

# BMJ Open GARFIELD-AF model for prediction of stroke and major bleeding in atrial fibrillation: a Danish nationwide validation study

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## ABSTRACT

**Objectives** To externally validate the accuracy of the Global Anticoagulant Registry in the FIELD-Atrial Fibrillation (GARFIELD-AF) model against existing risk scores for stroke and major bleeding risk in patients with non-valvular AF in a population-based cohort.

**Design** Retrospective cohort study.

**Setting** Danish nationwide registries.

**Participants** 90 693 patients with newly diagnosed non-valvular AF were included between 2010 and 2016, with follow-up censored at 1 year.

**Primary and secondary outcome measures** External validation was performed using discrimination and calibration plots. C-statistics were compared with CHA<sub>2</sub>DS<sub>2</sub>VASc score for ischaemic stroke/systemic embolism (SE) and HAS-BLED score for major bleeding/haemorrhagic stroke outcomes.

**Results** Of the 90 693 included, 51 180 patients received oral anticoagulants (OAC). Overall median age (Q1, Q3) were 75 (66–83) years and 48 486 (53.5%) were male. At 1-year follow-up, a total of 2094 (2.3%) strokes/SE, 2642 (2.9%) major bleedings and 10 915 (12.0%) deaths occurred. The GARFIELD-AF model was well calibrated with the predicted risk for stroke/SE and major bleeding. The discriminatory value of GARFIELD-AF risk model was superior to CHA<sub>2</sub>DS<sub>2</sub>VASc for predicting stroke in the overall cohort (C-index: 0.71, 95% CI: 0.70 to 0.72 vs C-index: 0.67, 95% CI: 0.66 to 0.68, p<0.001) as well as in low-risk patients (C-index: 0.64, 95% CI: 0.59 to 0.69 vs C-index: 0.57, 95% CI: 0.53 to 0.61, p=0.007). The GARFIELD-AF model was comparable to HAS-BLED in predicting the risk of major bleeding in patients on OAC therapy (C-index: 0.64, 95% CI: 0.63 to 0.66 vs C-index: 0.64, 95% CI: 0.63 to 0.65, p=0.60).

**Conclusion** In a nationwide Danish cohort with non-valvular AF, the GARFIELD-AF model adequately predicted the risk of ischaemic stroke/SE and major bleeding. Our external validation confirms that the GARFIELD-AF model was superior to CHA<sub>2</sub>DS<sub>2</sub>VASc in predicting stroke/SE and comparable with HAS-BLED for predicting major bleeding.

## Strengths and limitations of this study

- This validation study was able to compare prediction performance Global Anticoagulant Registry in the FIELD-Atrial Fibrillation model versus CHA<sub>2</sub>DS<sub>2</sub>VASc for stroke and HAS-BLED for major bleeding in patients with atrial fibrillation.
- This study used a large contemporary population-based cohort with atrial fibrillation with many events and very limited loss to follow-up.
- The validation was based on International Classification of Diseases, Tenth Revision coding from the Danish registries which is prone to misclassification bias and lacked clinical measurements.

## INTRODUCTION

Atrial fibrillation (AF) is a common cardiac arrhythmia with a lifetime prevalence of 20%–30% and is the cause of one in four strokes.<sup>1</sup> AF is associated with an increased risk of several cardiovascular conditions, most notably a nearly fivefold increased stroke risk.<sup>2,3</sup> The risk of stroke can be substantially diminished by thrombotic prophylaxis.<sup>4,5</sup> However, 20%–40% of potentially eligible patients do not receive oral anticoagulant (OAC) therapy.<sup>6–8</sup> The most important and modifiable contributing factor is inappropriate risk assessment, with underutilisation of existing risk scores, resulting in overestimation of bleeding risks and underestimation of potential stroke risk.<sup>9,10</sup> Recently, the Global Anticoagulant Registry in the FIELD-Atrial Fibrillation (GARFIELD-AF) model was developed that allowed for simultaneous calculation of death, stroke and bleeding risks in an international prospective registry of patients with newly diagnosed AF.<sup>11</sup> In the GARFIELD-AF and ORBIT-AF registries, the GARFIELD-AF model was found to improve



discrimination of the existing risk scores for stroke (CHA<sub>2</sub>DS<sub>2</sub>-VASc) and bleeding (HAS-BLED).<sup>11–13</sup> These registries may not cover the full spectrum of patients with AF, which warrants external validation of these risk scores in other population-based cohorts. We aimed to (1) externally validate the GARFIELD-AF model of ischaemic stroke and major bleeding outcomes among patients with newly diagnosed AF in a large contemporary Danish cohort and (2) perform a head-to-head comparison of the predictive properties of GARFIELD-AF model with CHA<sub>2</sub>DS<sub>2</sub>-VASc for thromboembolic events and HAS-BLED for major bleeding. We did not externally validate the GARFIELD-AF model for risk of death, as we did not have blood pressure and heart rate measurements; covariates that the GARFIELD-AF model for death requires.

## MATERIALS AND METHODS

We reported our findings according to the transparent reporting of a multivariable prediction model for individual prognosis or diagnosis criteria.<sup>14</sup>

### Data sources

We used the Danish nationwide registers cross-linking The Civil Registration System, The Danish National Patient Register (DNPR) and The Danish Drug Statistical Registry. The Civil Registration System holds data on age, sex and vital status. DNPR contains all hospital admissions according to International Classification of Diseases, Tenth Revision (ICD-10) and procedures. The Danish Drug Statistical Registry was used to characterise pharmacotherapy in which all claimed drug prescriptions are registered. To compare characteristics (baseline and outcomes) of the Danish registry, we used data from the GARFIELD-AF registry which, in brief, is an observational, multicentre, international study of newly diagnosed AF with  $\geq 1$  risk factor for stroke.<sup>15</sup>

### Study population

From the DNPR, patients aged  $\geq 18$  years with a primary or secondary diagnosis of AF (ICD-10: I48), hospitalisation or outpatient visit were included from 1 January 2010 until 1 August 2016 with follow-up to 1 August 2017. The diagnosis of AF in the DNPR has a positive predictive value of 94.0%.<sup>16</sup> Patients with rheumatic valvular heart disease or valve interventions were excluded. To allow patients time to fill their prescriptions after discharge, a 10-day wash-out period was used. Due to no data on race/ethnicity in the The Civil Registration System, we excluded immigrants and those with missing information on immigration and presumed Caucasian/European-white for non-immigrants. Given complete nationwide coverage of DNPR, missing data are not present. For baseline characteristic and outcome comparison, we included the worldwide enrolled GARFIELD-AF patients and the patients enrolled from the Scandinavian sites; Denmark, Sweden, Norway and Finland (GARFIELD-AF Scandinavia).

## Covariates, GARFIELD-AF model, CHA<sub>2</sub>DS<sub>2</sub>-VASc and HAS-BLED

For the Danish AF cohort, all baseline variables were defined from ICD-10 codes, as any primary or secondary diagnosis, inpatient or outpatient, registered up to 10 years prior to the inclusion date. Pharmacotherapy at baseline was identified by Anatomical Therapeutic Chemical codes of prescription drugs claimed up to 180 days prior to the inclusion date. For OAC, within the 180 days, the latest prescription filled of either vitamin K antagonist (VKA) or non-vitamin K oral anticoagulants (NOAC) was used. Prescriptions claimed for antidiabetic drugs were used as proxy for diabetes mellitus. Hypertension was defined as claimed prescription for a combination of at least two of the seven different antihypertensive drug classes as previously reported.<sup>17</sup> The algorithm for GARFIELD-AF 1-year risk of ischaemic stroke/systemic embolism (SE) relies on the following variables: age (in years), history of ischaemic stroke, prior bleeding (any recorded in medical records), heart failure (medical history of heart failure or ejection fraction of  $<40\%$ ), chronic kidney disease (CKD) (stages III–V), race/ethnicity and use of OAC (VKA or NOAC). The algorithm for GARFIELD-AF 1-year risk of major bleeding/haemorrhagic stroke was developed in patients taking OAC and involves age, CKD and vascular disease, in which the latter is defined as history of myocardial infarction (MI) or unstable angina, aortic or peripheral artery disease. The CHA<sub>2</sub>DS<sub>2</sub>-VASc score is composed of age, sex, a history of heart failure, hypertension, stroke, transient ischaemic attack, thromboembolism and/or diabetes. HAS-BLED is composed of age, uncontrolled hypertension renal disease, liver disease, labile international normalised ratio (INR), medication use predisposing to bleeding and a history of stroke, major bleeding and/or predisposition to bleeding. All covariates were based on ICD-10 codes. The equations for these respective scores and ICD-10 codes can be found in online supplementary table S1.

### Definitions of endpoints

The primary efficacy endpoint for this study involved a 1-year composite of ischaemic stroke or SE. The primary safety endpoint involved a composite of haemorrhagic stroke or major bleeding. Major bleeding was defined as an organ-specific bleeding requiring hospitalisation.<sup>18</sup> A list of ICD-10 codes used to compute these definitions can be found in Table S2. In the GARFIELD-AF cohorts, the occurrence of ‘major bleeding’ was defined according to the International Society on Thrombosis and Haemostasis (ISTH) criteria.<sup>11 15 19</sup>

### Patient and public involvement

Patients or the public were not involved in the design of the study.

### Statistical analyses

For the Danish AF cohort, we stratified baseline characteristics by CHA<sub>2</sub>DS<sub>2</sub>-VASc score ( $\leq 2$  for women, 0–1 for men and  $>2$  for women and  $>1$  for men). The Danish AF

cohorts were followed for a maximum of 1-year from the discharge date and until the event of interest (stroke/SE or major bleeding), death, emigration or end of follow-up (August 2017). For all three cohorts (Danish AF cohort, GARFIELD Scandinavia and GARFIELD Global), 1-year absolute risks of stroke/SE and major bleeding were estimated non-parametrically using the Aalen-Johansen estimator with competing risk of death. For the Danish AF cohort, using a logistic regression model, we used the original coefficients from the GARFIELD-AF model development study. The discriminative performance of GARFIELD-AF for predicting ischaemic stroke/SE and major bleeding hospitalisations was assessed using receiver operating characteristics curves and reported as area under the curve (AUC) values. The C-index with 95% CI was reported as a measure of discrimination. As there was no censoring issue because the data did not contain any loss to follow-up within the first year of the study period, the significance test of C-index differences was tested for significance with DeLong's method.<sup>20</sup> Calibration was assessed by calculating deciles of predicted probabilities and plotting the average predicting with the observed Kaplan-Meier rate and 95% CI within each decile. A subgroup analysis for stroke prediction was undertaken for low risk patients. As a sensitivity analysis, we estimated the logistic regression coefficients for each individual covariate used in the GARFIELD-AF models. Statistical analyses were performed using R software (Team RC. R: A Language and Environment for Statistical Computing, 2019).

## RESULTS

From the Danish registries, a total of 110 276 patients were diagnosed with AF between 2010 and 2016. Of those patients, 91 836 met the inclusion criteria for the study (Figure S1). Of these, 70 020 were identified as high risk and 20 673 was identified as low risk of stroke/SE. A total of 51 180 were on OACs. From the GARFIELD-AF registries, 52 080 patients with AF were included globally, and 2396 patients were included from the Scandinavian sites.

### Characteristics of study participants

Baseline characteristics for all three cohorts (Danish AF cohort, GARFIELD Scandinavia and GARFIELD Global) are shown in table 1. Compared with GARFIELD Scandinavia, the Danish AF cohort had a more equal representation of men and women (54% vs 58%) and was older (median age 75 vs 73). There were also notable differences in comorbidities, in which diabetes, hypertension and CKD were less prevalent in the Danish AF cohort, whereas a history of bleeding (11.6% vs 1.9% vs 2.5%) was much more prevalent compared with the GARFIELD Scandinavia or global cohorts. Despite these differences, the median  $CHA_2DS_2-VASc$  scores were comparable among all cohorts but the HAS-BLED median was higher in the Danish AF cohort. For the GARFIELD model, the median GARFIELD scores were higher in the Danish AF

cohort than both GARFIELD cohorts. The use of OAC therapy was 56.4% in the Danish AF cohort, which was lower than the reported percentages in GARFIELD Scandinavia (68.0%) and GARFIELD Global (60.8%). The use of aspirin, ADP-inhibitors and non-steroidal anti-inflammatory drugs was higher in the Danish AF cohort. The characteristics of patients at low risk ( $CHA_2DS_2-VASc$  of 0–1 in men and 1–2 in women; n=20 673) and high risk (n=70 020) for the Danish AF population are displayed in Table S3. The median (IQR) for  $CHA_2DS_2-VASc$  and HAS-BLED scores in the high-risk group was 4<sup>3–5</sup> and 2.<sup>2 3</sup>

### Clinical outcomes at 1-year follow-up

Table 2 displays the number of stroke/SE, major bleeding and all-cause mortality for the Danish AF cohort and GARFIELD-AF cohort. For the Danish AF cohort, over a 1-year follow-up period, a total of 2094 (2.3%) stroke/SE, 2642 (2.9%) major bleedings were reported. Annual mortality rates were high with 10 915 deaths (12.0 per 100 person years). For the OAC-treated patients, there were 4521 deaths (8.8 per 100 person years) and for low risk patients, there were 623 deaths (3.0 per 100 person years). For the GARFIELD-AF Global, the rates of events were lower for stroke/SE (1.2%), major bleeding (1.1%) and deaths (4.7%). For the GARFIELD-AF Scandinavia, the rates of events were 1.0% for stroke/SE, 1.7% for major bleeding (1.7%), and 3.7% for deaths. The cumulative incidence for ischaemic stroke to 1 year for low-risk and high-risk patients are presented in Figure S2 for the Danish AF cohort. The cumulative incidence of stroke/SE and ischaemic stroke for the Danish AF cohort, GARFIELD Scandinavia and GARFIELD Global can be found in figure 1.

### External validation of GARFIELD-AF model

The C-index for the GARFIELD-AF model for 1-year stroke was 0.71 (95% CI: 0.70 to 0.72) in the overall Danish AF cohort of 90 693 patients and 0.64 (95% CI: 0.59 to 0.69) in low-risk patients not requiring OAC therapy (n=20 673). The C-index for the GARFIELD-AF model for 1-year major bleeding risk was 0.64 (95% CI 0.63 to 0.66) in patients using OAC therapy. The GARFIELD-AF model for stroke/SE and major bleeding scores were both well calibrated in the Danish AF cohort (figures 2 and 3). The individual covariates in the GARFIELD-AF model expressed a similar regression coefficient for most covariates in the Danish cohort when compared with the original derivation GARFIELD-AF cohort (online supplementary table S4).

### GARFIELD-AF model versus $CHA_2DS_2-VASc$ score for predicting stroke/SE

The AUC curves for predicting stroke using the GARFIELD model and  $CHA_2DS_2-VASc$  scores are displayed in figure 4A for the Danish AF cohort and figure 4B for the low risk patients. The AUC and corresponding C-index for GARFIELD was significantly higher when compared with  $CHA_2DS_2-VASc$  for predicting stroke outcomes, in the overall cohort (C-index: 0.71, 95% CI: 0.70 to 0.72 vs 0.67, 95% CI: 0.66 to 0.68) as well as in

**Table 1** Baseline characteristics of patients from the Danish AF cohort, GARFIELD-AF Scandinavia and GARFIELD-AF Global registries

	Danish AF cohort	GARFIELD-AF Scandinavia	GARFIELD-AF Global
n	90 693	2396	52 080
Age (median (IQR))	75 (66.0, 83.0)	73.0 (66.0, 78.0)	71.0 (63.0, 78.0)
Sex, male (%)	48 486 (53.5)	1389 (58.0)	29 068 (55.8)
Race, Caucasian (%)	NA	1860 (99.3)	32 028 (63.1)
Diabetes (%)	10 900 (12.0)	387 (16.2)	11 555 (22.2)
Stroke/TIA (%)	12 827 (14.1)	325 (13.6)	3879 (7.5)
SE (%)	448 (0.5)	6 (0.3)	335 (0.6)
History of bleeding (%)	10 544 (11.6)	46 (1.9)	1318 (2.5)
Vascular disease (%)	15 305 (16.9)	268 (11.2)	7682 (14.8)
Chronic kidney disease (%)	4224 (4.7)	185 (7.7)	5360 (10.3)
Heart failure (%)	14 961 (16.5)	348 (14.5)	11 758 (22.6)
Ischaemic heart disease (%)	13 445 (14.8)	331 (13.8)	11 265 (21.6)
Hypertension (%)	55 665 (61.4)	1659 (69.4)	39 643 (76.3)
VTE or PE (%)	5141 (5.7)	77 (3.2)	1355 (2.6)
NOAC (%)	23 212 (25.6)	521 (21.7)	11 004 (21.1)
VKA (%)	27 968 (30.8)	1110 (46.3)	20 708 (39.8)
OAC (%)	51 180 (56.4)	1631 (68.0)	31 712 (60.8)
VKA + AP (%)	10 773 (11.9)	181 (7.6)	4827 (9.4)
NOAC + AP (%)	7608 (8.4)	47 (2.0)	1896 (3.7)
NSAID (%)	13 078 (14.4)	23 (1.0)	1701 (3.3)
Acetylsalicylic acid (%)	32 890 (36.3)	413 (17.2)	14 636 (28.1)
ADP-inhibitor (%)	9128 (10.1)	89 (3.7)	3580 (6.9)
CABG (%)	3291 (3.6)	92 (3.9)	1625 (3.2)
CHA <sub>2</sub> DS <sub>2</sub> VASC (median (IQR))	3.0 (2.0, 4.0)	3.0 (2.0, 4.0)	3.0 (2.0, 4.0)
CHA <sub>2</sub> DS <sub>2</sub> VASC (%)			
0	5678 (6.3)	19 (0.8)	1516 (2.9)
1	10 231 (11.3)	279 (11.7)	6369 (12.4)
2	16 137 (17.8)	530 (22.2)	10 230 (19.9)
3	20 143 (22.2)	626 (26.2)	12 138 (23.6)
4	19 378 (21.4)	526 (22.1)	11 022 (21.4)
5	11 020 (12.2)	238 (10.0)	5895 (11.5)
>5	8106 (8.9)	167 (7.0)	4238 (8.2)
HAS-BLED (median (IQR))	2.0 (1.0, 3.0)	1.0 (1.0, 2.0)	1.0 (1.0, 2.0)
HAS-BLED category n, missing (%)		1088 (1308)	37 549 (14 531-missing)
0	8297 (9.1)	169 (15.5)	5471 (14.6)
1	19 956 (22.0)	507 (46.6)	16 169 (43.1)
2	31 170 (34.4)	301 (27.7)	11 692 (31.1)
3	24 998 (27.6)	87 (8.0)	3570 (9.5)
>3	6272 (6.9)	24 (2.2)	647 (1.7)
GARFIELD-AF model, stroke, median (IQR)	1.10 (0.75, 1.82)	0.80 (0.60, 1.10)	0.90 (0.70, 1.40)
GARFIELD-AF model, bleed, median (IQR)	1.08 (0.74, 1.54)	0.90 (0.70, 1.30)	1.00 (0.70, 1.40)

AP, antiplatelet therapy; CABG, coronary artery bypass grafting; GARFIELD-AF, Global Anticoagulant Registry in the FIELD-Atrial Fibrillation; NA, Not available; NOAC, non-vitamin-K antagonist; NSAID, non-steroidal anti-inflammatory drug; OAC, oral anticoagulants; PE, pulmonary embolism; SE, systemic embolism; TIA, transient ischaemic attack; VKA, vitamin-K antagonist; VTE, venous thromboembolism.

**Table 2** Number of events and deaths for 1-year follow-up in the Danish population (all patients, patients on OAC, low-risk patients), GARFIELD-AF Global and GARFIELD-AF Scandinavia

	Danish AF cohort (n=90 693)	Patients treated with OAC (n=51 180)	Low-risk patients (n=20 673)	GARFIELD Scandinavia (n=2396)	GARFIELD-AF Global (n=52 080)
Ischaemic Stroke/SE	2094	994	139	24	599
Major bleeding/haemorrhagic stroke	2642	1492	242	28*	341†
Deaths	10 915	4521	623	88	2459

Low-risk patients were defined as CHA<sub>2</sub>DS<sub>2</sub>-VASc score ( $\leq 2$  for women, 0–1 for men and  $>2$  for women and  $>1$  for men).

\*Of those treated with OAC (n=1631)

†Of those treated with OAC (n=31 712)

AF, atrial fibrillation; GARFIELD-AF, Global Anticoagulant Registry in the FIELD-Atrial Fibrillation; OAC, oral anticoagulation; SE, systemic embolism.

low-risk patients (C-index: 0.62, 95% CI: 0.59 to 0.69 vs 0.57, 95% CI: 0.53 to 0.61).

### GARFIELD-AF model versus HAS-BLED score for predicting major bleeding/haemorrhagic stroke

Figure 4C illustrates the AUC curves for the prediction of major bleeding based on the GARFIELD and HAS-BLED scores in patients taking OAC therapy. The discriminatory value of GARFIELD was comparable with HAS-BLED: C-index: 0.64 (95% CI: 0.63 to 0.66) versus C-index: 0.64 (95% CI: 0.63 to 0.65), respectively.

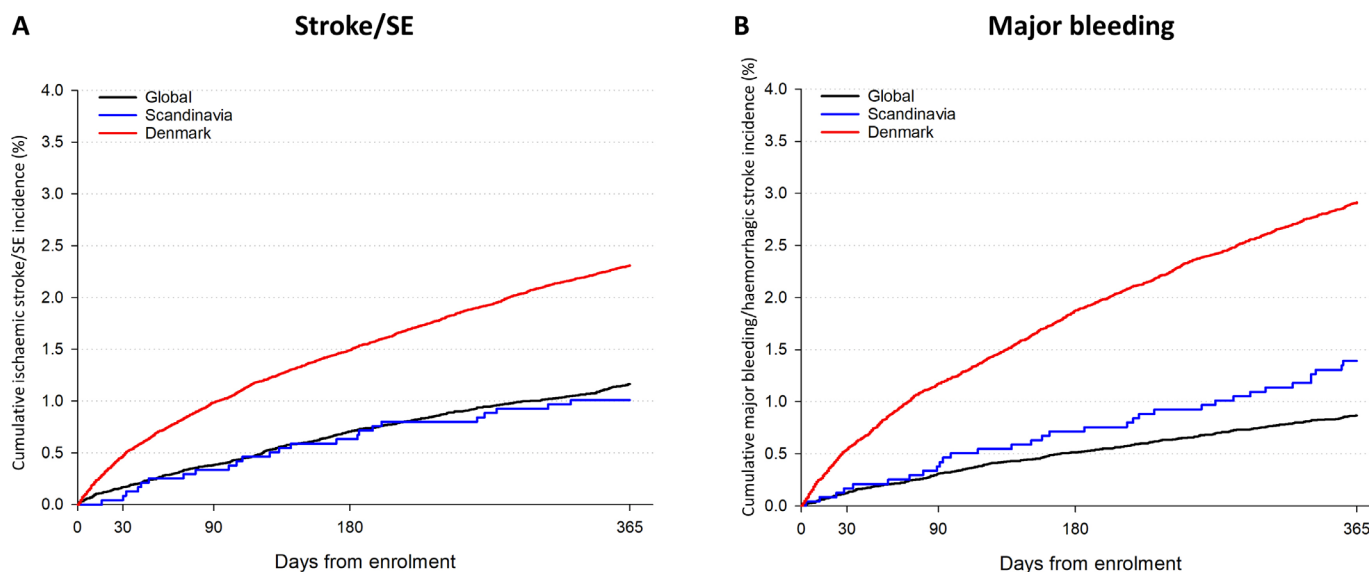
Table 3 displays available evidence comparing the discriminatory properties of various models for stroke/SE and major bleeding.

## DISCUSSION

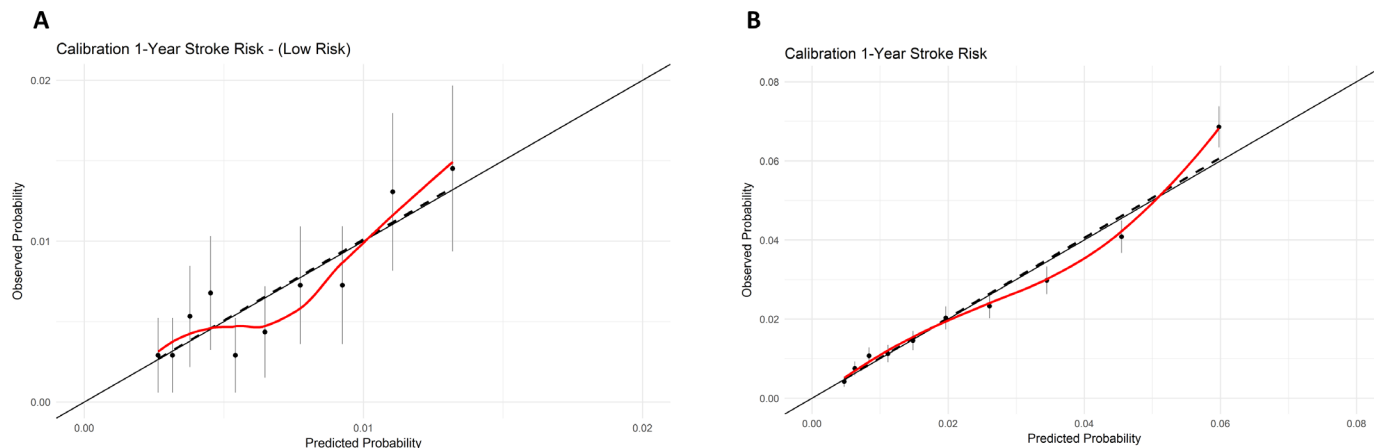
In a large unselected contemporary Danish AF cohort, our study demonstrates that the GARFIELD-AF model

serves as a reliable risk stratification tool. We found that the GARFIELD-AF model surpasses the widely used CHA<sub>2</sub>DS<sub>2</sub>-VASc score in predicting the risk of stroke, both in high-risk and low-risk patients. For predicting major bleeding, the three-item GARFIELD-AF model is on par with HAS-BLED among anticoagulated patients with AF.

Risk-stratification of patients with AF is essential to mitigate the risk of stroke/SE when initiating anticoagulation therapy. As such, the easy-to-calculate CHA<sub>2</sub>DS<sub>2</sub>-VASc score serves as the risk-stratification tool recommended by international guidelines to commence therapy when the risk of stroke reaches a threshold of  $>2\%$  per annum.<sup>21</sup> Prior studies have shown that guideline-adherent (risk-stratified) anticoagulation therapy is associated with a 60%–70% reduction in thromboembolic associated complications and mortality.<sup>22</sup> Despite these reductions in stroke risk, there is still room for improvement in risk stratification of patients with AF and anticoagulation



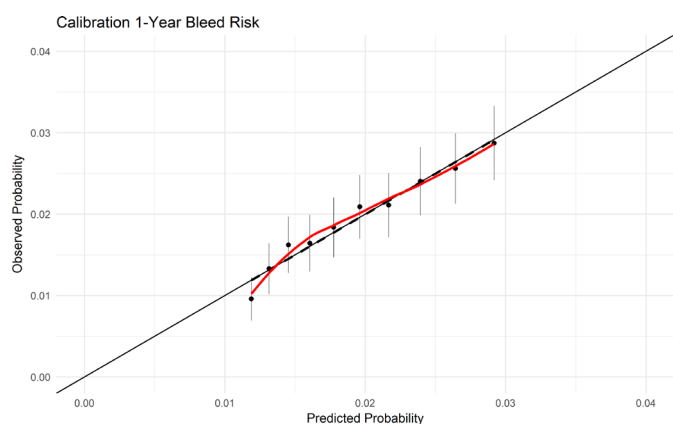
**Figure 1** Cumulative incidence of stroke/SE (panel A) and major bleeding (panel B) in the Danish AF cohort, GARFIELD-AF Scandinavia and GARFIELD-AF Global. AF, atrial fibrillation; GARFIELD-AF, Global Anticoagulant Registry in the FIELD-Atrial Fibrillation; SE, systemic embolism.



**Figure 2** Calibration plots of GARFIELD-AF model and stroke/SE risk in overall Danish population (A) and in low-risk patients (B). Predicted probability for GARFIELD (blackline), and actual observed cumulative incidence estimates with 95% CI for each GARFIELD score in deciles including a linear regression model (dashed line) and LOESS function of observed probability (red line). GARFIELD-AF, Global Anticoagulant Registry in the FIELD-Atrial Fibrillation; SE, systemic embolism.

therapy. In this regard, the GARFIELD-AF model, which calculates the risk of stroke, death and major bleeding, is promising, particularly as it performed better than the  $\text{CHA}_2\text{DS}_2\text{-VASc}$  and HAS-BLED.<sup>11</sup> The GARFIELD-AF model is not a risk score that is categorised into risk groups but instead it provides risk prediction on a continuous scale. As the model provides risk estimates of stroke/SE and bleeding (and mortality when blood pressure and heart rate data are available) in one single calculation based on routinely collected data, it could have potentially wide clinical applications.

Underuse of anticoagulation therapy is a well-known problem in particular in high-risk patients.<sup>23</sup> Our study found that 73.1% of patients with increased stroke risk ( $n=51\ 180$ ,  $\text{CHA}_2\text{DS}_2\text{-VASc}>2$  in women and  $>1$  in men) received anticoagulation therapy. Studies suggest that treatment barriers are based on overestimation of

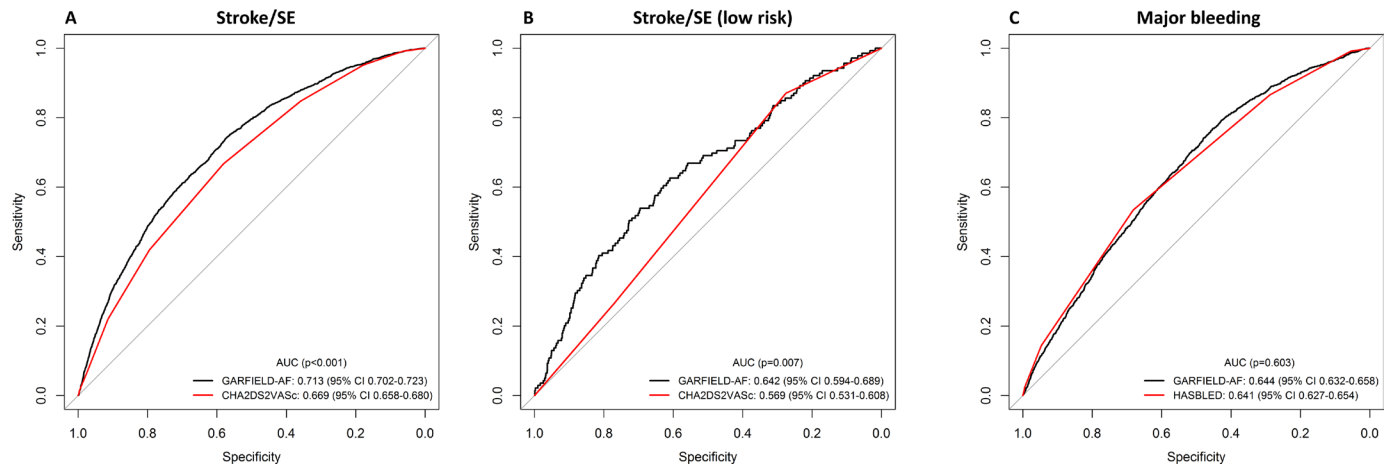


**Figure 3** Calibration plots of GARFIELD-AF model and major bleeding risk in Danish population. Predicted probability for GARFIELD (blackline), and actual observed cumulative incidence estimates with 95% CI for each GARFIELD score in deciles including a linear regression model (dashed line) and LOESS function of observed probability (red line). GARFIELD-AF, Global Anticoagulant Registry in the FIELD-Atrial Fibrillation.

bleeding risks (eg, recurrent falls and prior peptic ulcers) and lack of reliable risk stratification tools and readily available information that does not rely on specific laboratory tests such as HAS-BLED.<sup>9 10 23</sup>

To provide predictions for bleeding risk, several bleeding scores have been developed, of which HAS-BLED has been most rigorously tested.<sup>24 25</sup> While the HAS-BLED risk score is clinically useful to identify patients at high bleeding risk, it requires information that may not always be available in outpatient and primary care settings, such as information on liver function tests, INR status and the presence of anaemia. This may be a limitation for the implementation of this score in low-resource settings and is of relevance as the majority (60%) of community-dwelling patients with AF are seen in primary care.<sup>26 27</sup> Moreover, primary care physicians achieve lower anticoagulation rates compared with hospital-based physicians.<sup>28 29</sup> While there are multiple reasons for these differences, which include differences in populations, with high percentage of (relative) contraindications (40%–65%) and care-related factors, the lack of an integral decision tool impedes informed decisions on initiating or continuing antithrombotic therapy.<sup>10 30</sup>

In the present study, the external validation show that GARFIELD-AF is well calibrated with the predicted risks, and the good calibration aligns well with the original GARFIELD-AF derivation cohort.<sup>11</sup> GARFIELD-AF score has improved discriminatory abilities compared with  $\text{CHA}_2\text{DS}_2\text{-VASc}$  score in stroke prediction and on par with HAS-BLED for bleeding prediction. To our surprise, our external validation of GARFIELD-AF discriminatory c-index for stroke prediction was slightly higher (0.71) than the c-index in the original GARFIELD cohort (0.69). Furthermore, the Danish AF cohorts were older with more stroke events than both GARFIELD cohorts and higher predicted risk than the GARFIELD cohorts. The opposite was the case for major bleeding prediction where the original GARFIELD cohort had better



**Figure 4** Receiver Operating Characteristic curves of GARFIELD-AF model versus CHA<sub>2</sub>DS<sub>2</sub>VASc scores for predicting stroke in (A) the Danish AF cohort and (B) low-risk individuals, and (C) GARFIELD-AF model versus HAS-BLED scores for predicting major bleeding in the Danish AF cohort in those receiving oral anticoagulants (n=51 180). Low-risk stroke patients were defined as CHA<sub>2</sub>DS<sub>2</sub>-VASc score (≤2 for women, 0–1 for men and >2 for women and >1 for men). AF, atrial fibrillation; GARFIELD-AF, Global Anticoagulant Registry in the FIELD-Atrial Fibrillation.

discriminatory abilities than HAS-BLED. The significant differences in the cohort characteristics, for example, higher HAS-BLED and more use of combined OACs and antiplatelet therapy in the Danish AF cohort, and definitions of covariates and outcomes are likely to play a key role in both instances.

The value of CHA<sub>2</sub>DS<sub>2</sub>-VASc score in defining patients with a truly low risk of stroke is uncertain, partly because the number of patients to accurately assess lower risk patients in the original studies was insufficient.<sup>12 31</sup> The evaluation of the performance of risk scores in this low-risk category is important, as it determines the threshold when initiating antithrombotic therapy outweighs the risk of bleeding. In our study although both models had modest predictive discrimination for low-risk patients, we found that in these patients, the GARFIELD-AF model

was well calibrated and provided a better prediction than CHA<sub>2</sub>DS<sub>2</sub>-VASc score in indicating which patients are truly at low risk for subsequent stroke.

#### Limitations and future directions

The primary limitation of this study is that definitions are based on administrative ICD-10 codes which are prone to non-systematic misclassification bias. Discrepancies exist between the GARFIELD-AF registry and the Danish registries in the definitions of comorbidities and clinical outcome data. This was most notable for major bleeding and stroke/SE events and CKD. In the Danish AF cohort, selected ICD-10 codes for bleeding hospitalisations were applied, whereas GARFIELD-AF applied the ISTH criteria for major bleeding, which are more restrictive. Apart from differences in disease definitions, the

**Table 3** Available evidence comparing the discriminatory properties of various models for stroke/SE and major bleeding<sup>11 24</sup>

Outcome	Cohort	N	GARFIELD-AF-AUC (95% CI)	CHA <sub>2</sub> DS <sub>2</sub> -VASc /HAS-BLED-AUC (95% CI)
Stroke/SE	GARFIELD-AF	39 898	0.69 (0.67 to 0.71)	0.64 (0.61 to 0.66)
	ORBIT-AF	9743	0.69 (0.64 to 0.75)	0.69 (0.64 to 0.74)
	Danish AF cohort	90 693	0.71 (0.70 to 0.72)	0.67 (0.66 to 0.68)
Stroke/SE low risk patients	GARFIELD-AF	7882	0.65 (0.56 to 0.73)	0.59 (0.50 to 0.67)
	Danish AF cohort	20 673	0.64 (0.59 to 0.69)	0.57 (0.53 to 0.61)
Major bleeding	GARFIELD-AF	25 677	0.66 (0.62 to 0.69)	0.64 (0.61 to 0.68)
	ORBIT-AF	7442	0.61 (0.58 to 0.64)	–
	SPORTIF III-V	3550	0.56 (0.54 to 0.57)	0.58 (0.56 to 0.60)
	Danish AF cohort	51 180	0.64 (0.63 to 0.66)	0.64 (0.63 to 0.65)

AUC, area under the curve; GARFIELD-AF, Global Anticoagulant Registry in the FIELD-Atrial Fibrillation; ORBIT-AF, The Outcomes Registry for Better Informed Treatment of Atrial Fibrillation; SE, systemic embolism; SPORTIF, The Stroke Prevention Using Oral Thrombin Inhibitor in Atrial Fibrillation.

relative high number of bleeding and stroke/SE events in the Danish AF cohort could also be explained by site of enrolment (only hospital/out-patient). Similar data limitations apply to the construction of CHA<sub>2</sub>DS<sub>2</sub>-VASC score and HAS-BLED scores which was calculated from ICD-10 code usage although this study followed the standards set by other researchers using the same Danish registries.<sup>17</sup> Specifically, we were unable to account for labile INR component of the HAS-BLED score. Another limitation was the inability to ascertain ethnicity status which is an integrated covariate of the GARFIELD-AF model. Therefore, we excluded immigrants to strengthen the assumption of European/Caucasian ethnicity in the cohort. The GARFIELD Scandinavian cohort consisted of 99.3% Caucasians. Population-based studies in other more ethnically diverse cohorts are warranted. We did not assess net reclassification improvement as this statistic is not appropriate when using it for point-based scores, such as CHA<sub>2</sub>DS<sub>2</sub>-VASC.<sup>32</sup> For the implementation of the GARFIELD-AF model, an online risk calculator already exists. A next step would be to provide an electronic health record integrated solution, in which stroke/SE and bleeding risks are automatically calculated when a patient is identified with AF. Doing so would promote balanced and evidence-based decision-making on anticoagulation therapy. Integrating the GARFIELD-AF model into electronic health records would also provide a way for anonymous monitoring of outcomes of patients in which the GARFIELD-AF model was applied, which can be used to further optimise risk prediction.

## CONCLUSION

The GARFIELD-AF model adequately predicted the risk of ischaemic stroke/SE and major bleeding/haemorrhagic stroke in a nationwide Danish cohort of contemporary patients with non-valvular AF. Our external validation confirms that the performance of the GARFIELD-AF model was superior to CHA<sub>2</sub>DS<sub>2</sub>-VASC in predicting stroke/SE both in high-risk and in low-risk patients and comparable with HAS-BLED for predicting major bleeding. The GARFIELD-AF model holds an advantage over the existing risk scores as it permits for simultaneous evaluation of death, stroke and bleeding risks and uses readily available clinical parameters. As such, the tool may lead to more informed treatment decisions, improve monitoring for bleeding complications and improve outcomes for patients treated for AF in the community.

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**Ethics approval** For the GARFIELD-AF registry, an independent ethics committee and hospital-based institutional review board approvals were obtained for the registry protocol. In Denmark, retrospective register studies do not require approval from the ethics committees. The Danish Data Protection Agency approved this study (Ref no: 2007-58-0015, I-Suite no: 02732, GEH-2014-014). Data were made available in an anonymised format such that specific individuals could not be identified.

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**Data availability statement** Due to restrictions related to Danish law and protecting patient privacy, the combined set of data as used in this study can only be made available through a trusted third party, Statistics Denmark. This state organisation holds the data used for this study. Any request on data access should be addressed to Statistics Denmark <https://www.dst.dk/en.asp#>

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