

## Predicting Bleeding Events in Anticoagulated Patients With Atrial Fibrillation

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# Predicting Bleeding Events in Anticoagulated Patients With Atrial Fibrillation: A Comparison Between the HAS-BLED and GARFIELD-AF Bleeding Scores

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**Background**—Patients with atrial fibrillation (AF) treated with oral anticoagulants may be exposed to an increased risk of bleeding events. The HAS-BLED (Hypertension, Abnormal renal and liver function, Stroke, Bleeding, Labile INRs, Elderly, Drugs or alcohol) score is a simple, well-established, clinical bleeding-risk prediction score. Recently, a new algorithm-based score was proposed, the GARFIELD-AF (Global Anticoagulant in the Field–AF) bleeding score. We compared HAS-BLED and GARFIELD-AF scores in predicting adjudicated bleeding events in a clinical trial cohort of patients with AF taking anticoagulants, in the first external comparative validation of both scores.

**Methods and Results**—We analyzed patients from the SPORTIF (Stroke Prevention Using an Oral Thrombin Inhibitor in Patients With AF) III and V trials. All patients assigned to the warfarin arm with information to calculate the scores were considered. Outcomes were major, major/clinically relevant nonmajor, and any bleeding. A total of 3550 warfarin-treated patients were available for analysis. Of these patients, 2519 (71.0%) had a HAS-BLED score  $\geq 3$ , whereas based on GARFIELD-AF median value, 2056 (57.9%) were categorized as “high score.” Both HAS-BLED and GARFIELD-AF C-indexes showed modest predictive value (C-index [95% confidence interval] for major bleeding, 0.58 [0.56–0.60] and 0.56 [0.54–0.57], respectively); however, GARFIELD-AF was not predictive of any bleeding. The GARFIELD-AF bleeding score had a significantly lower sensitivity and a negative reclassification for any bleeding compared with HAS-BLED, assessed by integrated discrimination improvement and net reclassification improvement (both  $P < 0.001$ ). HAS-BLED showed a 5% net benefit for any bleeding occurrence.

**Conclusions**—The algorithm-based GARFIELD-AF bleeding score did not show any significant improvement in major and major/clinically relevant nonmajor prediction compared with the simple HAS-BLED score. For clinical usefulness in prediction of any bleeding, the HAS-BLED score showed a significant net benefit compared with the GARFIELD-AF. (*J Am Heart Assoc.* 2018;7:e009766. DOI: 10.1161/JAHA.118.009766.)

**Key Words:** atrial fibrillation • bleeding risk • clinical risk scores

The use of oral anticoagulant (OAC) drugs in patients with atrial fibrillation (AF) is highly effective for stroke prevention in AF, but is associated with an increased risk for bleeding events.<sup>1–3</sup> Baseline evaluation and management of bleeding risk, as well as the routine reevaluation during the clinical follow-up, are pivotal for patients with AF to minimize occurring bleeding events.<sup>4,5</sup>

Of the various clinical scores for bleeding risk stratification, the HAS-BLED score<sup>6</sup> is appropriately used to flag up patients for more regular review and follow-up, as well as drawing attention to modifiable bleeding risk factors.<sup>7,8</sup> The HAS-BLED score has been shown to be a superior strategy for bleeding risk evaluation compared with an approach only focusing on modifiable bleeding risk factors.<sup>9–11</sup>

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An accompanying Table S1 is available at <https://www.ahajournals.org/doi/suppl/10.1161/JAHA.118.009766>

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## Clinical Perspective

### What Is New?

- In anticoagulated patients with atrial fibrillation (AF), both HAS-BLED and GARFIELD-AF (Global Anticoagulant in the Field-AF) bleeding scores showed modest predictive ability in predicting most bleeding outcomes.
- Use of the algorithm-based GARFIELD-AF bleeding score did not show any improvement in prediction of major bleeding and major/clinically relevant nonmajor bleeding compared with the simple HAS-BLED score.
- In predicting the occurrence of any bleeding event, the HAS-BLED score demonstrated improved net benefit compared with the GARFIELD-AF bleeding score.

### What Are the Clinical Implications?

- This study represents the first external independent validation of the GARFIELD-AF bleeding score, in a clinical trial cohort with adjudicated bleeding outcomes.
- In the decision-making process of prescribing oral anticoagulant therapy in patients with AF, bleeding risk should be evaluated to address modifiable bleeding risk factors and “flag up” the high-risk patients for early review and follow-up.

In recent years, several other bleeding clinical risk scores have been proposed, all of which show modest predictive capacity, despite progressively more complex models.<sup>12</sup> More recently, a new bleeding risk score has been proposed to predict major bleeding in patients with AF, derived from the GARFIELD-AF (Global Anticoagulant in the Field-AF) registry, called the GARFIELD-AF bleeding score.<sup>13</sup>

The aim of this article is to compare the predictive value of HAS-BLED and GARFIELD-AF bleeding scores for adjudicated bleeding events in a cohort of patients with AF taking warfarin derived from a randomized controlled trial cohort.

## Methods

We used the pooled study populations of the SPORTIF (Stroke Prevention Using an Oral Thrombin Inhibitor in Patients With AF) III and V trials. The original protocol and principal results have been previously described.<sup>14–16</sup> In brief, the SPORTIF trials were 2 multicenter phase III clinical trials comparing the efficacy and safety of the direct thrombin inhibitor, ximelagatran, against warfarin in patients with nonvalvular AF. Signed, informed consent was required from each participant in accordance with protocol regulations approved by the local review boards governing research involving human subjects and the Declaration of Helsinki. Deidentified data sets with patient-level information were obtained directly from

AstraZeneca, and all the analyses were performed independently from the company. The analytic methods and study materials could be made available to other researchers for purposes of reproducing the results or replicating the procedures on request to the corresponding author and AstraZeneca. All patients assigned to the warfarin treatment arms and with available data for the clinical variables used to calculate the 2 bleeding prediction scores were included in the present analysis.

## Bleeding Scores Definition

The HAS-BLED score was calculated according to the original methods.<sup>6</sup> Major bleeding incidence according to HAS-BLED score, as reported in the original derivation cohort,<sup>6</sup> is shown in Table S1. Labile international normalized ratio criterion was defined as a time in therapeutic range <65%. The “impaired liver function” criterion was scored 0, because liver dysfunction was an exclusion criterion from the original SPORTIF trials protocol. A HAS-BLED score <3 was categorized as “low risk,” whereas a HAS-BLED score ≥3 was categorized as “high risk.”<sup>17</sup> Similarly, the GARFIELD-AF bleeding score was calculated according to the original proposed scheme.<sup>13</sup> According to the median value of the score distribution, patients were categorized as GARFIELD-AF “high score” (above the median value) and GARFIELD-AF “low score” (including and below the median value).

## Study Outcomes

We considered 3 bleeding end points, which were adjudicated in this trial cohort. Major bleeding outcome was defined by ≥1 of the following criteria: clinically overt bleeding with a concomitant decrease in hemoglobin levels of >2 g/dL or requiring blood transfusion of at least 2 units of whole blood or erythrocytes; or a bleeding episode involving a critical site (intracranial, intraspinal, intraocular, retroperitoneal, pericardial, or nontraumatic intra-articular bleeding).<sup>14</sup> All major bleeding events were centrally adjudicated by a blind independent oversight committee. Major/clinically relevant nonmajor (CRNM) bleeding outcome was defined as all the investigator-reported major bleeding events, independently of central adjudication. Any bleeding outcome was defined as any bleeding event, both major and minor, that occurred during the study.

## Statistical Analysis

Continuous variables were reported as median (interquartile range), whereas categorical variables were expressed as counts and percentages. Differences in survival according to the bleeding risk categories, assessed by an intention-to-treat

approach, were analyzed using the log-rank test, and Kaplan-Meier curve estimates were drafted accordingly. A Cox proportional hazards analysis was used to evaluate the occurrence of the 3 bleeding outcomes according to continuous scores, adjusted for sex and type of AF. C-indexes were estimated, with exact estimation of 95% confidence interval (CI), according to the method of DeLong et al.<sup>18</sup>

Discrimination and reclassification abilities were evaluated by the integrated discrimination improvement, the net reclassification improvement, and the median improvement, as described by Pencina et al.<sup>19</sup> Integrated discrimination improvement and net reclassification improvement have been calculated using scores as continuous variables and according to a time-dependent approach, whereas the clinical usefulness and net benefit were estimated using the decision curve analysis, according to the method proposed by Vickers et al.<sup>20,21</sup> In addition, we performed a sensitivity analysis comparing the 2 scores' predictive performance, using an on-treatment analysis. A 2-sided  $P < 0.05$  was considered statistically significant. All analyses were performed using SPSS, version 25.0 (IBM, NY) for MacOS and survIDINRI package for R, version 3.3.1 for Windows.

## Results

Among the original 7329 patients enrolled in the SPORTIF III and V trials, 3665 (50.0%) were assigned to the warfarin arm. According to data available, a total of 3550 patients (30.5% women; median [interquartile range] age, 72 [66–77] years) were available for this analysis. Baseline characteristics are reported in Table 1. Hypertension was the most prevalent risk factor (3167 patients [89.3%]), whereas previous bleeding was reported in 200 (5.6%) and chronic kidney disease was reported in 918 (25.9%). One fifth (705 patients [19.9%]) of the cohort used concomitant aspirin. Overall, there was a good quality anticoagulation control, with a median (interquartile range) time in therapeutic range of 68.2% (55.1%–79.6%).

At baseline, the median (interquartile range) HAS-BLED score was 3 (2–4), with 2519 patients (71.0%) with a HAS-BLED score  $\geq 3$ . Using a GARFIELD-AF median score value, 2056 patients (57.9%) were categorized as high score and 1494 (42.1%) were categorized as low score.

Over a mean of 1.56 (SD, 0.38) years of follow-up, 127 major bleeding (2.29 per 100 patient-years), 168 major/CRNM bleeding (3.03 per 100 patient-years), and 1450 any bleeding (26.2 per 100 patient-years) outcomes were recorded.

Kaplan-Meier analyses showed that patients with a HAS-BLED score  $\geq 3$  had a higher cumulative risk of major bleeding and major/CRNM bleeding outcomes compared with patients with a HAS-BLED score  $< 3$  (Figure 1, top panels).

**Table 1.** Baseline Characteristics

Characteristics	Value (N=3550)
Age, median (IQR), y	72 (66–77)
Female sex, n (%)	1084 (30.5)
BMI, median (IQR), kg/m <sup>2</sup> (n=3540)	28.1 (25.0–31.6)
CrCl, median (IQR), mL/min	79.7 (59.3–102.1)
Chronic AF, n (%) (n=3548)	3167 (89.3)
Hypertension, n (%)	2723 (76.7)
Diabetes mellitus, n (%)	833 (23.5)
Coronary artery disease, n (%)	1574 (44.3)
Stroke/TIA, n (%)	730 (20.6)
Heart failure, n (%)	1324 (37.3)
Previous bleeding, n (%)	200 (5.6)
Chronic kidney disease, n (%)	918 (25.9)
Aspirin use, n (%)	705 (19.9)
TTR, median (IQR), %	68.2 (55.1–79.6)

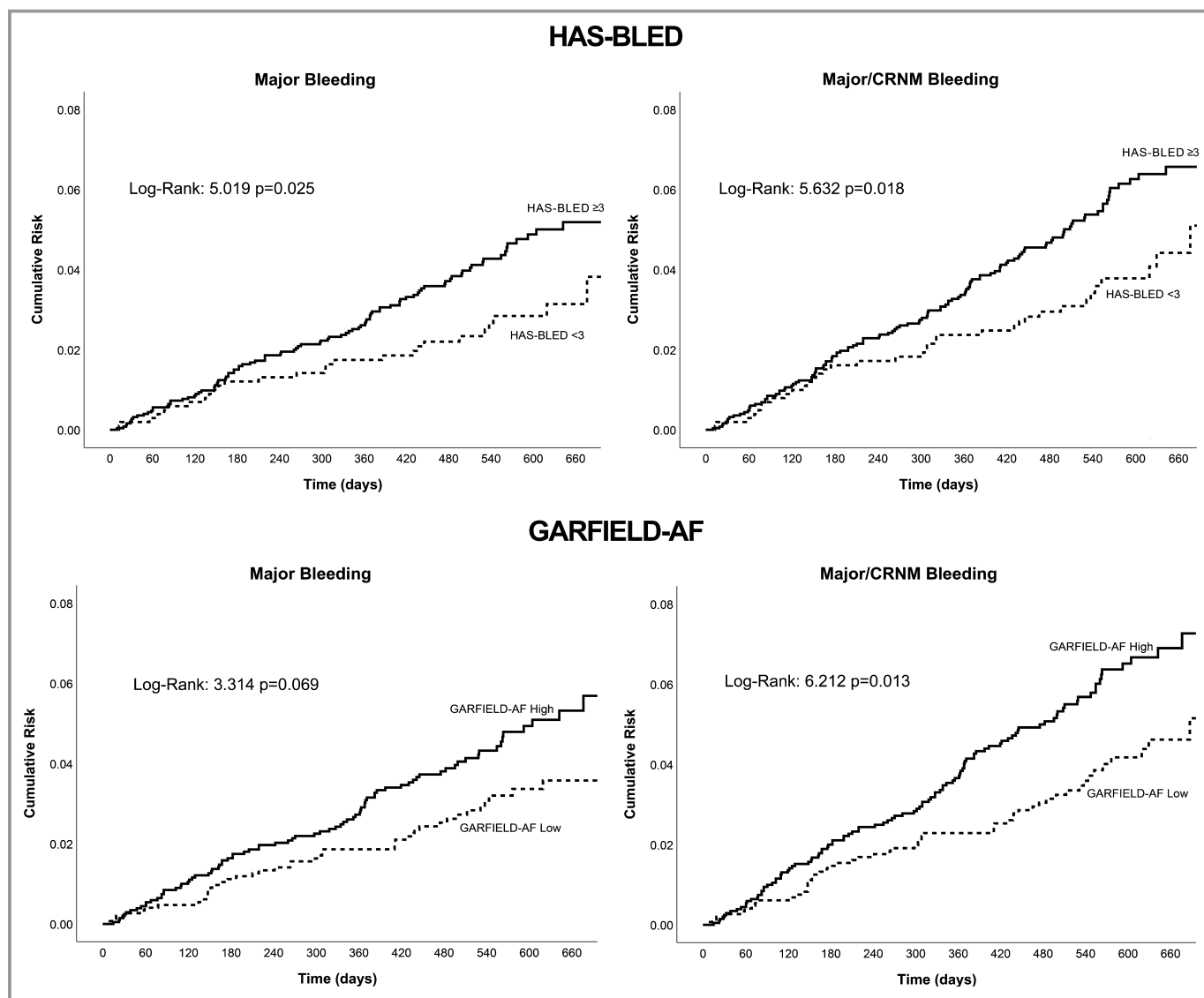
AF indicates atrial fibrillation; BMI, body mass index; CrCl, creatinine clearance; IQR, interquartile range; TIA, transient ischemic attack; TTR, time in therapeutic range.

For GARFIELD-AF risk categories, the high-score category showed a nonsignificant trend for major bleeding in the higher-risk category compared with the low-score category ( $P=0.069$ ), whereas for the major/CRNM bleeding outcome, the high-score category had a significantly greater risk than the low-score category ( $P=0.013$ ) (Figure 1, bottom panels). For the “any bleeding” outcome, patients with a HAS-BLED score  $\geq 3$  had a higher cumulative risk compared with those with a HAS-BLED score  $< 3$  ( $P < 0.001$ ), but no significant difference was found according to the GARFIELD-AF bleeding risk categories ( $P=0.250$ ) (Figure 2).

## Survival and Predictive Analysis

Using a Cox regression model (Table 2), adjusted for sex and type of AF, we found that the continuous HAS-BLED score was significantly associated with the occurrence of all the 3 bleeding outcomes, with an increase in relative risks ranging from 13% to 31% (for any bleeding and major bleeding, respectively) for each score point. The GARFIELD-AF bleeding score was only significantly associated with the major bleeding outcome (hazard ratio, 1.39; 95% CI, 1.04–1.86).

Predictive analysis (Table 2), performed according to C-indexes, indicated that both scores only had modest predictive value, for the 3 bleeding outcomes (HAS-BLED, C-indexes 0.55–0.58; GARFIELD-AF C-indexes 0.56–0.57 for major and major/CRNM bleeding, but nonsignificant for any bleeding). No significant differences were found between the 2 scores for their respective C-indexes for major and major/CRNM bleeding.



**Figure 1.** Kaplan-Meier curves for major and major/clinically relevant nonmajor (CRNM) bleeding for GARFIELD-AF (Global Anticoagulant in the Field–Atrial Fibrillation) bleeding and HAS-BLED (Hypertension, Abnormal renal and liver function, Stroke, Bleeding, Labile INRs, Elderly, Drugs or alcohol) scores.

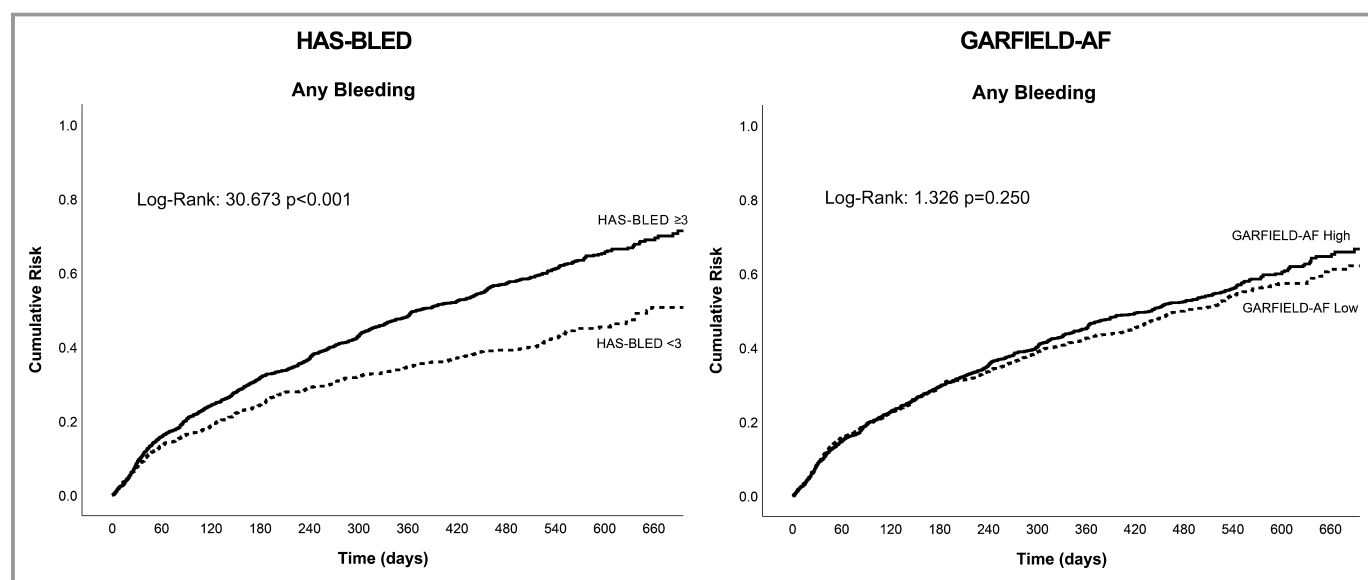
### Discrimination and Reclassification Analysis

On the basis of integrated discrimination improvement analyses, the GARFIELD-AF bleeding score showed a non-significant decrease in the averaged sensitivity for major bleeding ( $-0.2\%$ ,  $P=0.318$ ) and a non-significant increase in the averaged sensitivity for major/CRNM bleeding ( $0.1\%$ ,  $P=0.746$ ) in comparison with the HAS-BLED score (Table 3). Using net reclassification improvement, there was a non-significant negative reclassification against HAS-BLED for major bleeding ( $-4.2\%$ ,  $P=0.448$ ) and a non-significant positive reclassification for major/CRNM bleeding ( $3.3\%$ ,  $P=0.756$ ). The GARFIELD-AF bleeding score had a significantly

lower sensitivity and a negative reclassification for any bleeding compared with HAS-BLED, assessed by both integrated discrimination improvement ( $-1.1\%$ ,  $P<0.001$ ) and net reclassification improvement ( $-8.7\%$ ,  $P<0.001$ ). This demonstrated that, overall, the median improvement of the GARFIELD-AF bleeding score was reduced almost in 2% compared with the HAS-BLED score ( $-1.6\%$ ,  $P<0.001$ ).

We also tested the clinical usefulness and net benefit of the 2 scores using decision curve analyses (Figure 3). For major bleeding and major/CRNM bleeding, the curves corresponding to both models overlapped, suggesting no apparent net benefit of one model over the other. Only a slight higher net benefit was observed for HAS-BLED for the major





**Figure 2.** Kaplan-Meier curves for any bleeding for GARFIELD-AF (Global Anticoagulant in the Field–Atrial Fibrillation) bleeding and HAS-BLED (Hypertension, Abnormal renal and liver function, Stroke, Bleeding, Labile INRs, Elderly, Drugs or alcohol) scores.

bleeding outcome. However, the HAS-BLED score graphically demonstrated a net benefit of  $\approx 5\%$  over the GARFIELD-AF bleeding score for any bleeding.

### Sensitivity Analysis

Throughout the entire follow-up period, a total of 804 (22.6%) of patients interrupted warfarin treatment. A sensitivity analysis on the predictive ability of HAS-BLED and GARFIELD-AF bleeding scores based only on patients who continued treatment was then performed (Table 4).

The HAS-BLED score modestly significantly predicted all the bleeding outcomes, with a slightly higher predictive capacity. The GARFIELD-AF bleeding score did not predict major bleeding and any bleeding outcomes but had marginal predictive capacity for major/CRNM bleeding in this on-treatment analysis.

Comparing C-indexes, the HAS-BLED score had a significantly higher predictive capacity for the any bleeding outcome ( $P<0.001$ ).

### Discussion

In this analysis, derived from a large international randomized controlled trial, we showed that the HAS-BLED score had modest predictive capacity for all the bleeding outcomes, but was significantly associated with all bleeding outcomes. Conversely, the GARFIELD-AF bleeding score showed modest predictive capacity for major and major/CRNM bleeding outcomes but did not predict the any bleeding outcome. Second, when comparing the more complex GARFIELD-AF bleeding score with the simple HAS-BLED score, there was no significant advantage in terms of reclassification and net benefit for major bleeding and major/CRNM bleeding; however, the HAS-BLED score demonstrated a net benefit of  $\approx 5\%$  over the GARFIELD-AF bleeding score for the any bleeding outcome. Finally, the on-treatment cohort analysis shows that the HAS-BLED score significantly predicted all the bleeding outcomes studied, whereas the GARFIELD-AF score only marginally predicted major/CRNM bleeding.

**Table 2.** Survival and Predictive Analysis for Bleeding Outcomes for GARFIELD-AF Bleeding and HAS-BLED Scores

Variable	HAS-BLED		GARFIELD-AF	
	HR (95% CI)	C-Index (95% CI)	HR (95% CI)	C-Index (95% CI)
Major bleeding	1.31 (1.14–1.51)	0.58 (0.56–0.60)	1.39 (1.04–1.86)	0.56 (0.54–0.57)
Major/CRNM bleeding	1.23 (1.09–1.39)	0.56 (0.54–0.58)	1.23 (0.99–1.54)	0.57 (0.55–0.58)
Any bleeding	1.13 (1.09–1.18)	0.55 (0.53–0.57)	1.05 (0.98–1.13)	0.51 (0.49–0.53)

CI indicates confidence interval; CRNM, clinically relevant nonmajor; GARFIELD-AF, Global Anticoagulant in the Field–Atrial Fibrillation; HAS-BLED, Hypertension, Abnormal renal and liver function, Stroke, Bleeding, Labile INRs, Elderly, Drugs or alcohol; HR, hazard ratio.

**Table 3.** IDI, NRI, and Median Improvement Between GARFIELD-AF Bleeding and HAS-BLED Scores

Variable	GARFIELD-AF vs HAS-BLED								
	IDI	95% CI	P Value	NRI	95% CI	P Value	Median Improvement	95% CI	P Value
Major bleeding	−0.002	−0.007/0.003	0.318	−0.042	−0.189/0.087	0.448	−0.002	−0.010/0.005	0.308
Major/CRNM bleeding	0.001	−0.005/0.007	0.746	0.033	−0.094/0.129	0.756	0.001	−0.007/0.009	0.378
Any bleeding	−0.011	−0.019/−0.005	<0.001	−0.087	−0.131/−0.056	<0.001	−0.016	−0.030/−0.001	<0.001

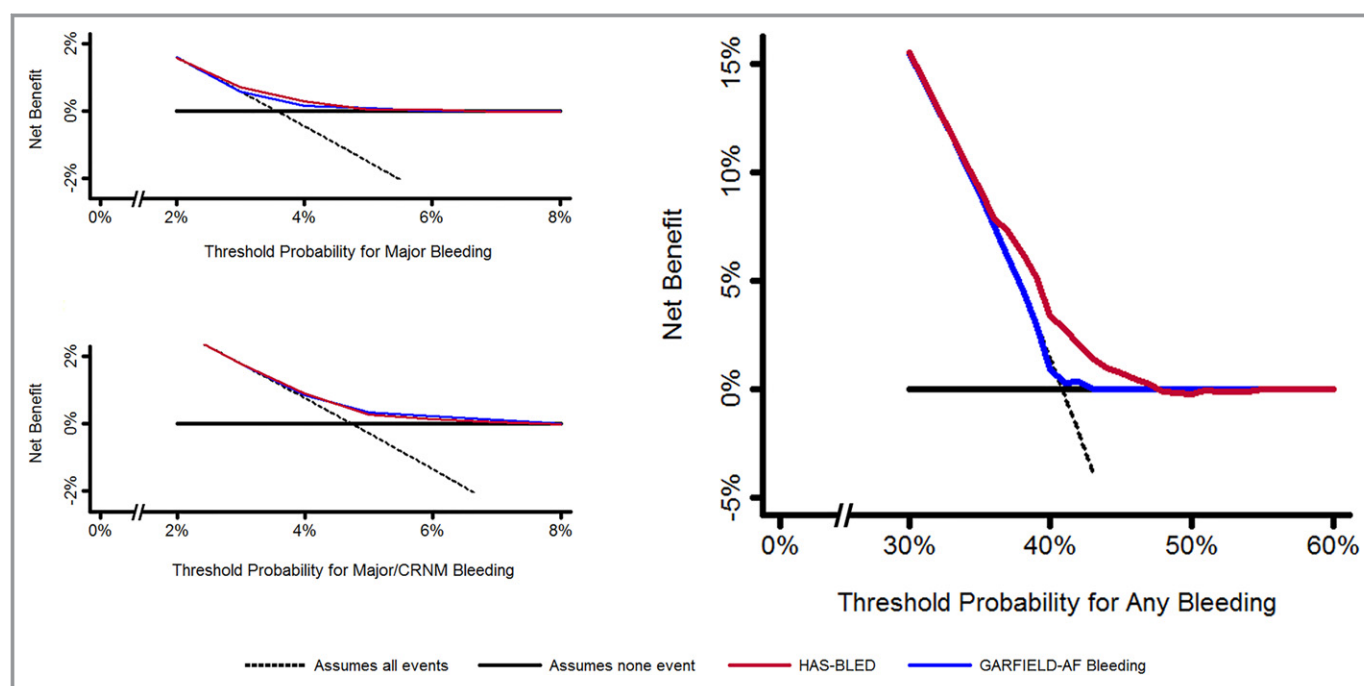
CI indicates confidence interval; CRNM, clinically relevant nonmajor; GARFIELD-AF, Global Anticoagulant in the Field–Atrial Fibrillation; HAS-BLED, Hypertension, Abnormal renal and liver function, Stroke, Bleeding, Labile INRs, Elderly, Drugs or alcohol; IDI, integrated discrimination improvement; NRI, net reclassification improvement.

Incident bleeding events among patients with AF taking anticoagulants are a feared complication when prescribing OACs,<sup>22</sup> and overestimating patients' bleeding risk leads to underprescription of OACs.<sup>23</sup> Data from the ORBIT-AF (Outcomes Registry for Better Informed Treatment of AF) study show that history of bleeding was one of the most prevalent reasons for not prescribing OACs,<sup>24</sup> as well as for OAC discontinuation.<sup>25</sup>

The impact of bleeding events, irrespective of the type, can be strongly relevant in the clinical course and decision making for patients with AF. Major bleeding events can lead to a significant risk of death and major adverse outcomes, both short- and long-term.<sup>26,27</sup> Also, all bleeding events are associated with an impaired quality of life.<sup>28</sup> Irrespective of type, patients experiencing a bleeding event are more likely to discontinue OAC treatment,<sup>29</sup> which is associated with an increased risk for clinically significant events.<sup>30</sup>

Nonetheless, a high risk of bleeding should not be a reason to withhold OAC prescription.<sup>8</sup> Guidelines on management of AF recommend assessing baseline bleeding risk to evaluate specific interventions to control and reduce this risk.<sup>4</sup> Also, bleeding risk assessment should be routinely repeated at follow-up visits and modifiable risks should be managed appropriately.<sup>5</sup>

Thus far, the HAS-BLED score has been validated in several cohorts and is able to predict major bleeding in various clinical settings.<sup>31–34</sup> Several studies reported about the comparison between HAS-BLED and other bleeding risk scores in vitamin K antagonist-treated cohorts.<sup>31,35–39</sup> These studies all demonstrate a modest predictive capacity for these clinical bleeding risk scores, although most analyses reported that the HAS-BLED score performs best.<sup>31,36,38</sup> In particular, high-risk patients (HAS-BLED score  $\geq 3$ ) have a significantly



**Figure 3.** Decision curve analysis according to GARFIELD-AF (Global Anticoagulant in the Field–Atrial Fibrillation) bleeding and HAS-BLED (Hypertension, Abnormal renal and liver function, Stroke, Bleeding, Labile INRs, Elderly, Drugs or alcohol) scores. CRNM indicates clinically relevant nonmajor.

**Table 4.** Predictive Analysis for Bleeding Outcomes in On-Treatment Cohort

Variable	C-Index (95% CI)		P Value for Comparison
	HAS-BLED	GARFIELD-AF	
Major bleeding	0.60 (0.53–0.68)	0.55 (0.47–0.63)	0.352
Major/CRNM bleeding	0.59 (0.53–0.66)	0.57 (0.50–0.65)	0.694
Any bleeding	0.56 (0.54–0.58)	0.50 (0.48–0.53)	<0.001

CI indicates confidence interval; CRNM, clinically relevant nonmajor; GARFIELD-AF, Global Anticoagulant in the Field–Atrial Fibrillation; HAS-BLED, Hypertension, Abnormal renal and liver function, Stroke, Bleeding, Labile INRs, Elderly, Drugs or alcohol.

higher risk of major bleeding, as demonstrated in several studies.<sup>31,40</sup> In a Spanish real-world cohort, for example, a HAS-BLED score  $\geq 3$  demonstrated significant predictive ability (C-index [95% CI], 0.68 [0.65–0.71]).<sup>31</sup> Similar data, derived from the Loire Valley AF Project, showed that patients with a HAS-BLED score  $\geq 3$  reported a higher rate of major bleeding, with a significantly increased risk (hazard ratio, 3.57; 95% CI, 2.59–4.92) compared with patients with a HAS-BLED score of 2 and a HAS-BLED score of 0 to 1.<sup>40</sup>

The GARFIELD-AF bleeding score has been recently derived from the GARFIELD-AF registry study.<sup>13</sup> In the original derivation cohort, the GARFIELD-AF bleeding score performed modestly (C-index, 0.66; 95% CI, 0.62–0.69), with marginal improvement compared with the HAS-BLED score (C-index, 0.64; 95% CI, 0.61–0.68).<sup>13</sup> When applied in an external validation cohort, derived from the ORBIT-AF registry study, the new model performed less well (C-index, 0.61; 95% CI, 0.59–0.63 for the 3-year major bleeding risk).<sup>13</sup> Even if the GARFIELD-AF bleeding score is intended to be used as a continuous score, data from the derivation cohort showed that on stratifying according to the median value, those patients in the high-score group had a higher cumulative incidence, compared with those patients in the low-score group.<sup>13</sup> In addition, the statistical model used to derive the score cannot be easily compiled at the patient's bedside or in outpatient clinics, and the model proposed does not consider some established bleeding risk factors and strong predictors.<sup>41</sup> This aspect likely affects the predictive abilities of the GARFIELD-AF bleeding score in identifying any bleeding occurrence.

The ability of the scores to correctly identify patients more likely to experience a bleeding event allows us to properly flag up those high-risk patients to treat the modifiable bleeding risks and to help schedule those patients for early review and follow-up (eg, 4 weeks rather than 4–6 months)<sup>8,42</sup> to ultimately minimize the occurrence of any bleeding event throughout the long-term observation.

This study represents the first external independent validation of the new prognostic score, in a clinical trial cohort with adjudicated bleeding outcomes. Our data clearly showed that irrespective of the type of bleeding, the GARFIELD-AF bleeding score performed only modestly in predicting bleeding outcomes and was not predictive of any bleeding. At the cost of reduced ease and practicality, the GARFIELD-AF also did not show improvement in the discrimination or reclassification of bleeding risk. In the prediction of any bleeding outcome, the HAS-BLED score showed a significant net benefit compared with the GARFIELD-AF score, using decision curve analysis. This article provides needed evidence in the context of reassuring clinicians that the use of an established (and largely validated) simple score (ie, HAS-BLED) remains best, instead of using complex new scores with limited additional advantages.

## Limitations

This study is mainly limited by its post hoc retrospective nature. Given that the study cohort was derived from a randomized controlled trial, all bleeding risk factors were recorded and managed, probably resulting in a lower rate of bleeding events compared with the real-life populations. Furthermore, the exclusion of patients with liver disease from the original cohort, as well as the exclusive use of warfarin as an OAC treatment, may somewhat limit the generalizability of our results.

## Conclusions

The algorithm-based GARFIELD-AF bleeding score did not show any significant improvement in bleeding risk prediction for major and major/CRNM bleeding compared with the simple HAS-BLED score. For clinical usefulness in prediction of any bleeding, the HAS-BLED score showed a significant net benefit compared with the GARFIELD-AF score. The use of a simple, easy to compile, and accurate score, such as the HAS-BLED score, is pivotal to streamline the bleeding risk evaluation, favor the management of modifiable bleeding risk factors, and ultimately reduce the occurrence of any bleeding event.

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## Disclosures

Proietti has received a small consulting fee from Boehringer Ingelheim. Lip has served as consultant for Bayer/Janssen, BMS/Pfizer, Biotronik, Medtronic, Boehringer Ingelheim, Micro-life, and Daiichi-Sankyo; and has been a speaker for Bayer,



BMS/Pfizer, Medtronic, Boehringer Ingelheim, Microlife, Roche, and Daiichi-Sankyo. No fees were received personally. The remaining authors have no disclosures to report.

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# Supplemental Material

**Table S1. Major bleeding rates according to HAS-BLED score as reported in the original derivation cohort.<sup>1</sup>**

<b>HAS-BLED</b>	<b>Patients N</b>	<b>Major Bleeding N</b>	<b>Major Bleeding for 100 patient-years</b>
0	798	9	1.13
1	1286	13	1.02
2	744	14	1.88
3	187	7	3.74
4	46	4	8.70
5	8	1	12.50
6	2	0	0.0
7	-	-	-
8	-	-	-
9	-	-	-

### Supplemental Reference:

1. Pisters R, Lane DA, Nieuwlaat R, de Vos CB, Crijns HJGM, Lip GYH. A novel user-friendly score (HAS-BLED) to assess 1-year risk of major bleeding in patients with atrial fibrillation: the Euro Heart Survey. *Chest*. 2010;138:1093–100.