RESEARCH ARTICLE



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Time-in-therapeutic-range defined warfarin and direct oral anticoagulants in atrial fibrillation: a Nationwide Cohort Study

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ABSTRACT

Background: Little is known how individual time-in-therapeutic-range (TTR) impacts the effectiveness and safety of warfarin therapy compared to direct oral anticoagulants (DOACs) in patients with atrial fibrillation (AF).

Objective: To compare the effectiveness and safety of standard dose DOACs to warfarin in patients with AF, while categorizing warfarin treated patients into quartiles based on their individual TTR.

Materials and methods: We conducted a nationwide study including all patients with new-onset AF between 2011 and 2018 in Finland. Hazard ratios (HR) were calculated using Cox regression analysis with the inverse probability of treatment weighted method to assess the risks of ischaemic stroke (IS), intracranial haemorrhage (ICH) and mortality for users of apixaban (n = 12,426), dabigatran (n = 4545), rivaroxaban (n = 12,950) and warfarin (n = 43,548).

Results: The median TTR for warfarin users was 72%. Compared to the second best TTR quartile (reference), the risk of IS was higher in the two poorest TTR quartiles, and lower in the best TTR quartile and on rivaroxaban [2.35 (95% confidence interval, 1.85–2.85), 1.44 (1.18–1.75), 0.60 (0.47–0.77) and 0.72 (0.56–0.92)]. These differences were non-significant for apixaban and dabigatran. HR of ICH was 6.38 (4.88–8.35) and 1.87 (1.41–2.49) in the two poorest TTR groups, 1.44 (1.02–1.93) on rivaroxaban, and 0.58 (0.40–0.85) in the best TTR group compared to the reference group. Mortality was higher in the two poorest TTR groups and lowest in the best TTR group.

Conclusions: The outcome was unsatisfactory in the two lowest TTR quartiles – in half of the patients treated with warfarin. The differences between the high TTR groups and standard dose DOACs were absent or modest.

Introduction

The prevalence of atrial fibrillation (AF) continues to increase, and AF stands as the leading cause of ischaemic stroke (IS) [1,2]. However, the risk of stroke can be considerably mitigated through appropriate oral anticoagulation (OAC) therapy, using either warfarin or direct oral anticoagulants (DOACs) [3,4]. Effective anticoagulation with warfarin necessitates diligent monitoring of the international normalized ratio (INR) [5,6]. Consequently, DOACs are now preferred over warfarin for the treatment of non-valvular AF due in part to their simpler dosing regimen [7–9]. Nevertheless, there remains a subset of AF patients who continue to

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receive warfarin treatment for various reasons, such as its lower cost.

While the differences in the thromboembolic risk between patients on DOACs and warfarin have been relatively minor, DOAC therapy has shown a significantly reduced risk of intracranial bleeding. These observations are supported by robust evidence from both randomized controlled trials (RCTs) and real-life observational studies [4,10].

Anticoagulation control for patients with AF on warfarin has traditionally been gauged using the time-in-therapeutic-range (TTR) value, with TTR levels below 60% considered inadequate [11]. Inadequate warfarin control has been associated with an elevated risk of both thromboembolic and bleeding events [12–15]. RCTs have demonstrated that DOACs exhibit superior efficacy and safety, particularly in settings where warfarin control is suboptimal compared to centres with well-managed warfarin control [16–19]. However, there is limited real-life patient-level data available for comparing the quality of anticoagulation control between warfarin and DOAC treatments [20–22].

In this study, we assessed the effectiveness and safety of warfarin treatment stratified by different individual TTR levels and compared it with DOACs. We utilized a large nationwide cohort of OAC-naïve patients with new-onset AF, representing all levels of healthcare.

Materials and methods

Study population

The Finnish AntiCoagulation in Atrial Fibrillation (FinACAF) Study, identified by the ClinicalTrials Identifier NCT04645537 and ENCePP Identifier EUPAS29845, is a comprehensive nationwide retrospective register-based cohort study. The study encompassed all patients diagnosed with AF between 2004 and 2018 in Finland. The patients were identified, and patient data were collected from three national health care registers covering the complete Finnish population: the Care Register of Health Care (HILMO) for hospitalizations and outpatient specialist visits, the Care Register of Health Care (AvoHILMO) for primary health care visits, and the National Reimbursement Register maintained by the Social Insurance Institution (KELA) for drug prescriptions. The study design and methods have been previously reported [23]. To assess individual TTR values, laboratory data, including INR, was obtained from the six largest national central laboratories. For accurate patient data integration, the Finnish population and health care registers were linked using the national identification code assigned to all Finnish residents.

The study included patients aged 20 years or older with new-onset, non-valvular AF and who initiated OAC therapy between 1 January 2011 and 31 December 2018. The patient collection process is described in the Supplementary material online, Figure S1, and the used health care registers are summarized in Supplementary Table S1.

Treatment and outcome measures

For patients on warfarin, drug exposure began on the date of the first purchase if there was an INR measurement within 30 days prior. Intervals between INR measurements were required to be <60 days, and the drug exposure period concluded 60 days after the last INR measurement [13]. The exposure period was also terminated if 180 days passed without a new warfarin purchase or the purchase of any DOAC. The detailed protocol for assessing drug exposure is depicted in Supplementary material online, Figure S2.

The individual TTR value was calculated during the exposure period of warfarin treatment. This period started seven days after the initiation of exposure and ended at the exposure's conclusion, using Rosendaal's method [24]. Following interpolation of the method, the percentage of time during which the observed and calculated INR values fell between 2.0 (\geq) and 3.0 (\leq) was determined [24]. TTR was calculated for patients who had at least three INR measurements taken with intervals shorter than 60 days and patients were divided into TTR quartiles from the lowest to the highest TTR value [13].

For patients receiving DOACs, the drug exposure period commenced on the first date of drug purchase, assuming standard dosing (dabigatran 150 mg bd., apixaban 5 mg bd. and rivaroxaban 20 mg od.). The drug exposure period continued until 30 days after the estimated depletion of the drugs if no subsequent purchases were made. If a patient switched to another OAC or another dose of the used DOAC, the exposure period with DOACs immediately terminated.

The outcomes of interest in this study were IS, intracranial haemorrhage (ICH), any bleeding and all-cause mortality, following the initiation of OAC exposure, were obtained from the register of Health Care (HILMO) for hospitalizations (codes used for the comorbidities and outcome measures, Supplementary material online, Table S2). Dates of death were retrieved from the National Cause of Death Register. For patients with a history of IS, ICH or bleeding before starting OAC exposure, a new or recurrent event was considered an endpoint event if it met the following criteria: (1) the event was the main diagnosis of hospitalization and (2) a minimum of 90 days had elapsed since the previous diagnosed event.

Participants were followed for the occurrence of IS, ICH or bleeding events until 31 December 2018, or until death, or until the OAC exposure reached a maximum duration of 730 days, whichever came first. The follow-up period was capped at 730 days due to the limited number of patients with DOAC exposure exceeding 730 days (Supplementary material online, Figure S2).

To predict the risk of poor INR control in patients receiving warfarin treatment, we utilized the modified SAMe-TT₂R₂ score, a clinical tool for predicting the quality of warfarin therapy by individual TTR based on patient characteristics [11,25]. As smoking status and ethnicity information (more than 90% of the Finnish population are ethnic Finns) were not available, the modified SAMe-TT₂R₂ score was calculated excluding these factors, considering sex (female: 1 point), age (<60 years: 1 point), medical history (history of more than two of the following: hypertension, diabetes, coronary artery disease, peripheral artery disease; 1 point) and treatment (amiodarone: 1 point).

Study ethics

The study protocol was approved by the Research Ethics Committee of the Faculty of Medicine of Helsinki University, Helsinki, Finland and granted research permission from the Helsinki University Hospital. The study was conducted without any direct patient involvement or contact in any phase of the study. Therefore, no patient consent is needed according to Finnish legislation and the consent was waived off due to the retrospective nature of this study. Patients' identification numbers were pseudonymized, and the research group received individualized but unidentifiable data. The study conforms to the Declaration of Helsinki as revised in 2013 and to European General Data Protection Regulation (EGDPR), and followed the Strengthening the Reporting of Observational Studies in Epidemiology (STROBE) statement [26].

Statistical methods

Crude and weighted event rates per 100 patient years (py) were reported for different OAC groups. Cox regression analysis was utilized to estimate event hazard ratios (HRs) with 95% confidence intervals (95% Cls) between the OAC groups. Upon visual inspection, the second-best TTR quartile was found to be the closest to the DOAC groups, thus selected as the reference group. To account for potential variations in baseline characteristics among the patient groups, an inverse probability of treatment weighting was employed. The treatment weights were derived using a generalized boosted model with 10,000 regression trees, aimed at achieving balanced treatment populations that represent the average treatment effect for the overall population. The covariates used in the weighting process included age, sex, previous stroke or transient ischaemic attack, vascular disease, hypertension, diabetes, cancer, use of statins or antithrombotic drugs, CHA₂DS₂-VASc score and HAS-BLED-score. To assess the balance between the populations, standardized mean differences between the groups were examined, with a threshold of 0.1 set to determine acceptable balance between the weighted groups. The statistical analyses were conducted using R version 4.2.1 (R Foundation for Statistical Computing, Vienna, Austria), and a significance threshold of .05 was considered for the *p* values.

Results

In total, 74,008 patients with a new diagnosis of AF between 2011 and 2018 were included in the study (Supplementary material online, Figure S1). Overall, 43,548 (58.8%) patients initiated OAC therapy with warfarin, 12,950 (17.5%) with rivaroxaban, 12,426 (16.8%) with apixaban, 4545 (6.1%) with dabigatran and 539 (0.7%) with edoxaban (Table 1). Among patients on warfarin, the mean and median TTR over the exposure period were 66% and 72%, respectively. The mean TTR values (range) in the warfarin quartiles were 32% (0-52%) in the first quartile, 65% (52-72%) in the second quartile, 77% (72-83%) in the third quartile and 90% (83-100%) in the highest quartile. Supplementary material online, Figure S3, depicts the trends in the initiation of OACs in patients with new-onset AF in Finland from 2011 to 2018.

The study cohort consisted of 49.6% females, with a mean age of 73.0 years. Hypertension was the most prevalent comorbidity (78.8%). Patients on warfarin were, in turn, slightly older and had slightly higher CHA₂DS₂-VASc scores compared to patients on apixaban, edoxaban or rivaroxaban (Table 1). Patients initiating dabigatran treatment, in turn, were more often male and younger, with lower CHA₂DS₂-VASc scores compared to the other treatment groups. The mean follow-up times ranged from 273 days with edoxaban to 400 days with warfarin.

Table 1. Baseline characteristics of the study cohort according to oral anticoagulant categories.

	Warfarin 1st TTR quartile (lowest)	Warfarin 2nd TTR quartile	Warfarin 3rd TTR quartile	Warfarin 4th TTR quartile (highest)	Dabigatran	Rivaroxaban	Apixaban	Edoxaban	SMD before weighting	SMD after weighting
Ν	10,883	10,877	10,893	10,895	4545	12,950	12,426	539		
Demographics Mean age, years	73.6 (11.8)	75.3 (10.3)	75.0 (9.7)	73.7 (9.9)	67.1 (8.6)	70.9 (10.6)	72.2 (10.1)	71.6 (9.7)	0.33	0.017
(SD)										
Female sex	5305 (48.7)	5898 (54.2)	6044 (55.5)	5624 (51.6)	1809 (39.8)	5898 (45.5)	5867 (47.2)	232 (43.0)	0.119	0.015
Income quintiles									0.275	
1st (lowest)	2826 (26.0)	2790 (25.7)	2584 (23.7)	2486 (22.8)	406 (8.9)	1779 (13.7)	1848 (14.9)	82 (15.2)		
2nd	2413	2532	2468	2363	627 (13.8)	2090 (16.1)	2205 (17.7)	103 (19.1)		
	(22.2)	(23.3)	(22.7)	(21.7)						
3rd	2077	2210	2326	2281	838 (18.4)	2519 (19.5)	2451 (19.7)	98 (18.2)		
	(19.1)	(20.3)	(21.4)	(20.9)						
4th	1869	1830	1933	2026	1194 (26.3)	2981 (23.0)	2835 (22.8)	132 (24.5)		
	(17.2)	(16.8)	(17.7)	(18.6)						
5th (highest)	1697 (15.6)	1515 (13.9)	1582 (14.5)	1739 (16.0)	1480 (32.6)	3578 (27.6)	3085 (24.8)	124 (23.0)		
Comorbidities										
Chronic kidney disease	702 (6.5)	453 (4.2)	349 (3.2)	275 (2.5)	46 (1.0)	151 (1.2)	336 (2.7)	9 (1.7)	0.102	
Any vascular	3310	3191	3053	2693	830 (18.3)	2882 (22.3)	3130 (25.2)	126 (23.4)	0.108	0.01
disease	(30.4)	(29.3)	(28.0)	(24.7)						
Cancer	2344 (21.5)	2480	2336 (21.4)	2172 (19.9)	692 (15.2)	2420 (18.7)	2551 (20.5)	110 (20.4)	0.074	
Dementia	560 (5.1)	502 (4.6)	426 (3.9)	325 (3.0)	36 (0.8)	311 (2.4)	344 (2.8)	27 (5.0)	0.124	
Diabetes	2971	2981 (27.4)	2583	2333 (21.4)	1064 (23.4)	2993 (23.1)	3346 (26.9)	157 (29.1)	0.071	0.004
Dyslipidaemia	5870	6252	6108	5812	2477 (54.5)	6965 (53.8)	7321 (58.9)	328 (60.9)	0.075	
Hoart failuro	2580	2338	(30.1)	(33.3)	310 (6.8)	1241 (9.6)	1649 (133)	53 (9.8)	0 167	
ficart failure	(23.7)	(21.5)	(163)	(12.7)	510 (0.0)	1241 (9.0)	1045 (15.5)	55 (5.0)	0.107	
Hypertension	8516	8780	8752	8461	3483 (76.6)	10 059 (77 7)	9902 (797)	426 (79.0)	0.037	0.008
nypertension	(78 3)	(80.7)	(80.3)	(77 7)	5 105 (7 0.0)	10,035 (77.77)	JJ02 (75.7)	120 (75.0)	0.057	0.000
Prior bleeding	1277	1128	970 (8.9)	874 (8.0)	345 (7.6)	1214 (9.4)	1299 (10.5)	45 (8.3)	0.05	0.049
Prior IS or TIA	1783	1920	1866	1749	689 (15.2)	1632 (12.6)	2105 (16.9)	65 (12.1)	0.079	0.022
COPD	860 (7.9)	707 (65)	(17.1)	(10.1)	176 (3.9)	595 (4.6)	688 (5 5)	20 (37)	0.086	
Medications	000 (7.5)	/0/ (0.5)	450 (4.0)	552 (5.0)	170 (3.2)	575 (4.0)	000 (5.5)	20 (5.7)	0.000	
Statins	4113	4580	4597	4385	1758 (38.7)	4816 (37.2)	5248 (42.2)	240 (44.5)	0.074	0.008
Antithrombotic	1095	(11.0)	1077 (9.9)	948 (8.7)	340 (7.5)	1076 (8.3)	1245 (10.0)	39 (7.2)		
ACE or ATR	(10.1) 5247 (48.2)	(11.0) 5690 (5.2.2)	5572	5305 (48.t)	1810 (39.8)	4718 (36.4)	3766 (30.3)	108 (20.0)		
Pick scores	(40.2)	(J2.3)	(31.2)							
Mean modified	2.3 (1.1)	2.3 (1.0)	2.2 (0.9)	2.1 (0.9)	2.0 (1.0)	2.1 (1.0)	2.2 (1.0)	2.1 (1.0)	0.12	0.022
Mean CHA ₂ DS ₂ -VASc	3.7 (1.9)	3.9 (1.7)	3.8 (1.7)	3.5 (1.7)	2.8 (1.5)	3.2 (1.7)	3.5 (1.7)	3.3 (1.6)	0.265	0.036
score Exposure, mean (median), days	236 (178)	448 (449)	512 (640)	467 (532)	389 (349)	398 (354)	357 (304)	273 (206)		

 CHA_2DS_2 -VASc score: congestive heart failure (1 point), hypertension (1 point), age \geq 75 years (2 points), diabetes (1 point), history of stroke or TIA (2 points), vascular disease (1 point), age 65–74 years (1 point), sex category (female) (1 point); COPD: chronic obstructive pulmonary disease; IS: ischemic stroke; modified HAS-BLED score: hypertension (1 point), abnormal renal or liver function (1 point each), prior stroke (1 point), bleeding history (1 point), age >65 years (1 point), alcohol abuse (1 point), concomitant antiplatelet/NSAIDs (1 point) (no labile INR, max score 8); SMD: standardized mean difference; TIA: transient ischemic attack; TTR: time-in-therapeutic-range; ACE: angiotensin converting enzyme inhibitor; ATR: angiotensin II receptor blocker. Values denote proportions (%) or means with standard deviations.

Edoxaban was excluded from the main analyses due to the small number of patients and limited exposure time. Supplementary material online, Figure S4, illustrates the cumulative incidence of the study endpoints, including also edoxaban.

Ischaemic stroke and intracranial haemorrhage

During the follow-up period, there were 1002 IS and 673 ICH events in the study population. Among patients on warfarin, the rates of IS in TTR quartiles were 3.45, 1.79, 1.18 and 0.74/100 py from the lowest



Figure 1. Crude cumulative incidence curves of (a) ischaemic stroke, (b) intracranial haemorrhage and (c) all-cause mortality in the studied oral anticoagulation groups. TTR: time-in-therapeutic-range.

to the highest quartile, respectively (Figure 1(a), Table 2). The rates of IS among patients on standard dose DOACs were 1.08/100 py for apixaban, 0.73/100 py for dabigatran and 0.83/100 py for rivaroxaban. Compared to the third (second best) TTR group (reference), the weighted risk of IS was significantly higher in the two poorest TTR groups (HR 2.35, 95% CI 1.85–2.85 and

HR 1.44, 1.18–1.75) (Figure 2). On the other hand, the best TTR quartile and rivaroxaban group had slightly lower risks of IS, and the risks were similar for apixaban, dabigatran and the second best TTR groups.

The crude incidence rates of ICH were 3.60, 0.99, 0.51 and 0.32/100 py from the lowest to the highest TTR quartile, respectively (Table 2). The corresponding

Table 2	2. C	Irude a	and	weighted	rates	of	outcome	events	according	to	the	treatment	categories

	Warfarin 1st			Warfarin 4th			
	(lowest)	Warfarin 2nd TTR quartile	Warfarin 3rd TTR quartile	(highest)	Apixaban	Dabigatran	Rivaroxaban
lschaemic stroke		1					
Events (n)	238	236	178	102	110	33	105
Crude rate ^a	3.45	1.79	1.18	0.74	1.05	0.73	0.83
Weighted rate ^a	3.15	1.70	1.16	0.70	1.06	1.32	0.87
Intracranial haemorrhage							
Events (n)	249	131	78	44	65	21	85
Crude rate ^a	3.60	0.99	0.51	0.32	0.62	0.47	0.67
Weighted rate ^a	3.38	0.96	0.51	0.30	0.65	0.70	0.65
Any bleeding							
Events (n)	987	690	548	361	478	130	670
Crude rate ^a	14.90	5.38	3.71	2.67	4.64	2.92	5.42
Weighted rate ^a	14.29	5.24	3.61	2.59	4.65	2.93	5.84
All-cause mortality							
Events (n)	1147	709	351	211	295	52	265
Crude rate ^a	16.45	5.33	2.31	1.53	2.80	1.51	2.08
Weighted rate ^a	14.61	4.80	2.04	1.31	2.88	1.56	2.55

TTR: time-in-therapeutic-range.

^aRates depict events per 100 patient years.

rates of ICH were 0.62, 0.47 and 0.67/100 py for apixaban, dabigatran and rivaroxaban, respectively. The weighted risk of ICH was significantly higher in the two poorest TTR groups compared to the second best TTR group (Figure 2). The weighted risk of ICH was also slightly higher for rivaroxaban, while the risk was similar for apixaban, dabigatran and the second best TTR groups. Notably, the best TTR group had the lowest risk of ICH.

Bleeding events

The crude incidence rates of any bleeding events were highest in the poorest warfarin TTR group and lowest in the dabigatran group and the best warfarin TTR group (Figure 1(b), Table 2). The weighted risk of bleeding was significantly higher in the poorest TTR group compared to the second best TTR group (HR 3.49, 95% CI 3.13–3.89) and all the DOAC groups (Figure 2). The crude and weighted risk of bleeding was lower with dabigatran compared to all the other DOACs.

All-cause mortality

The all-cause mortality was highest in the two lowest TTR groups (Figure 1(c), Table 2). Among patients on standard dose DOACs, the rate of death was 2.80/100 py for apixaban, 1.51/100 py for dabigatran and 2.08/100 py for rivaroxaban. The Cox weighted risk of death was significantly higher (HR 6.79, 5.95–7.76 and HR 2.34, 2.06–2.67) in the two poorest TTR groups and significantly lower in the best TTR group when compared to the second best TTR group (HR 0.64, 0.54–0.76; Figure 2).

Warfarin patients analysed as one group

When warfarin patients were analysed as a single group, the weighted risk of IS was significantly lower (HR 0.69, 0.56–0.85 and HR 0.59, 0.48–0.73) in patients on apixaban and rivaroxaban compared to the warfarin group (Figure 3). The weighted risk of ICH was also significantly lower in patients on apixaban and rivaroxaban compared to the warfarin group. Furthermore, the risk of death was lower in all DOAC groups compared to warfarin (Figure 3).

Pre-estimation of the choice of optimal oral anticoagulation

Supplementary Tables S3 and S4 and Figure S5 provide information on the modified SAMe- TT_2R_2 -score in the four TTR groups of patients on warfarin and patients on the DOACs. Patients in the highest TTR group had the lowest proportion of patients in modified SAMe- TT_2R_2 -score classes 2 or higher, primarily due to the lower prevalence of heart failure in this group. However, the overall difference between the TTR groups was only modest. Patients on apixaban had the highest proportion of patients in the modified SAMe- TT_2R_2 -score classes 2 or higher the the TTR groups was only modest. Patients on apixaban had the highest proportion of patients in the modified SAMe- TT_2R_2 -score classes 2 or higher compared to the other DOAC groups.

Discussion

In our comprehensive nationwide study, encompassing all patients with new-onset AF in Finland across various health care settings, we identified a significant association between individual TTR and the effectiveness



Figure 2. Inverse-probability-of-treatment-weighted Cox hazard ratios of calculated incidence rates per 100 patient years for direct oral anticoagulants compared with warfarin in different time-in-therapeutic-range groups for ischaemic stroke, intracranial haem-orrhage, any bleeding and death endpoints. Reference group (1) = warfarin patients with the second best (TTR group 3) time-in-therapeutic-range (TTR).

and safety of warfarin therapy. Specifically, we observed that half of the patients treated with warfarin, with suboptimal individual TTR (<72%), faced a considerably higher risk of IS, ICH and all-cause mortality when compared to patients with adequate TTR

or those receiving DOACs. Notably, the lowest TTR quartile demonstrated a substantially elevated risk of adverse events compared to other patients on OAC.

Utilization of all OACs increased in patients with AF in Finland during the 2010s. The introduction of

Figure 3. Inverse probability of treatment weighted Cox hazard ratios of calculated incidence rates per 100 patient years for direct oral anticoagulants compared with warfarin for ischaemic stroke, intracranial haemorrhage, any bleeding and death endpoints. Reference group (1) = warfarin.

DOACs probably enhanced this process, although their widespread use was somewhat delayed due to the national reimbursement practices [9]. It is important to note that we observed significant differences in baseline characteristics between the DOAC and warfarin groups. Dabigatran, as the first available DOAC for AF treatment, was predominantly initiated by younger patients with a lower prevalence of coronary heart disease and heart failure. Conversely, the differences in comorbidities were relatively modest between patients on warfarin, apixaban or rivaroxaban.

The overall risk of IS among AF patients receiving OAC was generally low; the crude IS rate in all patients in our study was 1.31/100 py, with a slightly higher rate of 1.54/100 py in warfarin-treated patients. Reported IS rates in real-life studies and RCTs [4,27,28] have varied, ranging from 1 to 2/100 py, but higher rates of 2 to 4/100 py have been

more commonly observed [20–22,29–31]. Our study conducted an on-treatment analysis of patients who were on an OAC, based on either continuous INR measurements (for warfarin-treated patients) or uninterrupted drug purchases in DOAC users, which likely contributed to the observed lower IS rate. However, the relative risks between DOACs and warfarin in our study align with previously published data [4,10,31,32].

While the overall effectiveness of warfarin was comparable to previous reports, the risk of stroke exhibited significant variation depending on the quality of anticoagulation. Notably, the risk of IS was 2–4 times higher in the two poorest TTR groups compared to patients with TTR >72% or those on DOAC treatment.

In general, both the crude and relative rates of ICH between warfarin and DOACs in our study were consistent with earlier reports [10,16,17,20–22,27–31]. For

warfarin-treated patients, the crude rate of ICH ranged from 0.30 to 3.6/100 py across the best to the poorest TTR groups. It is well documented that warfarin use carries a higher risk of ICH compared to DOACs and antiplatelet therapy [3,4,31,33,34]. However, our results underscore that while the average risk of ICH is increased in patients on warfarin, the range of risk from the lowest to highest TTR is guite extensive, with a 10-fold difference observed in our patient population. In the best TTR group, the rate of ICH was remarkably low, 0.30/100 py, one of the lowest reported, including RCTs. This marks the first instance where any patient group on warfarin has demonstrated a lower risk of ICH compared to any other treatment. Furthermore, our individually assessed TTR setup provides a novel finding compared to RCTs, where centre-average-based TTR has been utilized. In the centre-based setup, warfarin patients, even in centres with good average TTR, had higher rate of ICH compared to patients on DOACs [16-19].

We observed the highest bleeding rate in the poorest TTR group on warfarin, while the lowest bleeding rates were seen in the best TTR group and in patients on dabigatran. The bleeding rates for the other groups were very similar. With the exception of apixaban, our findings regarding bleeding events align well with previous literature [10,31,35].

The overall mortality was higher for patients on warfarin compared to those on DOACs, but, similar to the results of IS, ICH and bleeding events, this finding was driven by the patients in the poor TTR quartiles.

Studies conducted before the era of DOACs indicated that suboptimal INR control during warfarin treatment is associated with a higher risk of thromboembolic and bleeding events [12,13]. Subsequent RCTs revealed that the efficacy and safety of DOACs compared to warfarin decline when the quality of warfarin therapy improves, as assessed by centre-based average TTR [16–19]. However, only three small studies have explored how the quality of warfarin anticoagulation, assessed by TTR of individual patients, correlates with the treatment outcomes of DOACs in real-life situations [20–22].

A study from China, involving 1428 patients on warfarin with a median TTR of 38.8%, revealed that a higher TTR was associated with better outcomes. However, even patients in the highest TTR group (TTR >56.2%) had a higher risk of stroke and ICH compared to patients on dabigatran [20]. In another study from Taiwan, where the target INR for calculating TTR was 1.5–2.5 due to the Asian population, the achieved mean TTR was also low (44.4%) in 5197 patients and only 23.5% of patients had a TTR >70%, in contrast to the median TTR of 72% in the present study. The effectiveness and safety of warfarin and DOACs were comparable when TTR was >50%, but if TTR was below 50%, DOACs were significantly better [21]. In the most recent real-world study from the US on 7163 patients on warfarin, apixaban, dabigatran or rivaroxaban, the median TTR was 55% and the risk of stroke and bleeding was markedly lower if TTR was ≥60% compared to patients with TTR <60% [22]. However, the study was underpowered to find significant differences in outcomes between warfarin and individual DOACs in propensity score analyses when patients on warfarin were divided into <60% and ≥60% TTR groups [22].

The SAMe-TT₂R₂-score is a validated tool which can help to find patients who are less likely to achieve a good TTR on warfarin [11,25]. The differences on the modified SAMe-TT₂R₂-score in our study between the warfarin TTR groups were only modest. Therefore, it appears unlikely that this or any other tool could effectively predict optimal anticoagulation control during warfarin treatment in non-valvular AF.

Our study has several strengths. First, the nationwide basis and large unselected cohort, covering all levels of healthcare, represent the most important strength. In Finland, all citizens have healthcare coverage, ensuring treatment accessibility for all, funded by taxation-based support.

Second, this study is the largest to compare warfarin with individual TTR data to DOACs in patients with AF. The slightly better quality of warfarin treatment in Finland compared to most previous reports ensures that warfarin is analysed fairly under optimal conditions [12,15]. Third, the results comparing warfarin as a whole to DOACs are consistent with previous reports. Nevertheless, our findings related to different TTR groups highlight a wide range of outcomes, from very poor to good, among patients on warfarin treatment. If warfarin is used, TTR must be as good as possible, and preferably more than 80% as seen in the present study.

We also acknowledge some limitations. The most crucial limitation is the retrospective register-based study design, subject to the general limitations of such approaches. Data accuracy depends on the quality of recording. However, the Finnish register for hospitalizations, from which all endpoints were gathered, has a long history of high quality and is well validated [36,37].

Since this is not a randomized study, caution must be exercised in interpreting our results. Although we used weighting methods to balance measured confounders, there may still be unmeasured or unknown confounders that could impact the results. Finally, our register data did not include information about smoking and ethnicity. As a result, the SAMe-TT₂R₂-score had to be calculated without this information, which may have weakened the assessment of whether the SAMe-TT₂R₂-score could be a reliable tool for predicting treatment outcomes. Also, based on limitations of the administrative data, we were unable to detail the reasons for the poor TTR.

Conclusions

In this nationwide study encompassing 74,008 patients with AF in Finland, we have established a robust association between the effectiveness and safety of warfarin and the quality of treatment. While the overall quality of warfarin treatment was acceptable, half of the patients on warfarin – the two poorest TTR groups – did not receive adequate anticoagulation treatment. The rates of IS, ICH and mortality were 2–10 times higher among patients on warfarin in the two lowest TTR quartiles, whereas the differences between the highest TTR groups and standard dose DOACs were only modest.

Author contributions

MLe, AL, JHau, JP, MLi, PM, MN, ALA, JHar and KEJA planned the work. MLe, AL, OH, JHau, JP, MLi, JK, EK, PT, KT and SI-S had access to the data, and MLe, OH, JHau and OL contributed to the statistical analyses. MLe drafted the manuscript. All authors contributed to the design of the study, have critically revised the draft, and have approved the final version of the submitted manuscript.

Ethical approval

The study protocol was approved by the Ethics Committee of the Medical Faculty of the University of Helsinki, Helsinki, Finland (nr. 15/2017).

Disclosure statement

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Data availability statement

The data underlying this article were provided by the Finnish Institute for Health and Welfare (THL), the Population Register Center and the Social Insurance Institution (KELA) under license. Based on the contracts with the Finnish registries, restrictions apply to the availability of these data, and so they are not publicly available. Data might be, however, available from the authors upon reasonable request and with permissions needed from the Finnish Institute for Health and Welfare (THL), the Population Register Center and the Social Insurance Institution (KELA).

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