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### ORIGINAL ARTICLE



## Physician perceptions and use of reduced-dose direct oral anticoagulants for extended phase venous thromboembolism treatment

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## Abstract

**Background:** The direct oral anticoagulants (DOACs), apixaban and rivaroxaban, have been studied for extended-phase treatment of venous thromboembolism (VTE). Yet, scant evidence exists surrounding clinician practice and decision-making regarding dose reduction.

**Aims:** Report clinician practice and characteristics surrounding dose reduction of DOACs for extended-phase VTE treatment.

**Methods:** We conducted a 16-question REDCap survey between July 14, 2021, and September 13, 2021, among ISTH 2021 Congress attendees and on Twitter. We explored factors associated with dose reduction using logistic regression. We used k-means clustering to identify distinct groups of dose-reduction decision-making. Random forest analysis explored demographics with respect to identified groups.

**Results:** Among 171 respondents, most were attending academic physicians from North America. Clinicians who treated larger volumes of patients had higher odds of dose reduction. We identified five clusters that showed distinct patterns of behavior regarding dose reduction. Cluster 1 rarely dose reduces and likely prescribes rivar-oxaban over apixaban; cluster 2 dose reduces frequently, does not consider age when dose-reducing, is least likely to temporarily reescalate dosing, and prescribes apixaban and rivaroxaban equally; cluster 3 dose reduces <50% of the time, and temporarily reescalates dosing during increased VTE risk; cluster 4 dose reduces frequently, temporarily reescalates dosing, and is most likely to prescribe apixaban over rivaroxaban; and cluster 5 dose reduces most frequently, and takes the fewest risk factors into consideration when deciding to dose reduce.

**Conclusions:** Most clinicians elect to dose-reduce DOACs for extended-phase anticoagulation. The likelihood of a clinician to dose reduce increases with volume of

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KEYWORDS

anticoagulant, apixaban, reduced-dose, rivaroxaban, treatment, venous thromboembolism

#### Essentials

- Extended phase direct oral anticoagulants (DOACs) are used to prevent 2° venous thrombosis (VTE).
- Clinicians variably elect reduced-dose DOACs apixaban & rivaroxaban to prevent 2° VTE.
- We surveyed 171 ISTH2021 & Twitter<sup>™</sup> respondents about DOAC prescription to prevent 2° VTE.
- Most respondents were academic & elect dose-reduction-especially if they treat many patients.

## 1 | INTRODUCTION

Patients who experience deep vein thrombosis (DVT) and pulmonary embolism (PE) in the absence of an identifiable, transient, major provoking factor<sup>1</sup> are often advised to continue anticoagulation indefinitely.<sup>2-4</sup> Extended-phase therapy with anticoagulation is continued for the prevention of recurrent thrombosis after the treatment phase (usually 3-6 months) is completed. Various direct oral anticoagulants (DOACs) have been studied for the prevention of recurrent thrombosis.<sup>5-7</sup> Two DOACs, apixaban and rivaroxaban, have evidence reporting the effectiveness and safety of reduced dose compared with treatment phase dose anticoagulation for extendedphase therapy.<sup>5,7</sup> Meta-analysis of these studies demonstrated that over 1 year, reduced-dose DOAC therapy was as effective as treatment-phase dose therapy to prevent recurrent venous thrombosis (VTE; relative risk 0.85; 95% confidence interval [CI] 0.51-1.42) and had a trend toward less bleeding (relative risk 0.74; 95% CI 0.52–1.05).<sup>8</sup> Subsequently, the US Food and Drug Administration approved the reduced-dose regimens of apixaban and rivaroxaban for reducing the risk of recurrent DVT and PE following the treatment phase of 6-12 months.<sup>9,10</sup> However, concern exists surrounding the dose reduction of DOACs among certain patient populations thought to be at a higher than usual risk for recurrent thrombosis. These include patients with obesity,<sup>11,12</sup> cancer,<sup>13,14</sup> and antiphospholipid syndrome.<sup>15,16</sup> Yet, little is known regarding physician preferences in selecting anticoagulants<sup>17</sup> and how physicians elect to either continue treatment- or reduced-dose anticoagulation for the prevention of recurrent VTE. Therefore, we conducted a study to better understand physician decision-making regarding DOAC dose reduction for extended-phase anticoagulation treatment.

## 2 | METHODS

This work was conducted by members the Venous ThromboEmbolism Network U.S. (VENUS)<sup>18</sup> Subcommittee on Venous thromboembolism Treatment and Anticoagulation Management. VENUS is a collaborative working group administered by the Hemostasis and Thrombosis Research Society and sponsored by the Anticoagulation Forum, National Blood Clot Alliance, and American Society of Hematology Foundation. Survey questions were generated during standing VENUS committee meetings and then iteratively refined by the members of the subcommittee via email consensus. The final survey (Appendix S1) included clinician demographic and practice characteristics, as well as clinical situations that were hypothesized based on VTE literature to potentially impact dose-reduction behaviors.

A targeted population-specific survey design was selected. A REDCap link was linked to the survey questionnaire. The survey was first deployed as part of the International Society of Thrombosis and Haemostasis (ISTH) 2021 meeting.<sup>19</sup> The ISTH includes more than 5000 clinicians and researchers in more than 100 countries. A link to the survey was embedded in the ISTH2021 Congress daily email newsletter, and posted during the meeting by investigators on the ISTH2021 Twitter feed. Second, an explanatory paragraph accompanied by an embedded link to the survey was disseminated by email to members of VENUS and the Hemostasis and Thrombosis Research Society,<sup>20</sup> a North American professional society dedicated to research, education, investigation, and advancement of work in hemostatic and thrombotic disorders. Last, VENUS members on Twitter created Twitter posts with a pithy explanation of the study and an embedded link to the REDCap survey. The survey was initiated on July 14, 2021, and closed on September 13, 2021. Study review was performed, and a waiver of signed informed consent was granted by the Intermountain Healthcare institutional review board. No financial support existed for the study.

Survey responses were described with descriptive statistics. Logistic regression was performed to assess demographics associated with electing dose reduction. In a sensitivity analysis, probit regression was used to identify demographics associated with frequency of dose reduction (rarely, sometimes, usually).

To understand whether identifiable cohorts of respondents approached dose reduction in a similar fashion, we used an unsupervised machine learning approach using clustering. We searched for the optimal number of clusters ( $2 \le k \le 10$ ) with k-means clustering by minimizing the silhouette score while maintaining sufficient

cluster size ( $n \ge 20$ ).<sup>21</sup> Leveraging simulations by Dalmaiher et al.,<sup>22</sup> we anticipate almost 100% accuracy for detecting the correct number of clusters when recruiting 200 participants. A visual inspection of the first two components of a principal component analysis was used to ensure sufficient distinctness between identified clusters. Dosing behaviors of the clusters were described with descriptive statistics, and frequencies were depicted with a heatmap.

We used a random forest approach to identify the importance of respondent demographics with respect to model accuracy in predicting DOAC dosing-behavior groups.<sup>23</sup> Hyperparameters were optimized with a grid search and model performance was assessed with out-of-bag estimate of error. A randomly selected subset of samples are used to train the decision trees. After the decision trees are trained on selected samples, the samples left out, or out-of-bag, are then presented to the decision trees for prediction. The out-ofbag-error rate is then computed as the number of errors that were predicted from the out-of-bag sample. All analyses were conducted using R version 4.0.3.

## 3 | RESULTS

Among the 172 individuals that accessed the survey, 171 engaged in the survey and 170 responded to all questions. Most (86.5%) respondents self-identified as attending physicians, 84.2% reported practicing in an academic setting, 67.8% were from North America, 50.3% had been practicing for fewer than 10 years, 38% spent greater than 80% of their clinical time in an ambulatory setting, and 24.6% prescribed more than 250 DOAC prescriptions annually. See Table 1 for additional demographics.

Among all respondents, 82.5% reported that they dose-reduce DOACs. Among those who dose reduce, 38% do so rarely (<25% of the time), 31.6% do so sometimes (25%-49% of the time), and 46.2% do so between 50% and 100% of the time. When asked to consider specific patient populations in which they refrain from dose reduction, 76.6% of participants responded that they refrain from dose reduction in patients with cancer, 66.7% in patients with antiphospholipid syndrome (for which vitamin K antagonists are recommended<sup>15</sup>), 66.1% in patients who had prior VTE while receiving anticoagulation therapy, 64.9% in patients with recurrent VTE, and 53.8% in patients that are obese. When asked to consider the likelihood of dose reduction in certain clinical situations, 84.8% of respondents stated that they would preferentially elect dose reduction in patients with a history of bleeding, 77.2% in patients with a history of distal DVT, 74.9% in patients prescribed concomitant platelet therapy, and 44% in patients with unusual site thrombosis. Sixty-two percent of respondents reported that they engage in temporary reescalation of DOAC dosing. When asked to consider clinical scenarios in which they elect to temporarily escalate DOAC dosing, 79% stated that they would do so in the setting of a new diagnosis of cancer, 75.8% in patients in the postoperative setting, 48.4% in patients requiring hospitalization, 45.3% in patients who have become bedbound or immobilized, and 21% in patients engaged in long-haul



travel. When asked whether they preferentially prescribe one DOAC over another, 46.8% of respondents preferentially prescribed apixaban, compared with 15.2% who preferentially prescribed rivaroxaban. Eighty-two percent of respondents stated they dose reduce with each medication equally. Additional dosing behaviors are found in Table 2.

Compared with respondents who treated fewer than 50 patients annually, respondents who treated greater than 250 patients annually had a 6.8-fold (odds ratio [OR] 6.8; 95% CI 1.36–37.75; p = 0.02) greater odds and those who treated 151–250 patients annually had a 4.0-fold (OR 4.0; 95% CI 1.01–16.33; p = 0.05) greater odds of

#### **TABLE 1** Demographics of survey participants

Attribute	N (%)
Status	
Attending physician	148 (86.5%)
Nurse practitioner/physician assistant/mid-level provider	10 (5.8%)
Trainee (student, resident, fellow)	13 (7.6%)
Specialty	
Thrombosis	75 (43.9%)
Other	96 (56.1%)
Setting	
Academic	144 (84.2%)
Nonacademic	27 (15.8%)
Percent of clinical time is outpatient care	
<50	34 (19.9%)
50-79	71 (41.5%)
≥80	65 (38.0%)
Years in practice	
≤10	86 (50.3%)
11-25	69 (40.4%)
>25	16 (9.4%)
Number of patients where you are involved in DOA	C prescriptions
<50	16 (9.4%)
51-250	51 (29.8%)
>250	42 (24.6%)
Institutional protocol to consider DOAC dose adjust	ment in place
Yes	14 (8.2%)
No	93 (54.4%)
Don't know	61 (35.7%)
Country	
North America	116 (67.8%)
Europe	31 (18.1%)
Other	24 (14.0%)
US region, <i>n</i> = 98	
East	43 (43.9%)
Midwest	34 (34.7%)
West	21 (21.4%)
Abbreviation: DOAC direct oral coagulant	

Abbreviation: DOAC, direct oral coagulant.

#### TABLE 2 Dosing behaviors of survey participants

Attribute	N (%)
Reduce dosage	
Yes	141 (82.5%)
No	30 (17.5%)
Frequency	
Usually (50%–100%)	79 (46.2%)
Sometimes (25%–49% of the time)	54 (31.6%)
Rarely (0%–24%)	38 (22.2%)
Risk factors to NOT dose reduce	
Cancer	131 (76.6%)
Antiphospholipid syndrome (if applicable to your practice)	114 (66.7%)
Prior VTE event on therapy	113 (66.1%)
Recurrent VTE	111 (64.9%)
Obesity (BMI > 30)	92 (53.8%)
Patient preference	74 (43.3%)
Heritable thrombophilia	60 (35.1%)
Estrogen-based hormone therapy	55 (32.2%)
Gestalt (just don't feel this is the right patient to decrease)	50 (29.2%)
Bedbound or immobility or sedentary	36 (21.1%)
Male	16 (9.4%)
Active smoking	15 (8.8%)
ECOG Performance Status	13 (7.6%)
Age	12 (7%)
Other	10 (5.8%)
Insurance coverage	6 (3.5%)
Diagnosis for reduction	
History of bleeding	145 (84.8%)
Distal DVT	132 (77.2%)
Proximal DVT	131 (76.6%)
Concurrent use of antiplatelet therapy	128 (74.9%)
Pulmonary embolism	123 (71.9%)
Unusual site thrombosis (cerebral vein thrombosis, splanchnic vein thrombosis)	69 (40.4%)
Temporary reescalation	
No	106 (62%)
Yes	62 (36.3%)
Reason for temporary reescalation ( $n = 62$ )	
Cancer (if original etiology for VTE was not cancer)	49 (79%)
Postsurgery	47 (75.8%)
Hospitalization	30 (48.4%)
Pregnancy or postpartum	30 (48.4%)
Hormone use	28 (45.2%)
Bedbound or immobility or sedentary	27 (43.5%)
Long travel	13 (21%)
Other	1 (1.6%)
	_ (21070)

#### TABLE 2 (Continued)

Attribute	N (%)
DOAC prescribed	
Apixaban	80 (46.8%)
Prescribe apixaban and rivaroxaban equally	65 (38%)
Rivaroxaban	26 (15.2%)
Medication reduced	
Both	140 (81.9%)
Apixaban	12 (7%)
Neither	12 (7%)
Rivaroxaban	7 (4.1%)
More comfortable	
No	150 (87.7%)
Yes	21 (12.3%)
Which $(n = 21)$	
Apixaban	17 (81%)
Rivaroxaban	4 (19%)
Dosing frequency affects decision	
No	141 (82.5%)
Yes	30 (17.5%)

Abbreviations: BMI, body mass index; DOAC, direct oral coagulant; DVT, deep vein thrombosis; VTE, venous thromboembolism.

dose-reducing. Respondents who had been in practice greater than 25 years had a lower odds (OR 0.23; 95% Cl 0.05–1.17; p = 0.07) of using dose reduction compared with those in practice fewer than 10 years. Other respondent characteristics were not found to have a significant association with dose reduction (Table 3). In the sensitivity analysis of dose-reduction frequency, those who did not have a protocol had a lower odds (OR 0.23; 95% Cl 0.06–0.74; p = 0.02) of dosing frequently, meanwhile those who were unsure if a protocol was in place had an even lower odds (OR 0.05; 95% Cl 0.01–0.32; p = 0.002) of dosing frequently (Table 4).

Upon assessing for clustering of clinicians around dose-reduction decision-making, five clusters emerged that showed distinct patterns of behavior (Figures 1 and 2). The clusters were different as follows: cluster 1 rarely dose reduces and is the cluster most likely to prescribe rivaroxaban over apixaban; cluster 2 dose reduces with considerable frequency, does not consider age when dose-reducing, is least likely to temporarily reescalate dosing during increased VTE risk, and prescribes apixaban and rivaroxaban equally; cluster 3 dose reduces <50% of the time, but temporarily reescalates dosing during increased VTE risk; cluster 4 dose reduces with considerable frequency, temporarily reescalates dosing during increased VTE risk, and is most likely to prescribe apixaban over rivaroxaban; and cluster 5 dose reduces with highest frequency, and takes the fewest risk factors into consideration to not dose reduce (Figure 3).

The best performing random forest model had an out-of-bag error rate of 67.7%. Considering that there were five clusters, an error rate <80% is better than chance. The error rates, (90.9%,

 TABLE 3
 Odds ratios for engaging in dose reduction; higher

 odds ratio indicates more likely to dose reduce

Parameter	Odds ratio (95% confidence interval)
Status: attending physician	
Status: nurse practitioner/physician assistant/mid-level	0.43 (0.06–3.81)
Status: trainee	0.44 (0.09–2.34)
Specialty: thrombosis	
Specialty: other	0.57 (0.18–1.73)
Setting: academic	
Setting: nonacademic	0.34 (0.09–1.20)
Outpatient time: <50%	
Outpatient time: 50%–79%	0.89 (0.23-3.16)
Outpatient time: ≥80%	3.03 (0.71-13.20)
Years in practice: ≤10	
Years in practice: 11–25	0.64 (0.21–1.91)
Years in practice: >25	0.23 (0.05–1.17)
Number of patients: <50	
Number of patients: 51–250	4.03 (1.01-16.33)
Number of patients: >250	6.80 (1.36-37.75)
International region: North America	
International region: Europe	0.38 (0.04–2.59)
International fegion: other	0.41 (0.04-3.05)
US region: East	
US region: Midwest	1.39 (0.34-6.13)
US region: West	1.74 (0.33-11.85)
US region: not US	1.23 (0.19–11.31)
Protocol: yes	
Protocol: no	0.00 (0.00->500)
Protocol: don't know	0.00 (0.00->500)

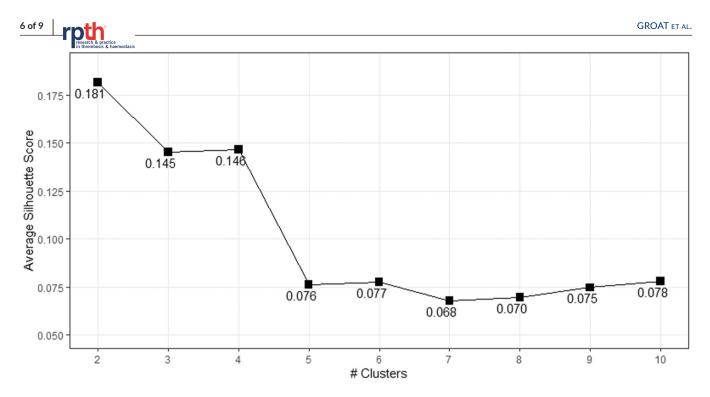
95.5%, and 88.2%) were considerably high for clusters 1, 3, and 4, respectively. The model performed well when predicting clusters 2 and 5 with error rates 36.8% and 65.7%, respectively. The respondent demographics that were most informative in determining DOAC dosing behaviors based on the random forest analysis were number of patients treated, geographic region, and percentage of patients that were outpatient (Figure 4).

## 4 | DISCUSSION

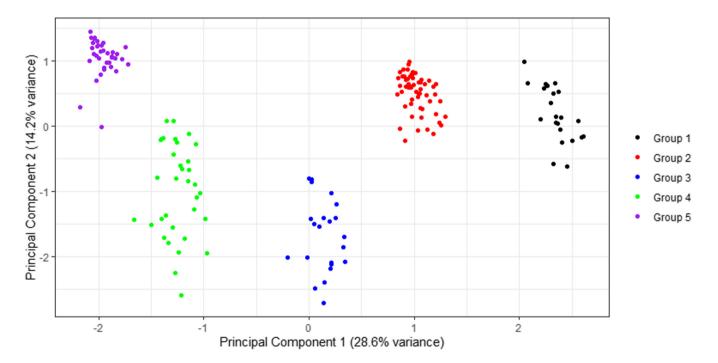
To our knowledge, this is the first study to report patterns surrounding the decision-making process involved in dose reduction of rivaroxaban and apixaban for extended-phase treatment of VTE. Our study demonstrates that most clinicians surveyed elect to dose reduce DOACs when prescribing extended-phase anticoagulation therapy. Second, those who prescribe DOACs more frequently and those who have practiced for fewer than 10 years are more likely to **TABLE 4** Odds ratios for sensitivity analysis for engaging in dose reduction; higher odds ratio indicates more likely to dose reduce

Parameter	Odds ratio (CI)	p value
Status: attending physician		
Status: nurse practitioner/ physician assistant/mid-level	0.558 (0.149–2.120)	0.38
Status: trainee	1.045 (0.320-3.463)	0.94
Specialty: thrombosis		
Specialty: other	0.549 (0.270-1.100)	0.09
Setting: academic		
Setting: nonacademic	1.163 (0.457–3.020)	0.75
Outpatient time: <50%		
Outpatient time: 50%-79%	0.878 (0.381-2.000)	0.76
Outpatient time: ≥80%	(0.001 2.000) 1.043 (0.440-2.452)	0.92
Years in practice: ≤10		
Years in practice: 11-25	1.423 (0.724–2.818)	0.31
Years in practice: >25	1.334 (0.438-4.324)	0.62
Number of patients: <50		
Number of patients: 51–250	1.710 (0.597-4.923)	0.32
Number of patients: >250	1.675 (0.545–5.132)	0.36
International region: North America		
International region: Europe	0.588 (0.173–1.930)	0.39
International region: other	0.411 (0.111-1.459)	0.17
US region: East		
US region: Midwest	0.942 (0.391-2.281)	0.89
US region: West	1.055 (0.374–3.024)	0.92
US region: Not US	0.970 (0.317-3.034)	0.96
Protocol: yes		
Protocol: no	0.232 (0.063-0.740)	0.02
Protocol: don't know	0.054 (0.008-0.317)	0.002

dose reduce. Interestingly, we observed a clustering of respondents into five groups with specific behaviors surrounding dose reduction. We identified provider characteristics that help explain how these clusters are different from each other with a random forest model. We chose a random forest model for predicting clusters because



**FIGURE 1** Silhouette scores for two to 10 clusters for direct oral coagulant dosing behaviors, with lower scores indicative of better separation between the clusters



**FIGURE 2** Principal component analysis demonstrates good separation between the five clusters. A summative description of each cluster is found in the Results.

the results (e.g., model performance, important variables) are easy to interpret. The random forest model was limited in its ability to associate and predict prescriber demographics within the identified clusters, which suggests that dose reduction behaviors are not readily characterized based on demographics alone.

Our study builds on previously reported prospective randomized trials that demonstrate the safety and efficacy of dose-reduced apixaban and rivaroxaban<sup>5,7</sup> by providing important insight into how clinicians are translating these study findings into clinical practice. Understanding the clinician characteristics and practice behavior patterns permits greater insight into clinical practice, provides opportunities to intervene in a targeted fashion to enhance clinician knowledge surrounding evidence for dose reduction, as well as provides insight for futures studies. We assessed salient physician

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<b>GURE 3</b> Dosing behaviors five clusters and entire cohort,		All n=171	Cluster 1 n=22	Cluster 2 n=57	Cluster 3 n=22	Cluster 4 n=34	Cluster n=36
presented as percentage of respondents	Do you dose reduce?						
at belong to each group. A summative	Yes	82.5	31.8	98.2	45.5	97.1	97.2
scription each cluster is found in	How often do you dose reduce?				and the second second		
Results paragraph 3	Rarely (0-25%)	22.2	86.4	5.3	59.1	2.9	5.6
	Sometimes (25-50%) Usually (50-100%)	31.6 46.2	13.6 0.0	40.4 54.4	22.7 18.2	38.2 58.8	27.8 66.7
	Risk factors considered to inform	40.2	0.0	04.4	10.2	0.0	00.7
	dose reduction						
	Heritable Thrombophilia	35.1	27.3	35.1	54.5	64.7	0.0
	Active Smoking	8.8	13.6	5.3	22.7	11.8	0.0
	ECOG Performance Status	7.6	4.5	3.5	27.3	11.8	0.0
	Male Sex	9.4	18.2	7.0	13.6	11.8	2.8
	Insurance Coverage Immobile/Sedentary	3.5	0.0 9.1	5.3	0.0	0.0	8.3
	Estrogen Therapy	21.1 32.2	9.1	17.5 31.6	50.0 59.1	29.4 52.9	8.3
	Age	7.0	4.5	0.0	27.3	2.9	11.1
	Gestalt	29.2	45.5	38.6	4.5	32.4	16.7
	Recurrent VTE	64.9	54.5	89.5	90.9	61.8	19.4
	Patient Preference	43.3	22.7	57.9	36.4	52.9	27.5
	Prior VTE event on therapy	66.1	27.3	93.0	90.9	67.6	30.
	Antiphospholipid Syndrome	66.7	40.9	68.4	86.4	88.2	47.3
	Obesity (BMI>30)	53.8	40.9	57.9	63.6	52.9	50.
	Cancer	76.6	63.6	89.5	77.3	88.2	523
	Diagnoses considred for dose reduction						
	Unusual Site Thrombosis	40.4	13.6	43.9	13.6	41.2	66.
	Concurrent Antiplatelet Therapy	74.9	50.0	73.7	86.4	76.5	83.
	Distal DVT	77.2	45.5	82.5	45.5	97.1	88.
	History of bleeding	84.8	72.7	84.2	95.5	82.4	88.
	Pulmonary Embolism	71.9	4.5	96.5	4.5	88.2	100.
	Proximal DVT	76.6	9.1	100.0	9.1	100.0	100.
	Do you temporarily re-escalate						
	DOAC dose?				100.0	100.0	
	Yes Passon for to occulation	36.3	4.5	3.5	100.0	100.0	8.3
	Reason for re-escalation Post-surgery	27.5	0.0	0.0	90.9	79.4	0.0
	Hospitalization	17.5	0.0	0.0	68.2	44.1	0.0
	Hormone use	16.4	0.0	0.0	31.8	61.8	0.0
	Pregnancy or post partum	17.5	0.0	0.0	31.8	67.6	0.0
	Immobile/Sedentary	15.8	4.5	0.0	68.2	32.4	0.0
	Long travel	7.6	0.0	0.0	13.6	29.4	0.0
	Cancer	28.7	0.0	3.5	77.3	82.4	5.0
	Which DOAC do you prescribe most often?						
	Rivaroxaban	15.2	36.4	8.8	31.8	0.0	16.
	Both equally	38.0	31.8	42.1	31.8	38.2	38.
	Apixaban	46.8	31.8	49.1	36.4	61.8	44.
	Which DOAC do you dose reduce?						
	Neither	7.0	31.8	0.0	22.7	0.0	0.0
	Rivaroxaban Apixaban	4.1 7.0	13.6 4.5	1.8 7.0	13.6 13.6	0.0 5.9	0.0 5.0
	Both	81.9	50.0	91.2	50.0	94.1	94.
	Do you feel more comfortable	01.0	00.0	01.2	00.0	01.1	04.
	reducing one over another?						
	Yes	12.3	18.2	10.5	13.6	17.6	5.6
	Which are you more comfortable						
	reducing?						
	Rivaroxaban	2.3	9.1	1.8	4.5	0.0	0.0
	Apixaban Daga aniwakan 20 dailang	9.9	9.1	8.8	9.1	17.6	5.6
	Does apixaban 2x daily vs rivaroxaban 1x daily affect						
	your decision?						
	····	47.5	22.7	15.8	31.8	20.6	5.6
	Yes	17.5	22.1	10.0	01.0	20.0	

Percent of cluster responding affirmative 100 0

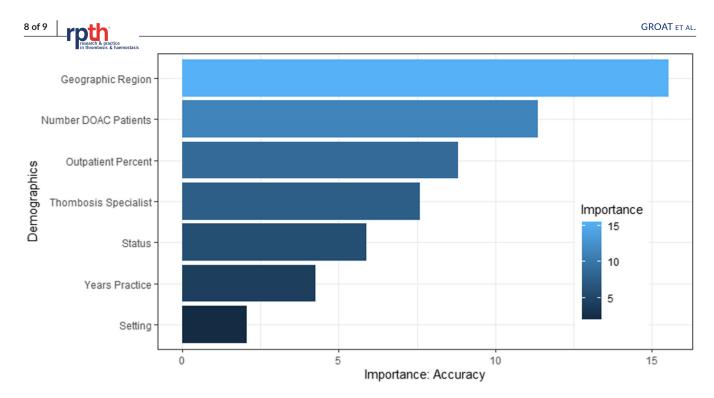
75 50 25

demographics that were characteristic of the clusters; however, the performance of the random forest model was not consistent across clusters, which hinders our ability to make any conclusions.

Strengths of our work include that to our knowledge, this is the first study of its kind to explore clinician practice patterns in the use of dose reduction of anticoagulants. Indeed, we were able to

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**FIGURE 4** Importance of demographic features in random forest model accuracy to predict DOAC dosing behavior clusters. DOAC, direct oral coagulant

identify clusters of prescribing patterns in an international audience engaged in nonmalignant hematology and anticoagulation therapy. Limitations of our work include that most respondents selfdescribed as residing in an academic setting, and work from North America, as well as selection bias of those choosing to respond to the survey. Additionally, cluster size was small. These limitations may impact the generalizability of our findings. In future work, we intend to solicit dose-reduction behaviors among other generalist and specialist physician groups.

In conclusion, we observed that the majority of respondents to the survey elect to dose reduce apixaban and rivaroxaban when prescribing extended-phase anticoagulation therapy for the prevention of recurrent VTE. Further work is necessary to better understand all potential factors that affect this decision making and to inform future work to enhance optimal application of DOAC dose reduction.

#### AUTHOR CONTRIBUTIONS

All authors had full access to all the data in the study and take responsibility for the integrity of the data and the accuracy of the data analysis. Concept, design, drafting of manuscript: SCW, DG, KAM, LBK, RPR, KMS, MG, and MEE. Manuscript critical review and refinement: SCW, DG, KAM, LBK, RPR, KMS, MG, and MEE. Statistical analysis: DG, RPR, KMS, KAM, and SCW.

#### **RELATIONSHIP DISCLOSURE**

SCW, DG, LBK, KMS, and MG report nothing to disclose. RPR discloses research funding to her institution from Janssen and BMS and serving as a consultant to Janssen, BMS, Dova, Inari, and Penumbra. KAM discloses research funding to her institution from Janssen. MEE discloses Institutional funding from SPARK/Genentec/Roche, Baxalta/Shire/Takeda, and Novo Nordisk.

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#### REFERENCES

- Kearon C, Ageno W, Cannegieter SC, et al. Categorization of patients as having provoked or unprovoked venous thromboembolism: guidance from the SSC of ISTH. J Thromb Haemost. 2016;14(7):1480-1483.
- Stevens SM, Woller SC, Kreuziger LB, et al. Antithrombotic therapy for VTE disease: second update of the CHEST guideline and Expert panel report. *Chest.* 2021;160(6):e545-e608.
- 3. Konstantinides SV, Meyer G, Becattini C, et al. 2019 ESC Guidelines for the diagnosis and management of acute pulmonary embolism developed in collaboration with the European Respiratory Society (ERS). *Eur Respir J.* 2019;54(3):1901647.
- Ortel TL, Neumann I, Ageno W, et al. American Society of Hematology 2020 guidelines for management of venous

thromboembolism: treatment of deep vein thrombosis and pulmonary embolism. *Blood Adv.* 2020;4(19):4693-4738.

- 5. Agnelli G, Buller HR, Cohen A, et al. Apixaban for extended treatment of venous thromboembolism. *N Engl J Med.* 2013;368(8):699-708.
- Schulman S, Kearon C, Kakkar AK, et al. Extended use of dabigatran, warfarin, or placebo in venous thromboembolism. N Engl J Med. 2013;368(8):709-718.
- Weitz JI, Lensing AWA, Prins MH, et al. Rivaroxaban or aspirin for extended treatment of venous thromboembolism. N Engl J Med. 2017;376(13):1211-1222.
- Vasanthamohan L, Boonyawat K, Chai-Adisaksopha C, Crowther M. Reduced-dose direct oral anticoagulants in the extended treatment of venous thromboembolism: a systematic review and metaanalysis. J Thromb Haemost. 2018;16(7):1288-1295.
- ELIQUIS package insert. 2021; https://packageinserts.bms.com/pi/ pi\_eliquis.pdf Accessed 15 December, 2020.
- XARELTO package insert. 2021; package insert. Available at: http:// www.janssenlabels.com/package-insert/product-monograph/ prescribing-information/XARELTO-pi.pdf Accessed 3 October 2019, 2019.
- Martin K, Beyer-Westendorf J, Davidson BL, Huisman MV, Sandset PM, Moll S. Use of the direct oral anticoagulants in obese patients: guidance from the SSC of the ISTH. J Thromb Haemost. 2016;14(6):1308-1313.
- Moll S, Carona DJ, Martin J. Direct oral anticoagulants in extremely obese patients: ok to use? *Res Pract Thromb Haemost*. 2019;3(2):152-155.
- Prandoni P, Lensing AW, Piccioli A, et al. Recurrent venous thromboembolism and bleeding complications during anticoagulant treatment in patients with cancer and venous thrombosis. *Blood*. 2002;100(10):3484-3488.
- Mulder FI, Horvath-Puho E, van Es N, et al. Venous thromboembolism in cancer patients: a population-based cohort study. *Blood*. 2021;137(14):1959-1969.
- 15. Zuily S, Cohen H, Isenberg D, et al. Use of direct oral anticoagulants in patients with thrombotic antiphospholipid syndrome:

Guidance from the Scientific and Standardization Committee of the International Society on Thrombosis and Haemostasis. J Thromb Haemost. 2020;18(9):2126-2137.

- Tektonidou MG, Andreoli L, Limper M, et al. EULAR recommendations for the management of antiphospholipid syndrome in adults. *Ann Rheum Dis.* 2019;78(10):1296-1304.
- Moyer GC, Bannow BS, Thornburg C, et al. Venous thromboembolism: a survey of oral anticoagulant preferences in the treatment of challenging patient populations. *Clin Appl Thromb Hemost*. 2018;24(9\_suppl):209S-216S.
- U.S. VTN. 2021; https://www.htrs.org/HTRS/Research/Endorsed-Studies/VENUS-VTE-Network Accessed 09/03/2021, 2021.
- 19. Haemostasis ISoTa. https://www.isth2021.org/ 2021.
- Society HaTR. 2021; https://www.htrs.org/ Accessed 09/03/2021, 2021.
- 21. Hartigan JA, Wong MA. A K-means clustering algorithm. J Roy Stat Soc: Ser C (Appl Stat). 1979;28(1):100-108.
- 22. Dalmaijer E, Nord C, Astle D. Statistical power for cluster analysis. *arXiv.* 2020. doi:10.48550/arXiv.2003.00381
- 23. Breiman L. Random forests. Mach Learn. 2001;45:5-32.

## SUPPORTING INFORMATION

Additional supporting information may be found in the online version of the article at the publisher's website.

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