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External validation of the QLifetime cardiovascular risk prediction tool: population cohort study

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1 Abstract

Background: Prediction of lifetime cardiovascular disease (CVD) risk is recommended in many clinical
guidelines, but lifetime risk models are rarely externally validated. The aim of this study was to
externally validate the QRiskLifetime incident CVD risk prediction tool.

Methods: Independent external validation of QRiskLifetime using Clinical Practice Research Datalink
data, examining discrimination and calibration in the whole population and stratified by age, and
reclassification compared to QRISK3. Since lifetime CVD risk is unobservable, performance was
evaluated at 10-years' follow-up, and lifetime performance inferred in terms of performance for in
the different age-groups from which lifetime predictions are derived.

10 **Results:** 1,260,329 women and 1,223,265 men were included in the analysis. Discrimination was

11 excellent in the whole population (Harrell's-C=0.844 in women, 0.808 in men), but moderate to poor

12 stratified by age-group (Harrell's C in people aged 30-44 0.714 for both men and women, in people

13 aged 75-84 0.578 in women and 0.556 in men). 10-year CVD risk was under-predicted in the whole

population, and in all age-groups except women aged 45-64, with worse under-prediction in older

15 age-groups. Compared to those at highest QRISK3 estimated 10-year risk, those with highest lifetime

risk were younger (mean age: women 50.5 vs 71.3 years; men 46.3 vs 63.8 years) and had lower

17 systolic blood pressure and prevalence of treated hypertension, but had more family history of

18 premature CVD, and were more commonly minority ethnic. Over 10-years, the estimated number

19 needed to treat (NNT) with a statin to prevent one CVD event in people with QRISK3≥10% was 34 in

20 women and 37 in men, compared to 99 and 100 for those at highest lifetime risk.

21 Conclusions: QRiskLifetime underpredicts 10-year CVD risk in nearly all age-groups, so is likely to

22 also underpredict lifetime risk. Treatment based on lifetime risk has considerably lower medium-

23 term benefit than treatment based on 10-year risk.

24

26 Background

27 Although the incidence of cardiovascular disease (CVD) has fallen in most developed countries over 28 the last 30 years, CVD remains one of the most common causes of morbidity and mortality 29 worldwide. Prevention of CVD is therefore a policy priority, and a key practical question is who 30 should be targeted for pharmacological primary prevention. In relation to initiation of statins, risk 31 prediction tools are usually recommended by guidelines for the primary prevention of CVD to target 32 treatment at people above a specified threshold of predicted risk. Prediction tools typically predict 33 either over a fixed time (often ten years) or over a lifetime. Lifetime risk prediction is argued to be more appropriate in younger people who may not exceed a particular 10-year risk threshold even 34 35 though they have markedly unfavourable CVD risk profiles (mitigated in the short-term by being young) and are at high risk of premature CVD beyond 10-years.¹⁻⁵ Lifetime risk models also 36 37 appropriately account for competing mortality risk, which is ignored and a cause of over-prediction in many CVD risk prediction tools.⁶⁻⁸ Lifetime CVD risk prediction tools are recommended to guide 38 39 treatment in several international guidelines, although there is no consensus on what threshold of 40 lifetime risk should trigger an offer of statin treatment.¹ Lifetime risk prediction is not currently recommended for CVD risk stratification by the National Institute for Health and Care Excellence 41 (NICE),⁹ but NICE have identified lifetime risk prediction as a topic to examine further in a future 42 guideline update.¹⁰ In the UK, the QRiskLifetime prediction tool is available as a standalone web-43 based tool¹¹ or as the risk engine underlying the Joint British Societies risk calculator (JBS3)² and 44 heart age¹² tools. 45

External validation of CVD risk prediction tools is needed before they are widely implemented, but 46 47 lifetime models are difficult to validate since observational datasets do not have lifetime follow-up. 48 The same is also true in the datasets used to derive lifetime risk prediction, including the QRiskLifetime derivation dataset.³ In derivation, lifetime CVD risk is therefore estimated by using 49 50 shorter-term observed CVD rates at different ages to infer what would happen to someone in the 51 future, under the assumption that age-specific incidence of CVD will not change in the meantime. The same effectively applies in validation, which can only be done over shorter time-scales,^{3,5} with 52 53 true lifetime performance inferred by performance in different age-groups. The aim of this paper is to externally validate the QRiskLifetime CVD prediction model in a large UK primary care dataset 54 55 using a 10-year time horizon, and to explore recalibration compared to QRISK3.

56 Methods

The overall design of the study is an independent external validation of a risk prediction (prognosis)
model, designed and reported consistent with TRIPOD guidelines.¹³

59 Data source and population. Analysis used Clinical Practice Research Datalink (CPRD) Gold),¹⁴ which 60 includes linked primary care, hospital and mortality data. Patients were eligible if they: were 61 permanently registered with a practice contributing up-to-standard data for at least one year and 62 with linkage to Hospital Episode Statistics (HES) discharge and Office of National Statistics (ONS) 63 mortality data, and had no prior history of CVD or statin treatment. Cohort entry was defined as the 64 latest of 01/01/04, a patient's 30th birthday, or contribution of up-to-standard data for at least 1 year. Cohort exit was the earliest of: first CVD event; death; prescription of a statin; deregistration 65 from the practice; end of data collection from the practice; or end of study on 31/3/16. All outcomes 66 67 and predictors were recorded as part of routine clinical care, and therefore recorded blind to the 68 study hypothesis. No formal power calculation was done, as the study size is determined by the data available in CPRD which was considered sufficient.¹⁵ 69

Outcomes. A first CVD event was defined as the earliest recording of any fatal or non-fatal coronary
 heart disease (CHD), ischaemic stroke, or transient ischaemic attack, recorded as ICD-10 codes in
 HES admissions or as the underlying cause of death in ONS death registration data, or as Read codes
 in GP electronic health records. ICD-10 and Read codes defining outcomes are those used in QRISK3
 derivation¹⁶ (detailed in a previous paper⁶).

75 Prediction model. We used publicly available QRISK®-lifetime-2011 software to calculate 76 QRiskLifetime scores for each patient to age 95 and additionally constrained to a 10-year prediction 77 horizon (under GNU Lesser General Public Licence v3). Predictor variables including body mass index, 78 smoking, cholesterol and blood pressure were ascertained from GP electronic health records. All 79 predictor variables are listed in Table 1. Our cohort matched the QRiskLifetime derivation sample 80 and methods with some exceptions, namely: (1) We used a cohort entry date of 1/1/04 rather than 81 1/1/98; (2) When calculating baseline values, the derivation paper included cholesterol values 82 measured after cohort entry, whereas we only included cholesterol values measured before cohort 83 entry; and (3) Individual Townsend deprivation scores were not available, so we used the median of 84 the vigintile (equal 20th) of score that an individual lived in. Predictor codesets used and methods of 85 data handling have been previously published.⁶

Missing data. Supplementary table S1 details the extent of missing data and how missingness was
handled. Multivariate Imputation by Chained Equations¹⁷ was used to generate five imputed
datasets for missing body mass index (BMI), total cholesterol:HDL cholesterol ratio (TC:HDL), systolic
blood pressure (SBP), and smoking status. Analyses of these datasets were combined using Rubin's
rules¹⁸ to give summary point estimates with confidence limits that reflect the added uncertainty
associated with imputing missing values.

92 *Statistical methods*. The lifetime (to age 95) and 10-year risk of experiencing a cardiovascular event

93 was calculated for each patient using QRISK[®]-lifetime-2011 software without recalibration. The

94 performance of the risk score was assessed by examining discrimination and calibration of the model

95 over a 10-year time horizon, in the whole population and stratified by age-group and Charlson

96 Comorbidity Index (CCI) at study entry.¹⁹

97 Discrimination is the ability of the risk score to differentiate between patients who experience a CVD

98 event during follow-up and patients who do not. Discrimination was evaluated using Harrell's C-

99 statistic (a C-statistic of 1 indicates perfect discrimination, whereas a C-statistic of 0.5 indicates

100 discrimination no better than chance; we interpreted values >0.8 as showing excellent

discrimination, 0.6-0.79 as moderate, and 0.5-0.59 as poor), Royston and Sauerbrei's D statistic

102 (higher values indicate greater discrimination) and an R-squared statistic of explained variation in

103 censored survival data.^{20,21}

104 Calibration refers to how closely predicted risk and observed probabilities agree at group-level. This 105 was assessed for equally-sized groups of participants ranked by predicted risk. Calibration of the risk 106 score predictions was assessed by plotting observed proportions with an event versus predicted 107 probabilities. Since QRiskLifetime accounts for competing mortality risk, we evaluated calibration 108 using the Aalen-Johansen estimator of observed risk which accounts for the competing risk of non-CVD death and therefore estimates the cumulative incidence of CVD.²² Calibration plots were 109 110 generated separately by sex for all patients and for subgroups of age and modified Charlson 111 Comorbidity Index.

112 Consistent with the validation of QRiskLifetime over a 10-year time horizon, we examined changes in 113 which patients were recommended for treatment based on either QRISK3 or QRiskLifetime 10-year 114 predicted risk of ≥10% (the threshold recommended by the UK National Institute for Health and Care 115 Excellence²³). We calculated the Net Reclassification Index (NRI) with bootstrapped 95% confidence 116 intervals at the 10-year 10% predicted risk threshold. NRI was calculated for people experiencing a 117 CVD event (NRI+), for people not experiencing a CVD event (NRI-) and overall (NRI). NRI examines 118 the extent to which using QRiskLifetime is better at classifying cases who experience the event as 119 high-risk (10-year risk \geq 10%) and non-cases as low risk (10-year risk <10%). Since there is no 120 recommended threshold of lifetime risk at which to define an individual as high-risk, we also 121 compared which patients were recommended for treatment by QRISK3 at the 10% threshold and by 122 QRiskLifetime using a threshold defined to identify the same number of patients (ie if QRISK3 123 recommended 19.0% of patients for treatment, we selected the 19.0% of patients at highest lifetime 124 risk). For both comparisons, we examined the characteristics of patients recommended for

- 125 treatment, the observed risk of CVD at 10 years, and the number needed to treat (NNT) to prevent
- one new CVD event assuming all people recommended for treatment actually took a statin assuming
- a relative risk reduction of 25% for new CVD events. All models were fitted in R v4.1.0.
- 128

129 Results

- 130 There were 1,260,329 women with mean age 49.3 (SD 14.2) years and 1,223,265 men with mean
- age 47.6 (SD 13.0) years in the external validation cohorts. Compared to the QRiskLifetime internal
- validation cohort,³ there was: a larger proportion of people from minority ethnic backgrounds; fewer
- 133 people with a recorded family history of premature CVD; a higher proportion of treated
- 134 hypertension; and somewhat higher proportions of atrial fibrillation and chronic kidney disease
- 135 (table 1). There were higher proportions with missing data in this study than the original study, likely
- reflecting the use of data recorded after cohort entry date in the derivation study (supplementary
- 137 table 1).
- 138 Median follow-up was 5.7 (interquartile range [IQR] 2.2-10.2) years in women and 5.2 (IQR 2.0-9.3)
- 139 years in men, similar to the QRISK3 cohort.¹⁶ Crude incidence of CVD was higher in men than women
- 140 (7.5 vs 5.5 CVD events/1000 person-years), and increased markedly with age (supplementary table
- 141 S2). Non-cardiovascular death had similar incidence to CVD in women, whereas in men incident
- 142 cardiovascular disease was more common in men up to age 65-69 years, with non-cardiovascular
- 143 more common subsequently (supplementary table S3 and figure S1).
- 144 In the entire population over 10-years, QRiskLifetime discrimination was excellent in both women
- 145 (C=0.844 in this study vs area under receiver operating curve [AUROC] 0.842 in original study
- 146 internal validation³) and men (C=0.808 vs AUROC=0.828 in internal validation³) (table 2). However,
- 147 when stratified by age, discrimination was only moderate in younger age-groups and was poor in
- people aged 75-84 (C=0.578 in women, 0.556 in men). Stratified by CCI, discrimination was excellent
- in people with low morbidity (CCI=0 or 1) but only moderate in people with high morbidity (in
- 150 women with CCI=3+, C=0.724; in men with CCI=3+, C=0.656).
- 151 In the whole population over 10-years, there was reasonable calibration (with some under-
- 152 prediction) in the eight deciles of lowest predicted risk with QRiskLifetime, but considerable under-
- 153 prediction in the two deciles of highest predicted risk (figure 1). Stratified by age (figure 2),
- 154 calibration was good in people aged 45-64, with under-prediction in all other age-groups which was
- largest in people aged 75-84. Stratified by CCI, there was under-prediction at all levels of morbidity
- 156 which was more marked at higher levels of predicted risk and at higher levels of multimorbidity
- 157 (figure 3).

158 In the reclassification analysis (tables 3-5), compared to QRISK3, QRiskLifetime classified fewer

- 159 people as having 10-year risk ≥10%. QRISK3 classified 239,396 (19.0%) women as high-risk,
- 160 compared to 194,411 (15.4%) women classified as high-risk by QRiskLifetime over 10-years. QRISK3
- 161 classified 341,962 (28.0%) men as high-risk, compared to 276,369 (22.6%) men classified as high-risk
- by QRiskLifetime over 10-years (table 3). 15.1% of women were classified as high-risk (≥10% over 10-
- 163 years) by both tools, 3.9% as only high-risk by QRISK3 and 0.3% as only high-risk by QRiskLifetime
- 164 (with the remaining 80.7% <10% on both scores). 21.9% of men were classified as high-risk (≥10%
- 165 over 10-years) by both tools, 6.1% as only high-risk by QRISK3 and 0.7% as only high-risk by
- 166 QRiskLifetime.
- 167 In women, compared to QRISK3, QRISKLifetime slightly improved classification in those who did not
- 168 experience an event (Net Reclassification Index NRI- = 0.035, 95% CI 0.034 to 0.035), but worsened
- 169 classification in those who did experience an event (NRI+ = -0.080, 95% CI -0.082 to -0.077), with
- 170 overall NRI -0.045 (95% confidence interval -0.047 to -0.042; in other words, overall 4.5% of
- 171 participants are incorrectly reclassified). In men, compared to QRISK3, QRISKLifetime slightly
- improved classification in those who did not experience an event (NRI- = 0.054, 95% CI 0.054 to
- 173 0.054), but worsened classification in those who did experience an event (NRI+ = -0.083, 95% CI -
- 174 0.084 to -0.082), with overall NRI -0.029 (95% confidence interval -0.030 to -0.028).
- Those recommended for treatment by QRiskLifetime based on 10-year risk were slightly older than those recommended by QRISK3, but patient characteristics were otherwise similar (table 5). Fewer people were recommended for treatment by QRiskLifetime based on 10-year risk but the percentage experiencing an event was higher (estimated number needed to treat (NNT) from statin prescription to prevent one event in women 34 for QRISK3 vs 30 for QRiskLifetime; for men 37 vs 33).
- 180 By design, thresholds of predicted lifetime risk for "recommending treatment" were chosen so that 181 exactly the same number of people at highest lifetime risk were identified as were identified by 182 QRISK3 10-year risk ≥10% (table 4). Both tools therefore "recommended" 19.0% of women and 183 28.0% of men for treatment. Only 5.3% of all women were identified as high-risk by both tools, with 184 a different 13.7% identified as high-risk by one or other of the prediction tools. Similarly, 8.9% of 185 men were identified as high-risk by both prediction tools and a different 19.1% by one or other of 186 the tools. Compared to people identified as high-risk by QRISK3, those with highest predicted 187 lifetime risk were much younger, had lower mean systolic blood pressure, and a lower proportion 188 with treated hypertension, but much higher proportions with family history of premature CVD and 189 from a minority ethnic background, and somewhat higher mean total cholesterol:HDL cholesterol 190 ratio and BMI (table 5). Compared to those recommended for treatment based on 10-year predicted

- risk, there were fewer CVD events observed in people at the highest predicted lifetime risk, and the
- estimated NNT to prevent one CVD event from statin treatment was 99 in women and 100 in men.

193 Discussion

Similar to the internal validation study,³ this independent evaluation of the QRiskLifetime CVD risk prediction tool finds that it has excellent discrimination in the whole population over a 10-year prediction horizon, but discrimination is poor to moderate in age and CCI subgroups. In terms of calibration over a 10-year prediction horizon, there was some under-prediction in the whole population. Stratified by age, calibration was excellent in women aged 45-64 and good in men aged 45-64, but there was considerable under-prediction in other age-groups which was larger in younger people at higher risk and in all older people.

Over a 10-year prediction horizon at the 10% risk threshold recommended by NICE,⁹ QRiskLifetime
recommended fewer people for statin treatment (15.4% of women and 22.6% of men) than QRISK3
(19.0% of women and 28.0% of men), although the estimated NNT to prevent one CVD event over
10-years was slightly lower for QRiskLifetime.

205 Comparing those recommended for treatment by QRISK3 predicted 10-year risk \geq 10% versus the 206 same proportion at highest estimated lifetime risk by QRiskLifetime, the populations recommended 207 for treatment were markedly different, with those at highest predicted lifetime risk being 208 considerably younger, being much more likely to have a family history of premature CVD and be 209 from a minority ethnic background. Treating the same number of patients at highest predicted 210 lifetime risk as the number with QRISK3 10-year risk \geq 10%, the estimated NNT with a statin to 211 prevent one CVD event over 10 years was approximately three times higher compared to QRISK3 (in 212 women 99 vs 34; in men 100 vs 37). Any benefit of treating those at the highest lifetime rather than 213 the highest 10-year CVD risk is therefore considerably deferred.

214 Important strengths of the study are the use of population data and study design, conduct and reporting consistent with methodology recommendations,^{13,24} publishing all codesets used,⁶ 215 216 accounting for competing mortality risks, and examining performance in key subgroups. Key 217 limitations are those common to studies using linked routine data. In the context of lifetime risk 218 prediction, the most important of these is the relatively short follow-up of study participants 219 although this is similar to other studies in this context. Constraining validation to events observed 220 over ten years therefore does not allow evaluation of the potential benefit of longer-term prediction 221 in younger people. However, even if data were available, then evaluating model performance over 222 20 or more years may reduce applicability to contemporary risk prediction given declining secular 223 trends in age-standardised incident CVD. A further limitation is the high proportion of people with

missing data. As with the derivation study and other studies, we used multiple imputation but the assumption that data is missing at random may be incorrect.^{6,25}

Brotons et al also found substantial differences in who was recommended for treatment by 10-year
vs lifetime risk prediction tools, but did not validate lifetime predictions.⁴ Like QRiskLifetime, the
LIFE-CVD risk prediction tool estimates both 10-year and lifetime CVD risk. LIFE-CVD derivation was
in a US dataset, with validation in several European cohorts, with reasonable discrimination and
whole population calibration at 10-years follow-up.⁵ However, unlike this study, calibration was not
examined stratified by age and if calibration is less good in older people, then the implication would
be that lifetime estimates are also not well calibrated.

- 233 Guidelines currently only recommend lifetime CVD risk prediction as an adjunct to 10-year risk
- prediction,¹ but without specifying any risk thresholds for action. In the absence of lifetime follow-up
- data and in the context of falling age-standardised rates of incidence CVD, there is no way to directly
- evaluate how well lifetime estimates perform, but given the observed under-prediction over 10-
- 237 years in every age-group in this study, we believe that QRiskLifetime is likely to under-predict risk
- 238 over a lifetime. It is unclear whether similar issues apply to other lifetime risk tools because
- calibration has not been examined in subgroups of age.^{5,26} More broadly, for all CVD risk prediction,
- excellent discrimination and calibration in the whole population does not mean that discrimination
- and calibration are good enough in important subgroups,²⁷ and validation should explore subgroup
 performance.⁶

243 Even if a lifetime prediction tool were well calibrated in different age-groups, lifetime risk prediction 244 requires an assumption that future risk in younger people will be the same as the risk observed in 245 older people now. Given large falls in CVD incidence in recent decades and continuing change in CVD 246 risk profiles (declining smoking but increasing obesity and diabetes), this assumption is a very strong 247 one. Furthermore, although lifetime expected benefit is greater if treatment is started at a younger 248 age, this study finds that the expected benefit in the medium-term (over 10-years) is considerably 249 smaller. Given the lack of direct evidence, early treatment based on predicted lifetime risk therefore 250 requires a leap of faith by both patient and clinician that additional years of early treatment will lead to larger benefit in the distant future. In that context, careful explanation of predicted risks is 251 needed, and patient preferences are critical to take into account.^{5,28} 252

- 253 A key limitation in the field is that UK and other linked routine data resources used to derive and
- validate CVD risk prediction usually suffer from limited follow-up because patients are lost when
- they deregister with a participating practice or organisation. We constrained validation of
- 256 performance to 10-years to allow a direct comparison with QRISK3, but even without this, follow-up

is constrained by deregistration from participating practices, and very long follow-up also requires
the use of very historical baseline data when data quality is poorer and CVD incidence was higher.
Improvements in data linkage and increasing access to whole population data have the potential to
significantly improve observability over long period of follow-up, and deriving and validating new
prediction tools in these datasets which account for competing mortality risk is a priority.

262 More broadly, lifetime CVD risk prediction is an attempt to deal with a key problem of 10-year CVD 263 risk prediction: that younger people at high risk of premature CVD often do not have 10-year CVD 264 risk that exceeds current threshold for treatment. Using age-stratified 10-year risk thresholds might 265 mitigate this problem,²⁸ but risks large proportions of people being recommended for lifelong medication that most will not benefit from. With advances in cardiac imaging, alternative strategies 266 include using coronary artery calcium scoring²⁸ or CT coronary angiography (CTCA) to screen people 267 at increased predicted risk for asymptomatic coronary artery disease, and to treat the diseased 268 269 rather than the at-risk. Early diagnosis and treatment is an attractive strategy given the problems of 270 risk prediction over long periods of time, but while such a strategy using CTCA has been shown to be effective in people with chest pain,²⁹ its value in a true primary prevention population is uncertain 271 and needs to be established.³⁰ 272

273 Conclusion

QRiskLifetime under-predicts risk over a 10-year prediction horizon in all patients except women
aged 45-64, and is therefore likely to under-predict risk over a lifetime. Given limited follow-up in
derivation and validation studies, any lifetime prediction in younger people requires the strong
assumption that age-stratified incidence of CVD will remain stable over decades. Compared to
treatment based on 10-year risk, treatment based on lifetime risk therefore requires a considerably
larger leap of faith on the part of clinicians and patients.

281	List of al	obreviations					
282	AUROC	Area under the receiver operating curve					
283	BMI	Body mass index					
284	CCI	Charlson Comorbidity Index					
285	CHD	Coronary heart disease					
286	CPRD	Clinical Practice Research Datalink					
287	CVD	Cardiovascular disease					
288	HES	Hospital Episode Statistics					
289	JBS3	Joint British Societies [risk calculator] version 3					
290	NICE	National Institute for Health and Care Excellence					
291	NNT	Number needed to treat					
292	ONS	Office of National Statistics					
293	SBP	Systolic blood pressure					

- 294 **Declarations**
- 295 Ethics approval
- 296 The study was approved by the Clinical Practice Research Datalink Independent Scientific Advisory
- 297 Committee protocol 16_248. Analysis only used anonymised data and individual consent to
- 298 participate was not required.
- 299 Consent to publish
- 300 The authors had full and sole access the data, and the funder had no role in the conduct of the
- 301 research or the decision to publish.
- 302 Availability of data and materials
- 303 The data that support the findings of this study are available from Clinical Practice Research Datalink
- 304 (<u>https://cprd.com/</u>), but restrictions apply to the availability of these data, which were used under
- license for the current study, and so are not publicly available. Codelists defining all variables used in
- analysis are published as supplementary material to https://doi.org/10.1016/S2666-7568(21)00088-

307 <u>X</u>

- 308 The data controller is the Clinical Practice Research Datalink (CPRD), and under the data licence
- 309 granted, the authors are not allowed to share data. Researchers can apply to CPRD directly for
- 310 access to the raw data (<u>https://cprd.com/</u>).
- 311 Competing interests
- No competing interests to declare. BG reports funding from NIHR, Legal and General PLC, Medical
- 313 Research Council, and Chief Scientist Office unrelated to this study. DM reports funding from NIHR,
- Chief Scientist Office and Tenovus unrelated to this study. JF reports funding from NIHR, Legal and
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- 323 Author contribution
- 324 The study was conceived of and designed by BG, DRM, and PTD who obtained the funding. All
- authors contributed to study design and interpretation. SL, BG, DRM, PTD and JF contributed to data
 - 12

- 326 management and SL led analysis supported by BG, DRM and PTD. SL and BG drafted the paper,
- 327 which all authors reviewed, edited and approved. SL, BG and DRM verified the underlying data.

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- 330 steering group, and we would like to acknowledge the contribution of Graham Bell and Alison Allen.

Table 1: Baseline data compared to QRiskLifetime derivation cohort

All patients QRiskLifetime internal validation cohort ³ N=1267159
48.0 (14.2)
26.1 (4.5)
-0.3 (3.5)ª
4.2 (1.3)
131.7 (20.5)
1219987 (96.3)
7577 (0.6)
3663 (0.3)
2632 (0.2)
5032 (0.4)
4666 (0.4)
9471 (0.8)
3068 (0.2)
11063 (0.8)
631545 (49.8)
193974 (15.3)
71037 (5.6)
91679 (7.2)
74056 (5.8)
143593 (11.3)
20868 (1.7)
67986 (5.4)
6589 (0.5)
1917 (0.2)
Not reported
Not reported

a. Validation study reports mean (standard deviation)

b. For this study, % of non-missing; for QRiskLifetime derivation paper % of all patients

c. All listed variables are used as predictors in the QRiskLifetime model apart from Charlson score which is not included in the prediction model but is used as a stratifying variable in analysis of discrimination and calibration

	Women			Men		
	Harrell's C (95% CI)	D (95% CI)	R-squared (95% CI)	Harrell's C (95% CI)	D (95% CI)	R-squared (95% CI)
All patients	0.844 (0.841,0.847)	2.19 (2.17,2.21)	53.3 (52.9,53.7)	0.808 (0.806,0.811)	1.87 (1.85,1.89)	45.5 (45.1,46.0)
Age group						
30-44	0.714 (0.703,0.725)	1.33 (1.26,1.39)	29.6 (27.6,31.7)	0.714 (0.706,0.722)	1.24 (1.20,1.29)	26.9 (25.6,28.3)
45-64	0.692 (0.687,0.698)	1.14 (1.10,1.17)	23.5 (22.5,24.6)	0.671 (0.667,0.675)	0.97 (0.94,0.99)	18.2 (17.4,19.1)
65-74	0.631 (0.625,0.637)	0.75 (0.71,0.79)	11.8 (10.6,13.0)	0.597 (0.591,0.603)	0.54 (0.51,0.58)	6.6 (5.8,7.3)
75-84	0.578 (0.573,0.583)	0.44 (0.40,0.49)	4.5 (3.6,5.5)	0.556 (0.549,0.562)	0.32 (0.28,0.36)	2.4 (1.9,3.0)
CCI						
0	0.844 (0.840,0.848)	2.19 (2.17,2.21)	53.4 (52.8,53.9)	0.803 (0.800,0.806)	1.82 (1.80,1.84)	44.1 (43.6,44.6)
1	0.820 (0.814,0.826)	1.95 (1.92,1.99)	47.6 (46.7,48.5)	0.798 (0.792,0.804)	1.76 (1.72,1.80)	42.4 (41.3,43.5)
2	0.768 (0.758,0.779)	1.54 (1.49,1.60)	36.3 (34.6,37.9)	0.701 (0.690,0.711)	1.13 (1.07,1.19)	23.4 (21.5,25.3)
3+	0.724 (0.708,0.740)	1.29 (1.21,1.38)	28.5 (25.8,31.2)	0.656 (0.639,0.673)	0.91 (0.82,0.99)	16.4 (13.8,19.1)

Table 2: Discrimination and model fit (evaluated at 10 years follow-up)

CCI: Charlson Comorbidity Index

Table 3: Reclassification as high or low risk by QRiskLifetime compared to QRISK3 with both predicting risk over 10-years

	QRiskLifetime <10% at 10 years No. (%) of all women or all men	QRiskLifetime ≥10% at 10 years No. (%) of all women or all men	Total recommended for treatment by each tool
Women			
QRISK3<10%	1017314 (80.7)	3619 (0.3)	QRiskLifetime recommends 15.4% for treatment
QRISK3≥10%	48604 (3.9)	190792 (15.1)	QRISK3 recommends 19.0% for treatment
Men			
QRISK3<10%	872474 (71.3)	8829 (0.7)	QRiskLifetime recommends 22.6% for treatment
QRISK3≥10%	74422 (6.1)	267540 (21.9)	QRisk3 recommends 28.0% for treatment

Cohen's Kappa: Women 0.86 (95% CI 0.85 to 0.86), men 0.82 (95% CI 0.82 to 0.82)

Table 4: Reclassification as high or low risk by QRiskLifetime predicting lifetime risk compared to QRISK3 predicting risk over 10-years

	QRiskLifetime <32.9% (women) or <39.6% (men)* No. (%) of all women or all	QRiskLifetime ≥32.9% (women) or ≥39.6% (men)* No. (%) of all women or all	Total recommended for treatment by each tool'			
	men	men				
Women						
QRISK3<10%	847786 (67.3)	173147 (13.7)	QRiskLifetime recommends 19.0% for treatment			
QRISK3≥10%	173147 (13.7)	66249 (5.3)	QRISK3 recommends 19.0% for treatment			
Men						
QRISK3<10%	647949 (53.0)	233354 (19.1)	QRiskLifetime recommends 28.0% for treatment			
QRISK3≥10%	233354 (19.1)	108608 (8.9)	QRisk3 recommends 28.0% for treatment			

* There is no recommended threshold of lifetime risk above which treatment is recommended, so for comparison purposes, QRiskLifetime thresholds are defined to identify exactly the same number of patients as those identified by QRISK3 as having 10-year risk ≥10% (i.e. the 19.0% of women and 28.0% of men at highest lifetime risk are 'recommended' for treatment to match the 19.0% of women and 28.0% of men with QRISK3 10-year risk ≥10%)

Table 5: Characteristics of people recommended for treatment

	Number (%) recommended for treatment	No. (%) with a CVD event	Number Needed to Treat (NNT) [#]	Mean (SD) age	Mean (SD) TC:HDL ratio	Mean (SD) SBP (mmHg)	Mean (SD) BMI (kg/m ²)	Treated HT % (95%Cl)	Current smoker % (95%CI)	Family history premature CVD % (95% CI)	Minority ethnic background % (95% CI)
Women											
QRISK3 predicted risk at 10 years ≥10%	239396 (19.0)	28373 (11.9)	34	71.3 (8.2)	3.8 (0.8)	143.9 (17.0)	26.8 (4.5)	31.9 (31.7-32.1)	18.1 (17.9-18.2)	6.3 (6.2-6.4)	3.0 (2.9-3.1)
QRiskLifetime predicted risk at 10 years ≥10%	194411 (15.4)	25641 (13.2)	30	73.3 (7.0)	3.8 (0.8)	145.0 (17.0)	26.8 (4.4)	36.2 (36.0-36.4)	15.9 (15.7-16.0)	7.8 (7.7-7.9)	3.2 (3.1-3.2)
QRiskLifetime predicted lifetime risk ≥32.9% *	239396 (19.0)	9652 (4.0)	99	50.5 (12.6)	4.0 (1.1)	134.9 (20.0)	28.9 (5.6)	29.4 (29.2-29.6)	21.3 (21.2-21.5)	36.3 (36.2-36.5)	20.8 (20.6-20.9)
Men											
QRISK3 predicted risk at 10 years ≥10%	341962 (28.0)	37026 (10.8)	37	63.8 (9.6)	4.3 (0.9)	140.2 (15.5)	27.1 (3.7)	19.6 (19.5-19.8)	26.1 (26.0-26.2)	7.2 (7.1-7.2)	3.2 (3.1-3.2)
QRiskLifetime predicted risk at 10 years ≥10%	276369 (22.6)	33450 (12.1)	33	66.2 (8.5)	4.3 (0.9)	140.8 (15.6)	27.1 (3.7)	22.3 (22.2-22.5)	23.4 (23.2-23.6)	8.3 (8.2-8.4)	3.3 (3.3-3.4)
QRiskLifetime predicted lifetime risk ≥39.6% *	341962 (28.0)	14725 (4.3)	100	46.3 (10.4)	4.9 (0.9)	135.7 (15.2)	29.1 (4.1)	15.0 (14.9-15.2)	26.4 (26.2-26.5)	20.0 (19.9-20.2)	13.1 (13.0-13.2)

* There is no recommended threshold of lifetime risk above which treatment is recommended, so for comparison purposes, QRiskLifetime thresholds are defined to include the same number of patients recommended for treatment as QRISK3 10-year risk ≥10% (ie the 19.0% of women and 28.0% of men at highest lifetime risk are 'recommended' for treatment to match the 19.0% of women and 28.0% of men with QRISK3 10-year risk ≥10%)

Assuming a 25% risk reduction with primary prevention using statins with treatment taken by all people recommended for treatment.

TC:HDL ratio: total cholesterol:HDL cholesterol ration; SBP: systolic blood pressure; HT: Hypertension

Figure 1: Calibration in women (left hand) and men (right hand) for whole population

Figure 2: Calibration in women (left hand) and men (right hand) stratified by age

Figure 3: Calibration in women (left hand) and men (right hand) stratified by Charlson Comorbidity Index

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