS to 47,108 patients across three distinct healthcare systems and observed strong and consistent associations

with CAD. Despite a marked risk gradient across PRS strata, standard preventive recommendations and statin prescription patterns did not distinguish those at elevated polygenic risk for CAD. The findings suggest that integration of genetic risk into conventional, guideline-based approaches may inform and enhance CAD primary prevention efforts.

Keywords

coronary artery disease; genetic risk; primary prevention; statin

Introduction

Despite continued advances in medical care, cardiovascular diseases - and in particular, coronary artery disease (CAD) - remain the leading cause of death in the United States (1). Over the last three decades, professional societies have consistently recommended escalation of CAD primary prevention efforts for asymptomatic middle-aged Americans at elevated CAD risk as determined by conventional risk factors and established clinical risk scoring schema.(2–4) Most recently, the 2018 American College of Cardiology (ACC)/American Heart Association (AHA) Guidelines for Blood Cholesterol Management recommended consideration of CAD "risk-enhancing factors" to adjudicate statin suitability for patients deemed to be at intermediate clinical risk.(5) Risk-enhancers include clinical factors that independently associate with CAD and confer a near two-fold risk of disease, such as family history of premature ASCVD, history of pre-eclampsia, and lipoprotein (a) concentration > 50mg/dL.(6–8) With accruing data on the population genetic determinants of CAD, and increased availability of both healthcare-associated and consumer-driven genetic testing - the latter now pursued by over 26 million individuals - a genetic predictor of CAD may serve as another risk-enhancing factor that is both broadly available and quantifiable early in life.(9)

A CAD "polygenic risk score" (PRS) captures the net, inherited susceptibility to CAD conferred by many common genetic variants as a single, quantitative risk factor following a normal distribution. PRS that quantify a genetic predisposition to CAD have been validated in multiple population-based cohorts.(10–12) Notably, ample data suggest that CAD PRS may identify subsets of the population more likely to benefit from lifestyle modifications and from statin therapy.(13–15),(16) More recently, the use of a genome-wide set of common genetic variants improved the prognostic capabilities of CAD PRS, particularly for identifying those with the highest genetic predisposition.(17) In addition, application of a genome-wide PRS to a large, population-based cohort demonstrated the potential discriminative benefit of a genome-wide CAD PRS when added to select clinical risk factors.(18)

Genetic risk prediction is a goal of precision medicine, desired by roughly 3 in 4 Americans, and is increasingly feasible in both healthcare-related and direct-to-consumer settings.(19), (20) In addition, direct-to-consumer testing services are more commonly providing polygenic risk predictions for numerous clinical conditions, including cardiometabolic diseases.(21,22) Therefore, there is broad interest in understanding how a CAD PRS may be incorporated into current guideline-based frameworks to inform clinical care.

When considering the clinical applicability of a CAD PRS for primary prevention of CAD, several important questions remain, including: (1) Does a CAD PRS retain its predictive capacity in the healthcare setting? (2) To what extent is high polygenic risk for CAD already captured by conventional paradigms for assessing clinical risk? (3) For whom and for how many might knowledge of high polygenic CAD risk alter contemporary clinical management? We therefore applied a genome-wide PRS to approximately 50,000 patients across three different U.S. healthcare systems to assess PRS performance in the context of contemporary clinical care. We next investigated whether individuals at high polygenic risk were identified by widely used, guideline-recommended tools for clinical risk assessment, and whether they received primary prevention statin therapy within the health care system.

Methods

Study Subjects

We assessed 47,108 individuals across the Partners Healthcare Biobank, the Penn Medicine Biobank, and the Mount Sinai Bio*Me* Biobank with genomic and clinical data, including linked electronic health record (EHR) data from hospitals affiliated with the Partners Healthcare System, the University of Pennsylvania Health System, and the Mount Sinai Health System, respectively (Supplemental Methods). All study participants provided informed consent according to local Institutional Review Board (IRB) protocols. Data analyses were supported by approved IRB protocols at Partners Healthcare, University of Pennsylvania Perelman School of Medicine, and Icahn School of Medicine at Mount Sinai.

Polygenic Risk Score Generation and Application to Biobanks

We recently developed a genome-wide PRS for CAD comprising 6,630,150 common (minor allele frequency >1%) genetic variants utilizing genetic data from a published GWAS of CAD and the LDPred computational algorithm, as previously described (Supplemental Methods) (17,23,24). We applied variant-specific weights from this score to study participants within the Partners Biobank, Penn Medicine Biobank, and Bio*Me* Biobank using the --score function in PLINK 2.0.(25) This algorithm weights the number of risk alleles *x* at each variant *i* by its respective LDPred-adjusted per-allele CAD log odds $\hat{\beta}$ and sums across *M* variants to generate a PRS ϕ for each study participant $j:\hat{\phi}_j = \sum_{i=1}^{M} \hat{\beta}_i \times x_{ij}$. Within each cohort, raw scores were mean centered and normalized by genetic ancestry. Prespecified PRS strata (top 5% and top 20%) were also defined within genetic ancestries for each cohort. Ancestry groups were then combined within cohorts to minimize the effect of ancestry-specific differences in raw scores (26).

Curation of Clinical Data

Disease phenotypes were curated from the EHR within each health system. Curated disease definitions were based on presence of an International Classification of Diseases (ICD)-9/ ICD-10 billing code or documented medication prescription as defined in Supplemental Table 1. Continuous traits - total cholesterol (TC), high-density lipoprotein cholesterol (HDL-C), low density lipoprotein cholesterol (LDL-C), systolic blood pressure (SBP), and body mass index (BMI) - were ascertained from the EHR in each health system; unless

otherwise noted, the most recent value (prior to a known statin prescription) was reported and utilized for clinical risk estimations. Outlier values and missing data were handled as described in the Supplemental Methods. Statin prescription data were ascertained from the EHR in a manner specific to each health system.

Clinical Risk Scores and Statin Indication

For individuals without known atherosclerotic cardiovascular disease (ASCVD) - defined as CAD, peripheral artery disease (PAD), and/or cerebral atherosclerosis - the ACC/AHA PCE was applied to calculate each participant's 10-year risk of an ASCVD event. Factors assessed in the PCE include age, gender, race, TC, HDL-C, SBP, hypertension treatment, diabetes, and smoking.(27) We first applied the PCE to those study participants with available input variables; in sensitivity analyses, we applied the PCE to all study participants using imputed trait values for any missing data (Supplemental Methods). Patients were divided into "Low", "Borderline", "Intermediate", and "High" clinical risk strata using the calculated PCE score per the 2018 ACC/AHA Guidelines for Blood Cholesterol Management and the 2016 USPSTF recommendations on statin use for primary prevention (Supplemental Table 2).(28)

Statistical Analyses

To validate the association of the CAD PRS with prevalent CAD in each health care system, logistic regression was performed adjusting for age, sex, and up to ten principal components of ancestry. An additional covariate representing genotyping array was included for Partners Biobank and Penn Medicine Biobank data. Principal components were used as covariates in logistic regression analyses to increase statistical power for true relationships and to minimize confounding by ancestry.(29) Inverse-variance weighted fixed-effects meta-analysis was used to combine study-specific effect estimates. Categorical variables are reported as frequencies and proportions, and between-group differences were assessed by Chi-squared or Fisher's exact test, as appropriate. Continuous variables are reported as means and compared with t-tests or Mann-Whitney U test, as appropriate. Cohort- and ancestry-specific risk discrimination for the CAD PRS was assessed by the area under the receiver operating characteristic curve (AUROC). All analyses were performed using R version 3.3.3 software (The R Foundation, Vienna, Austria); AUROC was calculated using the "pROC" package in R. We defined statistical significance as a two-tailed P < 0.05.

Results

Baseline Characteristics

Of the 47,108 study participants, most were women (53.5%) and of European genetic ancestry (62.0%), and mean age across all biobanks was 59.6 years. In total, there were 11,020 cases of CAD (23.4%), including 3,538 cases from the Partners Biobank (7.5%), 4,658 cases from the Penn Biobank (9.9%), and 2,824 cases from the Bio*Me* Biobank (6.0%) (Table 1).

Validation of genome-wide CAD PRS across health care systems

The CAD PRS strongly associated with CAD across the entire study population (OR=1.42 per 1-SD increase in the PRS; 95% CI: 1.38-1.46; p<0.0001). Effect estimates were consistent across biobanks, (range: OR=1.41 to 1.45 per SD increase in PRS; P_{heterogeneity}=0.57)(Figure 1). AUROC ranged from 0.59 to 0.61 across sites with separation of PRS distributions between CAD cases and controls (Supplemental Table 3; Supplemental Figure 1A). Individuals in the top 20% of the PRS distribution were at 1.9-fold odds of CAD compared to the remaining 80% of the population (95% CI: 1.8-2.0 for top 20% PRS), while those in the top 5% of the PRS distribution were at 2.3-fold odds of CAD compared to the remaining 95% of the population (95% CI: 2.0-2.5 for top 5% PRS) (Supplemental Figures 2 and 3).

Clinical risk stratification and guideline-based statin eligibility by PRS strata

Subsequent analyses compared PRS strata to determine whether current, guideline-based clinical risk assessments and practice patterns adequately distinguish individuals at elevated polygenic risk for CAD. Analyses were limited to study participants without ASCVD to reflect a primary prevention cohort warranting risk stratification to guide statin suitability. We first assessed the subset of participants with complete clinical data available for PCE calculation (N=20,628) before performing a sensitivity analysis on all participants without ASCVD (N=33,251) using imputed values for missing data.

A similar proportion of patients in the top 20% and the remaining 80% of the PRS distribution were classified as "Low" (43.0% versus 40.5%), "Borderline" (8.1% versus 9.3%), "Intermediate" (27.2% versus 27.2%), and "High" risk (21.7% versus 23.0%) by the PCE (Chi-square p-value for differences between PRS strata=0.01) (Figure 2A; Supplemental Table 4A). In sensitivity analyses, we observed comparable PCE risk distributions between individuals in the top 5% and bottom 95% of the CAD PRS (Supplemental Table 4A); and between high and low PRS strata when replacing missing with imputed values to permit assessment of all patients without ASCVD (Supplemental Table 4B).

Applying guideline-based criteria for statin eligibility, a comparable fraction of individuals in the top 20% versus the bottom 80% of the CAD PRS met ACC/AHA criteria (46.2% versus 46.8%; Chi-square p-value for differences between PRS strata=0.54) and USPSTF criteria (43.7% versus 43.7%; p=0.99) for primary prevention statin therapy (Figure 2B; Supplemental Table 5A and 6A). In sensitivity analyses, we observed similar rates of statineligibility between the top 5% and the bottom 95% of the PRS as assessed by ACC/AHA (44.3% versus 46.8%; p=0.17) and USPSTF criteria (42.4% versus 43.7%, p=0.46) (Supplemental Tables 5A and 6A); and similar rates of ACC/AHA and USPSTF statin eligibility between PRS strata after replacing missing with imputed values to permit assessment of all patients without ASCVD (Supplemental Figure 4B; Supplemental Tables 5B and 6B).

Contemporary management patterns by PRS strata

The overall statin prescription rate among study participants without ASCVD was 24.0%, with variability across healthcare systems - 25.1% in Partners Biobank, 43.1% in Penn Medicine Biobank, and 19.8% in Mt. Sinai Bio*Me* Biobank. Among participants in the top 20% of the PRS distribution, 25.0% had at least one documented statin prescription in the EHR, comparable to the 23.8% statin prescription rate among individuals in the remaining 80% of the PRS distribution (p=0.04) (Figure 3; Supplemental Table 7). Despite site-specific differences in statin prescription rates, we observed no significant differences between those in the top 20% and bottom 80% of the CAD PRS within Partners Biobank (26.9% versus 24.7%; p=0.06), Penn Medicine Biobank (42.2% versus 43.2%, p=0.61), and the Mt. Sinai Bio*Me* Biobank (20.9% versus 19.6%, p=0.07) (Supplemental Figure 5; Supplemental Table 7). In a secondary analysis, we observed no overall or site-specific differences in statin prescription rates between those in the top 5% and bottom 95% of the CAD PRS (Supplemental Table 7).

In total, 21,740 participants had at least one documented LDL-C assessment in the EHR, of which 13,205 (60.7%) had a minimum LDL-C < 100mg/dL. A similar proportion of top 20% PRS versus bottom 80% PRS individuals achieved a minimum LDL-C < 100mg/dL (59.2% versus 61.1%, p=0.03) (Figure 3; Supplemental Table 8). A secondary comparison of top 5% versus bottom 95% PRS strata showed no significant difference in the rates of attaining a minimum LDL-C < 100mg/dL (58.0% v. 60.9%, p=0.08).

PRS performance and clinical practice patterns by genetic ancestry

As recent studies have demonstrated variability in PRS performance by genetic ancestry, we assessed ancestry-specific differences in the CAD PRS, and in corresponding clinical risk stratification and management patterns. Although we observed separation of ancestryspecific PRS distributions between CAD cases and controls within each dataset (Supplemental Figure 1B), we focused our ancestry-specific analyses on Mt. Sinai BioMe, given appreciable non-European ancestry participants in this cohort. The PRS strongly associated with CAD in each of the three genetic ancestries tested within the Mt. Sinai BioMe Biobank. The strongest association was seen among individuals of European ancestry (OR=1.52 per 1-SD increase in the PRS; 95% CI: 1.46 – 1.58; p<0.0001; AUROC=0.63), followed by those of Hispanic (Admixed American) ancestry (OR=1.50 per 1-SD increase in the PRS; 95% CI: 1.44 – 1.57; p<0.0001; AUROC=0.63), and those of African ancestry (OR=1.29 per 1-SD increase in the PRS; 95% CI: 1.23 – 1.34; p<0.0001; AUROC=0.58). Across genetic ancestries, those in the top 20% of the CAD PRS distribution were at 1.6-fold (African-ancestry) to 2.1-fold (European ancestry) odds of CAD compared to the remaining 80% of the population (Supplemental Table 9). Despite ancestry-specific variability in score performance, we again observed no significant differences in PCE risk distributions or statin prescription rates between high PRS individuals and all others, irrespective of genetic ancestry (Supplemental Tables 10 and 11).

Use of the CAD PRS as a Risk-Enhancing Factor

The 2018 ACC/AHA Guidelines for Blood Cholesterol Management endorse the use of "risk-enhancing factors" to guide statin initiation in patients without ASCVD, diabetes

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mellitus or severe hypercholesterolemia (LDL-C > 190mg/dL) categorized as "Borderline" or "Intermediate" risk by the PCE (10-year risk of ASCVD event=5–20%). Risk-enhancing factors are those that independently associate with CAD and confer a near two-fold risk of disease. We observed a comparable level of risk among those in the top 20% of the CAD PRS - 1.9-fold odds of disease in our analysis. Therefore, in *post-hoc* analyses, we explored statin prescription rates among those at Borderline/Intermediate clinical risk, but high polygenic risk (top 20% of the PRS), to determine the fraction of patients for whom high polygenic risk might serve as a risk-enhancing factor for CAD and motivate primary prevention statin therapy within a guideline-supported framework.

Among participants without ASCVD, diabetes mellitus, or severe hypercholesterolemia (N=16,002), 5,890 (36.8%) were classified as Borderline or Intermediate risk by the PCE. Of these, 987 were in the top 20% of the CAD PRS (6.2% of the primary prevention population), and 652 (4.1% of the primary prevention population) did not have a statin prescription in the health care system. The percentage of patients at high polygenic risk, Borderline/Intermediate clinical risk, and without a statin prescription was comparable across the three health systems (3.5% to 4.3% of the primary prevention population) (Table 2). A sensitivity analysis replacing missing with imputed values for PCE estimates (N=27,921 patients without ASCVD, diabetes, or severe hypercholesterolemia), yielded a consistent proportion of untreated individuals at Borderline/Intermediate clinical risk, but high polygenic risk for CAD (4.1%) (Supplemental Table 12).

Discussion

Application of a genome-wide CAD PRS to nearly 50,000 patients across three contemporary healthcare-associated biobanks demonstrated robust and consistent associations with CAD. For those in the top 20% of the PRS distribution, levels of risk were akin to most CAD "risk-enhancing factors" endorsed by current ACC/AHA prevention guidelines. However, guideline-based recommendations and contemporary management patterns for the primary prevention of CAD did not differ by polygenic risk strata, suggesting under-recognition of individuals at high polygenic CAD risk within U.S. healthcare systems (Central Illustration).

Our findings permit several conclusions. First, we confirm that a genome-wide CAD PRS associates with CAD in healthcare settings. Prior validation studies have demonstrated strong associations between PRS and CAD in prospective, population-based cohorts, particularly as PRS have been derived from progressively larger GWAS and included a greater number of genetic variants (i.e. beyond those reaching genome-wide significance). (10–12,17,18) Here, we provide consistent estimates of CAD risk in three geographically distinct healthcare systems that may inform forthcoming efforts seeking to incorporate polygenic risk into routine clinical management. With the rise of healthcare-associated biobanks and greater access to provider- and consumer-driven genetic testing, broader application of the CAD PRS within the healthcare setting may enable earlier identification and management of patients at the highest-risk for CAD.

Second, current, guideline-based strategies for estimating CAD risk do not account fully for an inherited susceptibility to CAD. Recent analyses have yielded conflicting conclusions on the clinical utility of a CAD PRS for middle-aged adults beyond the PCE. Two studies showed modest improvements in risk discrimination (C-statistic) when the CAD PRS was added to the PCE in three population-based cohorts - Atherosclerosis Risk in Communities (ARIC), Multiethnic Study of Atherosclerosis (MESA), and UK Biobank.(30,31) A third analysis found similar changes in the C-statistic in the UK Biobank and the Malmo Diet and Cancer Study (MDCS); however, this study also demonstrated a striking gradient of longitudinal risk when considering the CAD PRS within each guideline-supported PCE risk category ("Low", "Borderline", "Intermediate" and "High" risk). Specifically, a two- to fourfold difference in cumulative incidence was noted across PRS strata, suggesting the ability of the CAD PRS to refine long-term prognoses even within these well-established clinical risk groups.(32)

Here, we extend such assessments of risk prognostication by intersecting a CAD PRS with guideline-based recommendations and management patterns to highlight the underrecognition of these at-risk patients within U.S. healthcare systems. While a prior study demonstrated discrepancies in classification between ACC/AHA and USPSTF criteria for determining statin eligibility, in our analysis, neither criteria differentiated between strata of the CAD PRS.(33) As assessed in the context of these widely-used algorithms, we provide evidence from health systems that polygenic CAD risk is orthogonal (i.e. independent of and complementary) to risk captured by conventional clinical factors. That relevant management patterns did not differ between PRS strata suggests that contemporary clinical practice - the composite of guideline-based and non-guideline-based approaches - is not reflective of patients' polygenic risk for CAD.

Notably, despite ancestry-specific differences in PRS performance, our study indicates that polygenic risk for CAD remains under-recognized across genetic ancestries. Recent analyses highlighted the underperformance of PRS when applied to those of non-European descent, likely due to derivation of PRS from GWAS enriched for individuals of European genetic ancestry.(34) We previously reported on the ancestry-specific differences of the CAD PRS in a multi-ethnic cohort,(35) and now recapitulate these ancestry-specific differences within the healthcare setting. Nevertheless, in the current study, the CAD PRS strongly associated with disease in individuals of African and Hispanic (Admixed American) ancestry, conferring 1.6- to 2.0-fold odds of disease among those in the top 20% of the PRS risk distribution. Furthermore, among those of non-European ancestry, the PCE did not identify individuals at high PRS nor were there more statin prescriptions among those at high PRS, similar to observations in European-ancestry participants. While additional efforts are required to develop more robust ancestry-specific PRS, our data suggest that current implementation of the CAD PRS may be of broad benefit by capturing currently unmeasured risk across diverse genetic ancestries.

Third, consideration of a CAD PRS alongside current, guideline-based practices may influence management for a subset of primary prevention patients in whom clinical uncertainty remains after implementing standard prevention algorithms. While setting an "optimal" cutpoint for a continuous marker such as the PRS is inherently subjective, in our

prior, *post hoc* analyses of statin randomized controlled clinical trials, we demonstrated that those in the top 20% of a CAD PRS derived greater relative and absolute benefit from statin therapy.(14,15) Within the context of the 2018 ACC/AHA Blood Cholesterol Guidelines, clinical parameters that associate with a roughly two-fold risk of CAD and are orthogonal to traditional risk factors (including lipoprotein (a) concentration > 50mg/dL and high-sensitivity C-reactive protein 2.0mg/L) are incorporated as risk-enhancing factors, which are used to guide statin eligibility for patients at borderline-intermediate clinical risk.(5) Notably, in the abovementioned analysis of UK Biobank and MDCS, those in the top 20% of the CAD PRS were also at >2-fold hazards of incident disease, including among borderline-intermediate PCE risk groups.

In the current analysis, high polygenic risk again proved orthogonal to conventional clinical algorithms, and the top 20% of the CAD PRS distribution associated with a similar, near two-fold risk of CAD. Taken together across three healthcare settings, we observed that 1 in 25 primary prevention patients may newly be suitable for a statin prescription if polygenic risk were used as a CAD risk-enhancer to inform clinical decision-making for those in whom guideline-based recommendations are unclear. In a recent analysis of ~50,000 participants from the Geisinger Health System, whole exome sequencing identified ~ 1 in 625 individuals with familial hypercholesterolemia (FH) not prescribed statin therapy.(36) Coupled with this prior study, our findings support the clinical translation of human genetic data to better identify and treat both monogenic (i.e. FH) and polygenic drivers of CAD risk. As high CAD PRS is more common than FH, and less recognizable by clinical risk factors - i.e. severe hypercholesterolemia - the impact of polygenic testing for population-wide efforts at disease prevention may be particularly profound.

Accordingly, although we do not anticipate that a CAD PRS will influence management for the majority of primary prevention patients, it may indeed be helpful - and akin to other CAD risk-enhancing factors - when there is clinical uncertainty. However, a unique strength of a CAD PRS is that it may be available early in life and need only be assessed once. As 10-year absolute CAD risk increases with age and the acquisition of clinical risk factors, earlier knowledge of a CAD PRS may prompt timelier initiation of preventive strategies.

Study Limitations

First, disease phenotypes were predicated on data from the EHR, which carry the potential for phenotype misclassification. Second, clinical data were limited to that obtained within each health system, and therefore, diagnoses and medical care received elsewhere may have gone unrecognized; however, given consistent effect estimates for the association of CAD PRS with CAD across three health systems, such differences are unlikely to have influenced our findings. Third, availability of data on specific risk-enhancers - as outlined in the 2018 ACC/AHA guidelines - was limited precluding a comprehensive analysis of these factors. Fourth, in *post-hoc* analyses, we modeled the top 20% of the PRS as a CAD risk-enhancing factor, whereas using different PRS cutoffs would affect different proportions of the health system. However, we endeavored to inform this somewhat subjective decision using a guideline-supported framework - two-fold risk and orthogonal to traditional risk factors. While our current and prior analyses (across contemporary healthcare settings,

epidemiologic cohorts, and randomized controlled trials) suggest that statins mitigate risk conferred by an elevated polygenic susceptibility to CAD, dedicated placebo-controlled, PRS-stratified statin clinical trials are required to confirm this hypothesis and to estimate treatment effect. Fifth, biobank volunteer participants may not be representative of their respective health care systems and the population at large, which may influence the generalizability of these study findings. Efforts to harmonize PRS interpretation, including healthcare system and ethnicity normalization and individual-level percentiles, are necessary to support evaluations of generalizability and clinical utility. Finally, given the varied performance of PRS across different ancestries, validation of our analysis is required in larger, non-European cohorts.

Conclusions

A genome-wide PRS demonstrated strong and consistent associations with CAD across three U.S. healthcare systems. Polygenic risk for CAD was not fully captured by guideline-based clinical risk algorithms, and was not reflected in contemporary practice patterns. Given increasing availability of a CAD PRS to healthcare-associated biobank researchers and consumers of direct-to-consumer genetic testing, prior and present observations may support focused incorporation of CAD PRS into guideline-based primary prevention algorithms. A prospective clinical trial may be warranted to determine whether targeted prevention efforts in those at high polygenic risk for CAD will improve clinical outcomes.

Supplementary Material

Refer to Web version on PubMed Central for supplementary material.

Acknowledgments:

The data, analytic methods, and study materials will be made available for purposes of replicating the results, with approval from the appropriate Institutional Review Board and appropriate collaboration/data sharing agreements. Genotyping of Bio*Me* was performed in collaboration with Regeneron Genetics Center. Regeneron Genetics Center assisted with the collection, management, and analysis of the genetic data and approval of the final manuscript; they had no input as to the design and conduct of the study, the interpretation of the data, and preparation, review, or decision to submit the manuscript for publication. Aayushee Jain B.S., Arden Moscati Ph.D., Gillian Belbin Ph.D, Lisheng Zhou Ph.D., Michael Preuss Ph.D., Quingbin Song Ph.D., Stephane Wenric Ph.D., and Steve Ellis M.S., all of whom are affiliated with the Icahn School of Medicine at Mt. Sinai, assisted with quality control and/or file handling for the Bio*Me* genome-wide genotyping data. Data analysis was performed by K.G.A., R.J., A.D., M.C., and K.C. P.N. (Partners), S.M.D. (Penn), and R.D. (Bio*Me*) had full access to all of the respective data in the study and take responsibility for the integrity of the data and the accuracy of the data analysis.

DISCLOSURES:

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Abbreviations:

CAD	coronary artery disease
PRS	polygenic risk score
ASCVD	atherosclerotic cardiovascular disease
ACC	American College of Cardiology
АНА	American Heart Association
USPSTF	United States Preventive Services Task Force
РСЕ	Pooled Cohort Equations

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PERSPECTIVES

Competency in Medical Knowledge:

Current guideline-based strategies for the primary prevention of CAD do not account for an elevated genetic predisposition to disease.

Translational Outlook:

Further investigations are required to assess whether integration of genetic risk into conventional, guideline-based approaches for CAD primary prevention will improve clinical outcomes.

Study Cohort	N _{cases} / N _{total}		OR 95% CI	p Value
Partners	3,538 / 13,667	-	1.41 [1.34 to 1.47]	<0.0001
Penn Medicine	4,658 / 9,070		1.45 [1.38 to 1.52]	<0.0001
Mount Sinai BioMe	2,824 / 24,371		1.42 [1.35 to 1.48]	<0.0001
Composite	11,020 / 47,108	•	1.42 [1.38 to 1.46]	<0.0001
	0.75	1 1.5		
	OR per 1-SD Ir	crease in CAD PRS		

Figure 1. Association of coronary artery disease polygenic risk score with coronary artery disease across three healthcare systems.

Logistic regression was used to test the association of a one standard deviation increase in a genome-wide CAD PRS with prevalent CAD in the Partners Biobank, Penn Medicine Biobank, and the Mt. Sinai Bio*Me* Biobank. Logistic regression models were adjusted for age, sex, and the first 5 principal components of ancestry. In the Partners Biobank, an additional adjustment for genotyping array was included. Principal components of ancestry were based on observed genotypic differences across subpopulations (i.e., race or ethnicity) within each overall study. Fixed-effects meta-analysis was used to combine results across cohorts (P_{heterogeneity}=0.57). Cohort-specific participant numbers and CAD case counts are displayed. CAD case counts represent the sum total of disease at baseline and incident disease. Abbreviations: CAD=coronary artery disease; CI=confidence interval; OR=odds ratio; PRS=polygenic risk score; SD=standard deviation.

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Figure 2. Guideline-based clinical risk estimation and statin-eligibility by strata of CAD PRS. Among primary prevention patients without atherosclerotic cardiovascular disease and with available clinical data (N=20,628), individuals in the Top 20% versus the Bottom 80% of the CAD PRS were compared with respect to: (A) Clinical risk as defined by the ACC/AHA Pooled Cohort Equations (PCE); and (B) Statin-eligibility as defined by the 2018 ACC/AHA Guidelines on Blood Cholesterol Management and the 2016 USPSTF guidelines for primary prevention statin therapy. Abbreviations: ACC=American College of Cardiology; AHA=American Heart Association; CAD=coronary artery disease; PRS=polygenic risk score; USPSTF=United States Preventive Services Task Force.



Figure 3. Management patterns by strata of CAD PRS.

Among primary prevention patients without atherosclerotic cardiovascular disease (N=33,251), individuals in the Top 20% versus the Bottom 80% of the CAD PRS were compared with respect to rates of statin prescriptions (Statin RX), and attainment of LDL-C < 100mg/dl. Abbreviations: CAD=coronary artery disease; LDL-C=low-density lipoprotein cholesterol; PRS=polygenic risk score.



Central Illustration. Conventional clinical parameters do not distinguish patients at high polygenic risk for coronary artery disease.

Abbreviations: ACC=American College of Cardiology; AHA=American Heart Association; CAD=coronary artery disease; LDL-C=low-density lipoprotein cholesterol; PRS=polygenic risk score; USPSTF=United States Preventive Services Task Force.

Baseline characteristics of study populations.

Study characteristics	Partners Healthcare Biobank (N = 13,667)	Penn Medicine Biobank (N = 9,070)	Mt. Sinai Bio <i>Me</i> Biobank (N = 24,371)
Age	60 (17)	68 (14)	57 (18)
Female gender, n (%)	7,523 (55.0%)	3,711 (41.0%)	13,961 (57.3%)
Genetic ancestry			
African (AFR)	867 (6.3%)	1927 (21.2%)	6,979 (28.6%)
Ad Mixed American (AMR)	799 (5.9%)		7,048 (28.9%)
East Asian (EAS)	167 (1.2%)		
European (EUR)	11,725 (85.8%)	7143 (78.8%)	10,344 (42.4%)
South Asian (SAS)	109 (0.8%)		
Body mass index, kg/m ²	31.5 (8.3)	29.3 (6.8)	28.3 (6.9)
Systolic blood pressure, mmHg	127 (16)	126 (19)	127 (20)
Smoking status, ever, n (%)	4,807 (35.2%)	4,366 (48.1%)	4,251 (17.4%)
Hypertension, n (%)	7,272 (46.9%)	6,632 (73.1%)	9,322 (38.3%)
Diabetes Mellitus, n (%)	2,966 (21.7%)	2,868 (31.6%)	5,204 (21.4%)
Coronary Artery Disease, n (%)	3,538 (25.9%)	4,658 (51.4%)	2,824 (11.6%)
Peripheral Artery Disease, n (%)	1,427 (10.4%)	1,736 (19.1%)	1,679 (6.9%)
Cerebrovascular disease, n (%)	1,439 (10.5%)	649 (7.2%)	862 (3.5%)
Total Cholesterol, mg/dL	177 (42)	175 (40)	179 (45)
LDL-C, mg/dL	97 (34)	99 (33)	100 (37)
HDL-C, mg/dL	56 (19)	50 (16)	57 (23)
Triglycerides, mg/dL	120 (65)	141 (83)	144 (77)

 $Values \ are \ presented \ as \ mean \ (standard \ deviation) \ unless \ otherwise \ noted. \ Abbreviations: \ HDL-C = high-density \ lipoprotein \ cholesterol; \ LDL-C = low-density \ lipoprotein \ cholesterol.$

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CAD PRS as a guideline-based CAD risk-enhancing factor.

Abbreviations: CAD = coronary artery disease; LDL-C = low-density lipoprotein cholesterol; PCE = Pooled-Cohort Equations; PRS = polygenic risk Primary prevention patients without atherosclerotic cardiovascular disease, diabetes mellitus, or LDL-C > 190 (N = 16,002) stratified on the basis of Borderline/Intermediate clinical risk (by Pooled-Cohort Equations), high CAD polygenic risk strata (top 20% PRS), and lack of statin therapy. score.

	Partners Healthcare Biobank (N = 4,190)	Penn Medicine Biobank (N = 1,337)	Mt. Sinai BioMe Biobank $(N = 10,475)$	$\begin{array}{l} Composite \\ (N = 16,002) \end{array}$
Borderline / Intermediate PCE Risk, N (%)	1,490 (36%)	614 (46%)	3,786 (36%)	5,890 (37%)
+ Top 20% CAD PRS, N (%)	237 (5.7%)	108 (8.1%)	642 (6.1%)	987 (6.2%)
+ No Statin Prescription, N (%)	146 (3.5%)	53 (4.0%)	453 (4.3%)	652 (4.1%)