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SUPPORT-AF: Piloting a Multi-Faceted, Electronic Medical Record-Based Intervention to Improve Prescription of Anticoagulation

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Background—Only 50% of eligible atrial fibrillation (AF) patients receive anticoagulation (AC). Feasibility and effectiveness of electronic medical record (EMR)–based interventions to profile and raise provider AC percentage is poorly understood. The SUPPORT-AF (Supporting Use of AC Through Provider Profiling of Oral AC Therapy for AF) study aims to improve rates of adherence to AC guidelines by developing and delivering supportive tools based on the EMR to providers treating patients with AF.

Methods and Results—We emailed cardiologists and community-based primary care providers affiliated with our institution reports of their AC percentage relative to peers. We also sent an electronic medical record—based message to these providers the day before an appointment with an atrial fibrillation patient who was eligible but not receiving AC. The electronic medical record message asked the provider to discuss AC with the patient if he or she deemed it appropriate. To assess feasibility, we tracked provider review of our correspondence. We also tracked the change in AC for intervention providers relative to alternate primary care providers not receiving our intervention. We identified 3786, 1054, and 566 patients cared for by 49 cardiology providers, 90 community-based primary care providers, and 88 control providers, respectively. At baseline, the percentage of AC was 71.3%, 63.5%, and 58.3% for these 3 respective groups. Intervention providers reviewed our e-mails and electronic medical record messages 45% and 96% of the time, respectively. For providers responding, patient refusal was the most common reason for patients not being on AC (21%) followed by high bleeding risk (19%). At follow-up 10 weeks later, change in AC was no different for either cardiology or community-based primary care providers relative to controls (0.2% lower and 0.01% higher, respectively).

Conclusions—Our intervention profiling AC was feasible, but not sufficient to increase AC in our population. (*J Am Heart Assoc.* 2018;7:e009946. DOI: 10.1161/JAHA.118.009946.)

Key Words: anticoagulation • atrial fibrillation • electronic medical record

A trial fibrillation (AF) currently affects 5.2 million Americans, with 12 million projected by $2050.^{1-3}$ AF accounts for 15% of all ischemic strokes and one third of all strokes in the elderly.⁴ These strokes result in permanent

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© 2018 The Authors. Published on behalf of the American Heart Association, Inc., by Wiley. This is an open access article under the terms of the Creative Commons Attribution-NonCommercial-NoDerivs License, which permits use and distribution in any medium, provided the original work is properly cited, the use is non-commercial and no modifications or adaptations are made. disability in 60% of patients and death in up to 20%.⁵ Anticoagulation (AC) therapy is the cornerstone for stroke prevention in patients with AF. However, only around half of eligible patients receive AC in contemporary US-based, ambulatory registries.⁶

Providers and patients struggle with the decision to initiate AC in new cases of AF or resume AC in patients previously on it. The American Heart Association/American College of Cardiology guidelines advise providers about stroke risk, recommending initiation of AC for eligible patients (ie, those with a stroke risk CHA₂DS₂-VASc score of 2 or higher).⁷ Providers often point to concerns about complications from AC in older, frail patients and prohibitive bleeding risks as reasons for not prescribing AC, but data show that physicians often overestimate risks of bleeding and falling and underestimate risks of stroke.⁶ Although much work has been done to educate providers about the risks of undertreatment, an "AC treatment gap" between eligible and treated AF patients persists, leading to significant morbidity and mortality.^{8,9}

From the University of Massachusetts Memorial Health Care, Worcester, MA (A.K., K.O'., R.E., A.N., D.D.M.); University of Massachusetts Medical School, Worcester, MA (A.K., J.G., S.C., J.S.S., J.M., D.D.M.); Meyers Primary Care Institute, a joint endeavor of University of Massachusetts Medical School, Reliant Medical Group, and Fallon Health, Worcester, MA (A.K., A.A., J.S.S., D.D.M.); Massachusetts General Hospital, Boston, MA (S.A.L.); Harvard Medical School, Boston, MA (S.A.L.); Northeastern University, Boston, MA (J.S.S.).

An accompanying Table S1 is available at https://www.ahajournals.org/doi/ suppl/10.1161/JAHA.118.009946

Clinical Perspective

What Is New?

 Electronic medical record-based messaging along with e-mails can be used to prompt clinicians to review their anticoagulation prescribing practices for their patients with atrial fibrillation.

What Are the Clinical Implications?

• Raising the percentage of anticoagulation use, however, may require more than electronic messaging.

Recently, the American College of Cardiology began collecting AC data from cardiovascular specialists through the PINNACLE (Practice Innovation and Clinical Excellence) registry. Initial findings from the PINNACLE registry confirm the low prescription percentage found in previous studies and help to identify undertreatment of AF as a national problem.¹⁰ Although the PINNACLE registry provides a first step toward identifying the gap in AC prescription, raising percentages will likely require more-structured interventions that will need to be integrated into individual healthcare system electronic medical record (EMR) and provider workflows. Previous work by 1 of our team members (S.L.) has determined that identifying patients with AF and their stroke risk using the EMR is feasible.¹¹ We built on that work to test whether e-mailing providers reports with the percentage of AC they prescribed relative to peers was feasible. In addition, we assessed whether sending providers EMR-based messages to notify them of an upcoming appointment with an eligible AF patient not on AC was also feasible. Finally, we assessed the effectiveness of our intervention by measuring the change in AC percentage by provider over a short time period available to us before the rollout of a new EMR. In contrast to the PINNACLE registry, we include primary care providers (in addition to cardiology providers) in our intervention in order to understand their contribution to AC decision making. Our intervention also stands in contrast to 3 recent publications¹²⁻¹⁴ that assess the impact of clinical decision support interventions, but without peer comparison.

Methods

Data, analytical methods, and study materials will not be made available to other researchers for purposes of reproducing the results or replicating the procedure.

The project was approved by the Institutional Review Board at the University of Massachusetts Medical School, and waiver of consent was obtained.

Setting

The UMass-Memorial Medical Center is the largest not-forprofit healthcare system in Central Massachusetts with 1600 physicians and 13 500 employees. Its comprehensive network of care includes a 3-campus academic medical center, 3 innetwork community hospitals, and several affiliated community hospitals. The UMass-Memorial Medical Center has a large ambulatory service footprint, with an effective catchment area of nearly 1 million individuals. This nonprofit organization offers a fully integrated healthcare continuum with a multicampus academic medical center, member and affiliated community hospitals, freestanding physician practices, and ambulatory clinics. The UMass-Memorial Medical Center used the Allscripts ambulatory EMR (Allscripts, Inc, Chicago, IL)¹⁵ during the period under study, that captures visit dates, billing codes, problem lists (diagnostic codes), and is used to either document or prescribe medication, including AC.

Population

First, we identified patients with AF based on their having an International Classification of Diseases, Tenth Revision (ICD-10) code of I48.0, I48.1, I48.2, or I48.91 coded in the ambulatory EMR. We then restricted our sample to focus on patients at high stroke risk by identifying those patients with a CHA2DS2-VASc stroke prediction score of 2 or more based on work by Lip et al.¹⁶ This threshold was defined on the basis of the fact that multiple professional societies have defined this risk score as the optimal threshold to initiate AC to prevent ischemic stroke.^{7,17} The CHA₂DS₂-VASc score assigns 1 point for congestive heart failure, hypertension, age 65 to 74, diabetes mellitus, vascular disease history like myocardial infarction, and female sex and 2 points for age 75^+ or previous stroke or transient ischemic attack. Our software calculated each patient's CHA₂DS₂-VASc score automatically using active medical problems coded within the EMR. Specifically, we used ICD-10 codes associated with outpatient clinical encounters (Table S1). Furthermore, to be included in our study, AF patients had to have at least 1 ambulatory visit in the past 12 months with either a cardiology or primary care provider from our medical group. The primary care providers in our sample included healthcare providers from across several disciplines of internal medicine, including family medicine or geriatrics, and providers from multiple training backgrounds, including nurse practitioners and medical doctors.

Provider Assignment

If an AF patient saw a cardiology provider (either nurse practitioner or medical doctor) in the past 12 months, we assigned the patient to him or her. This decision was made on

the basis of a prespecified assumption that the patient's PCP would likely defer decision making regarding AC to the treating cardiology provider. For all other AF patients with a medical provider but no cardiology visits, we assigned the patient to the primary care provider.

Determining AC Status

Every AF patient's AC status was automatically coded as "receiving AC," if the EMR indicated that they had an active prescription for warfarin/coumarin/Coumadin/or any vitamin K antagonist, enoxaparin, dalteparin, dabigatran, rivaroxaban, apixaban, or edoxaban at the time of the report. The same report was run at baseline and after 10 weeks of intervention for the intervention and control medical providers. As a way to validate our identification of AC status, we reviewed 100 charts manually and found that electronic capture of AC status was highly accurate (sensitivity 95% and specificity 100%).

Design of Report With AC Percentage

We designed a graphical report that tracks providers' change in AC use over time following the Agency for Healthcare Research and Quality's handbook for developing performance measurement tools.¹⁸ More specifically, we used Tableau visual analytic software¹⁹ to create reports based on live data in the Allscripts EMR to profile AC prescription practices for each provider included in our intervention group (Figure 1A). The content of the report was based on the number of AF patients at high risk for stroke seen within the past 12 months by the healthcare provider (≤ 10 versus > 10). For providers with more than 10 AF patients eligible for AC, in the upper half of our profile page, we displayed a bar graph showing the percentage and number of eligible AF patients currently receiving AC over the total number of AF patients eligible for AC. We provided the report in this fashion to any provider seeing more than 10 eligible patients. We superimposed 2 lines representing benchmarks on the bar graph to enhance impact and help providers assess their prescription rate. The first line showed the percentage of AC prescription for eligible AF patients among "peers," using the average AC use among eligible AF patients treated by cardiology or primary care providers for cardiology and primary care providers, respectively. We also included a second line at 80%, a target suggested by certain groups as a practice-level AC prescription goal.²⁰ For providers with 1 to 10 eligible patients, we felt graphing performance would not be as meaningful, and so we reported the percentage of AF patients the provider had treated in the past 12 months without providing a bar graph or peer comparison (Figure 1B). In the lower half of the report, we included the medical record numbers and stroke risk predictors for all AF patients eligible but not currently receiving AC. We also included a list of ACeligible AF patients with appointments in the next 31 days to focus providers on an actionable group of patients with whom they might review the use of AC.

Design of EMR Message

We sent EMR messages from a user account created for our study team to individual providers 1 day before any scheduled appointment with an AC-eligible AF patient (Figure 2). The EMR message was linked to the AF patient's medical record, facilitating review of patient charts by providers as well as providing a format for providers to communicate back with our team.

Intervention Groups

Based on strong support for our work within UMass-Memorial Medical Center cardiovascular medicine and communitybased primary care leadership, we targeted providers from these 2 groups to receive our AC intervention. As a first step, the chiefs of the 2 intervention cohorts distributed an e-mail notifying their respective providers about our project and impending distribution of reports by our group. One week later, in July 2017, we sent e-mails with the report, first to cardiology providers, and then 2 weeks later to the community-based primary care group. Subsequently, we sent 2 follow-up e-mails at 2-week intervals from the initial mailing. These were identical to the first e-mail in structure, but included reports with updated AC information.

Because our institution moved to a new EMR in October 2017, we stopped sending AC-related practice profile reports and EMR messages in September 2017. Cardiology providers received the intervention over a 10-week period and community-based primary care over 8 weeks. This time period (July 1, 2017 to September 30, 2017) also served as our follow-up period for the purpose of all our analyses.

Control Group

We did not deliver our intervention to an alternate group of providers based at our university campus. The percentage of AC use prescribed by these alternate providers served as controls (reference) to the patients cared for by our intervention providers in order to adjust for temporal trends in AC use. The control group included patients seen by primary care providers from the disciplines of general medicine, family medicine, or geriatrics. Because we initiated the intervention at different time points for cardiology versus communitybased primary care providers, the controls paired with each intervention group differed slightly in order to conform to

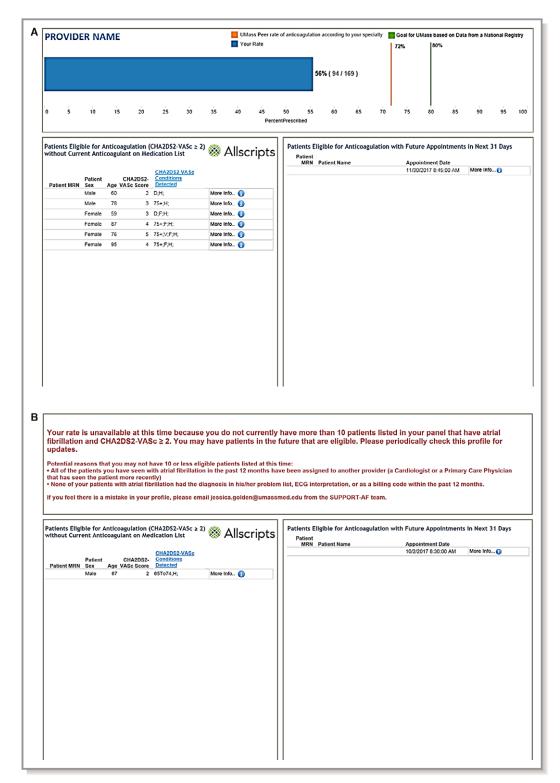


Figure 1. Example of report sent to providers caring for AC-eligible AF patients with CHA_2DS_2 -VASc ≥ 2 . A, Sample report for providers with more than 10 eligible patients. MRN indicates medical record number; UMass, University of Massachusetts. B, Sample report for providers with 10 or fewer eligible patients. AC indicates anticoagulation; AF, atrial fibrillation; MRN, medical record number. CHA_2DS_2 -VASc conditions key: C: Congestive Heart Failure, H: Hypertension, 75+: Age \geq 75, D: Diabetes Mellitus, S: Stroke or Transient Ischemic Attack, V: Vascular Disease, 65 to 74: Age 65 to 74, F: Female.

TASK CREATED Sent on behalf of Drs. David McManus and Alok Kapoor	
This is a note that you have an appointment tomorrow with an atr not receiving anticoagulation, but may be eligible based on his/he consider reevaluating the risks and benefits of anticoagulation in t treatment options.	r CHA ₂ DS ₂ -VASc score. Please
Patient: CHA₂DS₂-VASc: 3 Appointment: 8/11 at 10:00AM	
If you would like to provide feedback on your decision-making propatient, or if you would like more information on how we determine fibrillation and anticoagulation status, please email experimentation directly to this message.	
Sincerely, Drs. McManus, Kapoor, and the SUPPORT AF Team	

Figure 2. Screenshot of EMR message sent to providers 1 day before an appointment with an AC-eligible AF patient. AC indicates anticoagulation; AF, atrial fibrillation; EMR, electronic medical record.

inclusion criterion which required that each patient saw his or her assigned provider within the past 12 months. Thereby, the inception date for controls to the community-based primary care providers lagged by 2 weeks compared with the inception date for controls to the cardiology providers.

Outcomes

To assess feasibility of the intervention, we tabulated how often providers in the intervention groups read our e-mails with report of their AC percentage using Microsoft Outlook– based read receipts. We also tracked how many providers reviewed the EMR message items we sent them. Specifically, if the provider replied to the EMR message or marked the EMR message as complete, in progress, or removed, we assumed that the EMR message had been reviewed. If the provider did not reply and the EMR message remained "active" in the provider's inbox, we counted the EMR message as not reviewed. Finally, we also tallied and thematically coded providers' reasons for not prescribing AC from responses to our provider EMR messages.

To measure the effectiveness of our intervention on AC use, we calculated the change in percentage of eligible patients on AC for intervention and control groups.

Statistical Analysis

For our primary analyses, we only included patients with no change in provider and who met the 12-month eligibility criterion at baseline as well as at the end of the follow-up period. Patients' follow-up (postintervention) anticoagulation status was modeled as a function of patients' baseline (preintervention) anticoagulation status, provider's intervention/control status, and CHA2DS2-VASc score. We hypothesized that the change in AC percentage would be higher in patients of intervention providers compared with those of control providers. To account for within-provider clustering, we used generalized estimation equation logistic regression.²¹ In these analyses, patient AC status was modeled using generalized estimation equation logistic regression as a function of time period (baseline/follow-up), provider's intervention or control status, and their interaction, again adjusting for CHA₂DS₂-VASc score. We hypothesized a statistically significant interaction, such that the follow-up versus baseline difference in AC prescription percentage would be larger for patients treated by intervention providers than for those treated by control providers. To examine whether any intervention-control difference varied by provider type, these analyses were conducted separately for cardiology (intervention) versus control providers and for community-based primary care providers (intervention) versus control providers. In both analyses, control providers were the same; the set of control patients included varied slightly for the 2 analyses because the 12-month inclusion criterion was applied 2 weeks earlier for analyses including cardiology providers than for analyses including community-based primary care providers.

In a sensitivity analysis, we included patients with a change in provider or who met the 12-month inclusion criterion only at baseline or only at follow-up (ie, the patient only contributed to a provider's percentage at baseline or followup but not both). These analyses again were conducted separately for cardiology providers versus controls and for

Table 1. Comparison of Key Characteristics Recorded at Beginning of Intervention for Patients From 3 Provider Groups

	Cardiology Providers	Community-Based Primary Care Providers	Controls*
Characteristic	Frequency (% Out of 3786 Total)	Frequency (% Out of 1054 Total)	Frequency (% Out of 566 Total
Age, y			
75+	2105 (55.6)	666 (63.2)	327 (57.8)
65 to 74	1262 (33.3)	312 (29.6)	161 (28.5)
<65	418 (11.0)	76 (7.2)	78 (13.8)
Female sex	1672 (44.2)	490 (46.5)	281 (50.0)
Median area-level annual income			•
≤100% poverty level	0 (0.0)	0 (0.0)	2 (0.4)
100% to 400% poverty level	2446 (65.0)	698 (66.4)	337 (60.8)
Nonwhite race	243 (6.4)	47 (4.5)	36 (6.4)
Hispanic ethnicity	78 (2.1)	16 (1.5)	17 (3.0)
Non-English-language preference	231 (6.1)	23 (2.2)	21 (3.7)
Insurance			•
Commercial	430 (11.4)	104 (9.9)	69 (12.2)
Medicare	3113 (82.2)	909 (86.2)	457 (80.7)
Medicaid	97 (2.6)	21 (2.0)	22 (3.9)
Other/MA state health insurance exchange	109 (2.9)	20 (1.9)	16 (2.8)
Uninsured/self-pay	37 (1.0)	0 (0.0)	2 (0.4)
Individual CHA ₂ DS ₂ -VASc comorbidities			
CHF	1066 (28.2)	202 (19.2)	99 (17.5)
Hypertension	3046 (80.5)	870 (82.5)	442 (78.1)
Diabetes mellitus	972 (25.7)	310 (29.4)	182 (32.2)
Stroke/TIA	367 (9.7)	98 (9.3)	58 (10.3)
Vascular disease	1366 (36.1)	295 (28.0)	123 (21.7)
CHA ₂ DS ₂ -VASc score	·		•
2	741 (19.6)	200 (19.0)	127 (22.4)
3	953 (25.2)	248 (23.5)	158 (27.9)
4	1036 (27.4)	310 (29.4)	146 (25.8)
5	643 (17.0)	185 (17.6)	85 (15.0)
6	294 (7.8)	85 (8.1)	33 (5.8)
7	93 (2.5)	20 (1.9)	13 (2.3)
8	21 (0.6)	6 (0.6)	4 (0.7)
9	5 (0.1)	0 (0.0)	0 (0.0)
Anticoagulant use	-		-
Warfarin	1879 (49.6)	432 (41.0)	224 (39.6)
Direct oral anticoagulant	836 (22.1)	242 (23.0)	109 (19.3)
None	1071 (28.3)	380 (36.1)	233 (41.2)
Timing of visit with provider [†]		•	
Early	407 (10.8)	144 (13.7)	95 (16.8)
Middle	423 (11.2)	163 (15.5)	85 (15.0)
Late	404 (10.7)	163 (15.5)	68 (12.0)
None	2552 (67.4)	584 (55.4)	318 (56.2)

Continued

Table 1. Continued

	Cardiology Providers	Community-Based Primary Care Providers	Controls*
Characteristic	Frequency (% Out of 3786 Total)	Frequency (% Out of 1054 Total)	Frequency (% Out of 566 Total)
Anticoagulation-eligible panel size of patient's pro	vider		
1 to 10	51 (1.3)	249 (23.6)	230 (40.6)
11 to 50	558 (14.7)	689 (65.4)	336 (59.4)
51 to 100	643 (17.0)	116 (11.0)	0 (0.0)
>100	2534 (66.9)	0 (0.0)	0 (0.0)

CHF indicates congestive heart failure; TIA, transient ischemic attack.

*In the table, we report only the frequencies for patients serving as controls for community-based primary care providers. Controls for cardiology providers were mostly the same patients, but because we rolled out the intervention 2 weeks earlier for cardiology providers, frequencies shifted slightly from 562 to 566 patients based on the requirement to have last appointment within 12 months.

⁺Early visit occurred between days 0 and 32 for cardiology and 0 and 29 for community-based primary care providers and controls; middle occurred between days 32 and 57 for cardiology and 29 and 49 for community-based primary care providers and controls; finally, late visits occurred between days 57 and 79 for cardiology and 49 and 65 for community-based primary care providers and controls.

community-based primary care providers versus controls. Finally, we re-examined the effect of our intervention in several subsets. These included examining the effect in the subset of patients who saw their assigned provider during the intervention period, the subset of patients assigned to providers who read varying numbers of our e-mails containing the report with AC prescription percentage, the subset of patients assigned to a provider who replied to multiple EMR messages we sent, and the subset of patients with CHA₂DS₂-VASc score of 2 or 3 and CHA₂DS₂-VASc score 4 or 5 (versus CHA₂DS₂-VASc score 6+).

We performed all analyses in SAS software (version 9.4; SAS Institute Inc, Cary, NC).²²

Results

In July 2017 at study onset, we identified 3786 patients with AF receiving care from cardiology providers and 562 treated by controls. Two weeks later, at the time of study onset for community-based primary care providers, we identified 1054 AF patients cared for by participating community-based primary care providers as well as 566 treated by controls. The number of AF patients with CHA₂DS₂-VASc score of 2, 3, 4, and 5+ was relatively evenly distributed across provider groups (Table 1). Providers receiving our intervention cared for AF patients with slightly higher CHA2DS2-VASc scores. The proportion of AF patients treated with AC varied across provider types, with cardiologists more frequently prescribing AC for their eligible patients than primary care physicians in both intervention and control groups. Cardiologists also saw a considerably higher volume of AC-eligible AF patients, with nearly 70% of providers seeing over 100 such patients, in contrast to 0% among primary care providers in both intervention and control groups (Table 1). Race and sex did not vary significantly across the provider groups. However, primary care providers receiving the AC intervention did, on average, see a higher proportion of patients over the age of 75 years.

We also compared patients receiving AC and those not receiving AC for the same baseline characteristics. Patients were comparable in age, income, race, and insurance. There were more patients with CHA_2DS_2 -VASc score ≥ 2 in the group receiving AC. Patients off AC were more than twice as likely to be under the care of a provider whose AC-eligible panel size was 1 to 10 (Table 2).

In terms of feasibility of the e-mail component of our intervention, we found that most patients received care from a provider who read at least 1 of our e-mails. More specifically, among patients receiving care from cardiology providers, 676 (17.9%) received care from providers who read 1 e-mail and 1391 (36.7%) received care from providers who read more than 1 of our e-mails. We observed similar trends among patients receiving care from community-based primary care providers (Table 3).

In terms of feasibility of the EMR message component of our intervention, we found that providers reviewed our EMR messages 96% of the time. We sent a total of 432 EMR messages to 88 providers (31 cardiology providers and 57 community-based primary care providers) for upcoming appointments with 362 unique patients over the course of the intervention. Out of these 432 messages, we received 163 responses (or 37.5% response rate) from 64 unique providers (19 cardiology and 45 community based). The 64 providers who responded to our EMR-based messages cared for 51.7% of all eligible AF patients not on AC. Overall, 77.3% of the responses included reasons for not anticoagulating these patients (Table 4). Of the 163 responses, healthcare providers cited AF patient refusal to start/resume AC as the most

Table 2. Comparison of Key Characteristics Recorded atBeginning of Intervention for Patients on AC vs Patients Noton AC

	On AC	Off AC
Characteristic	Frequency (% Out of 3740 Total)	Frequency (% Out of 1666 Total)
Age, y		
75+	2131 (57.0)	967 (58.0)
65 to 74	1228 (32.8)	507 (30.4)
<65	381 (10.2)	192 (11.5)
Female sex	1636 (43.7)	807 (48.4)
Median area-level annual income	9	
\leq 100% poverty level	1 (0.0)	1 (0.1)
100% to 400% poverty level	2412 (64.9)	1069 (64.6)
Nonwhite race	236 (6.3)	90 (5.4)
Hispanic ethnicity	82 (2.2)	29 (1.7)
Non-English-language preference	208 (5.6)	67 (4.0)
Insurance		
Commercial	399 (10.7)	204 (12.2)
Medicare	3110 (83.2)	1369 (82.2)
Medicaid	96 (2.6)	44 (2.6)
Other/MA state health insurance exchange	107 (2.9)	38 (2.3)
Uninsured/self-pay	28 (0.7)	11 (0.7)
Individual CHA2DS2-VASc comort	pidities	
CHF	1017 (27.2)	350 (21.0)
Hypertension	3040 (81.3)	1318 (79.1)
Diabetes mellitus	1058 (28.3)	406 (24.4)
Stroke/TIA	431 (11.5)	92 (5.5)
Vascular disease	1251 (33.4)	533 (32.0)
CHA ₂ DS ₂ -VASc score		
2	668 (17.9)	400 (24.0)
3	939 (25.1)	420 (25.2)
4	1058 (28.3)	434 (26.1)
5	638 (17.1)	275 (16.5)
6	311 (8.3)	101 (6.1)
7	99 (2.6)	27 (1.6)
8	23 (0.6)	8 (0.5)
9	4 (0.1)	1 (0.1)
Anticoagulant use		
Warfarin	2535 (67.8)	N/A
Direct oral anticoagulant	1187 (37.7)	N/A
Other	18 (0.5)	N/A

Continued

	On AC	Off AC
Characteristic	Frequency (% Out of 3740 Total)	Frequency (% Out of 1666 Total)
None	N/A	1666 (100.0)
Timing of visit with provider*		
Early	476 (12.7)	170 (10.2)
Middle	496 (13.3)	175 (10.5)
Late	497 (13.3)	138 (8.3)
None	2271 (60.7)	1183 (71.0)
AC-eligible panel size of patient'	s provider	
1 to 10	526 (14.1)	524 (31.5)
11 to 50	1146 (30.6)	581 (34.9)
51 to 100	394 (10.5)	338 (20.3)
>100	1674 (44.8)	223 (13.4)

AC indicates anticoagulation; AF, atrial fibrillation; CHF, congestive heart failure; N/A, not applicable; TIA, transient ischemic attack.

*Early visit occurred between days 0 and 32 for cardiology and 0 and 29 for communitybased primary care providers and controls; middle occurred between days 32 and 57 for cardiology and 29 and 49 for community-based primary care providers and controls; finally, late visits occurred between days 57 and 79 for cardiology and 49 and 65 for community-based primary care providers and controls.

common reason for a patient not being on AC (21%), followed by the provider's perception that the patient was at a prohibitively high risk for bleeding (19%) and deferral to primary cardiologist or other physician (15%). Cardiologists and community-based primary care providers both noted that patients refused AC because they were worried about bleeding risks or other adverse events, or knew someone who died from complications of AC. Patient history of gastric bleeding, nose bleeding, intracerebral bleeding, rectal bleeding, hematuria, and anemia were among the reasons providers cited as explanations for withholding AC. Of the 111 community-based primary care providers' responses to the EMR messages, 24.3% deferred to a cardiology specialist. These responses referred to notes in which the patient's cardiologist deemed AC was unnecessary or inappropriate, requested our research group to contact the patient's cardiologist instead, or informed us that the patient would discuss treatment options with his or her cardiologist at a future appointment.

At baseline, patients receiving care from cardiology providers received AC at the highest percentage (71.3%) followed by community-based primary care providers (63.5%) followed by control providers (58.3%). At follow-up, there was only a small change in the crude percentage of AC prescription across all groups. Based on generalized estimation equation logistic regression modeling, the adjusted change in difference was not significant for either intervention group and was virtually unchanged from the unadjusted analysis.

Table 3. Frequency of Patients Receiving Care	by Providers Reading Variable Number of E-mails
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Provider Group	No E-mail Read (%)	One E-mail Read (%)	More Than 1 E-mail Read (%)	Total
Cardiology	1719 (45.4)	676 (17.9)	1391 (36.7)	3786
Community-based primary care providers	449 (42.6)	204 (19.4)	401 (38.0)	1054

More specifically, the difference between cardiology and control group in adjusted AC percentage was 12.4% at baseline and 12.3% at follow-up, a change in difference of -0.2% (*P*=0.91). The intracluster coefficient for this analysis was 0.014. The difference between community-based primary care providers and controls was 5.1% at baseline and 5.1% at the time of follow-up for a change in difference of 0.01% (*P*=0.98). The intracluster coefficient for this analysis was 0.032 (Table 5).

Table 4. Distribution of Primary Reasons for Not Prescribing AC Among Providers Responding to EMR Messages Sent as Part of Prescriber Profiling Intervention $(N=126^*)$

Reason*	Overall Frequency (%) N=102	Cardiology N=38	Community-Based Primary Care N=64
No AF	5 (4.9)	1 (2.6)	4 (6.3)
Allergy with no alternative	1 (1.0)	0 (0)	1 (1.6)
Hospice	2 (2.0)	0 (0)	2 (3.1)
Watchman/closure of appendage	3 (2.9)	3 (7.9)	0 (0)
Active bleeding	1 (1.0)	0 (0)	1 (1.6)
Intralobar hemorrhage [†]	1 (1.0)	1 (2.6)	0 (0)
Other intracranial hemorrhage	3 (2.9)	0 (0)	3 (4.7)
Patient not a good candidate [‡]	2 (2.0)	0 (0)	2 (3.1)
Transient condition	17 (16.7)	6 (15.8)	11 (17.2)
Nonintracranial site of bleeding	23 (22.5)	9 (23.7)	14 (21.9)
Patient already on dual antiplatelet agent; risk too high	1 (1.0)	1 (2.6)	0 (0)
Fall risk	8 (7.8)	2 (5.3)	6 (9.4)
Patient postablation	5 (4.9)	2 (5.3)	3 (4.7)
On aspirin	5 (4.9)	0 (0)	5 (7.8)
Patient refusal	25 (24.5)	13 (34.2)	12 (18.8)

AC indicates anticoagulation; AF, atrial fibrillation; EMR, electronic medical record. *We received 163 responses to our EMR messages, out of which 126 included reasons for not prescribing AC.

¹Hemorrhage into frontal, parietal, occipital, or temporal lobes; distinctive from deep brain hematoma involving midbrain, also subarachnoid hemorrhage.

[†]Patient nonadherent, has intellectual disability or poor cognitive status and no one to supervise medication, poor AC control, or poor experience with warfarin in the past.

In the sensitivity analysis in which we included patients with a change in provider (ie, who met the 12-month inclusion criterion only at baseline or only at follow-up), there was similarly no significant change in AC percentage for intervention groups relative to controls. More specifically, relative to control providers, the change in AC percentage was 0.2% higher for cardiology providers (P=0.82) and 0.8% lower for community-based primary care providers (P=0.61).

Finally, there was no significant effect of our intervention in the various subsets that we examined. Specifically, compared with the -0.2% change in difference in adjusted AC percentage from the main analysis of cardiology providers and 0.01% in community-based primary care providers, in the subset of patients seeing their assigned provider over the course of follow-up, the change in difference value was 0.6% for patients of cardiology providers and -0.06 for patients of communitybased primary care providers. Furthermore, there was no significant effect in the cohort of patients seeing their provider in the first 28 to 32 days of follow-up-change in difference value of -0.8% for cardiology providers and -0.2% for the community-based primary care providers. The change in difference value was -1.0% in the patients cared for by the subset of cardiology providers not reading any of our e-mails to 0.9% for patients cared for by a provider who read more than 1 of our e-mails. The same values in patients of community-based primary care providers were 0.4% to -0.3%. The change in difference in adjusted AC percentage was 0.55% for the subset of patients with a cardiology provider who replied to multiple EMR messages (as opposed to a single message or no message). This value was -0.06% for the subset of community-based primary care providers who replied to multiple EMR messages compared with controls. Finally, the range for change in difference in adjusted AC percentage was -0.6% for patients of cardiology providers with CHA_2DS_2 -VASc of 2 or 3 and -0.7 for patients of cardiology providers with CHA2DS2-VASc of 6 or more. These values were -0.1% to 0.3% for patients of community-based primary care providers with CHA2DS2-VASc 2 or 3 and 6 or more, respectively.

Discussion

We demonstrated that it is feasible to generate and distribute reports of AC prescription percentages and EMR-based AC

	At Baseline (Preintervention)		At Follow-up (Postinterv	Change in the	
Provider Group	Adjusted Percentage on Anticoagulation	Difference in Adjusted Percentage on Anticoagulation From Controls	Adjusted Percentage on Anticoagulation	Difference in Adjusted Percentage on Anticoagulation From Controls	Difference at Follow-up vs Baseline %
Cardiology (n=3786)	71.3	12.4	71.5	12.3	-0.2 (<i>P</i> =0.91)
Community (n=1054)	63.5	5.1	63.7	5.1	0.01 (<i>P</i> =0.98)
Controls (n=566)*	58.9	Reference	59.2	Reference	Reference

Table 5. Comparison of Change in the Difference in Adjusted Percentage on Anticoagulation for Patients Cared for by Cardiology and Community-Based Primary Care Providers Versus Controls

*In the table, we report only the frequencies for patients serving as controls for community-based primary care providers. Controls for cardiology providers were mostly the same patients, but because we rolled out the intervention 2 weeks earlier for cardiology providers, frequencies shifted slightly from 562 to 566 patients based on the requirement to have last appointment within 12 months.

messages to primary care and cardiology providers responsible for treating AF patients within our health system. Involvement of our health system's informatics and leadership teams was essential to our ability to generate automated processes for AF patient identification and stroke risk profiling. Providers were most likely to review and respond to EMR messages as compared with e-mails. Patient refusal, high bleeding risk, and deference to a cardiology specialist were the most common reasons provided by providers for not treating their AF patients with AC. We did not detect an increase in AC use among intervention providers relative to controls.

Several other provider-directed intervention studies have addressed AC prescription among AF patients. Three recent trials¹²⁻¹⁴ found mixed results for clinical decision support, although the trial¹² which obligated intervention providers to explain why his or her patient was not on AC achieved a 1.6% increase in rate of AC use compared with control providers. In 1 cluster-randomized, multisite trial conducted in the United States,²³ there was no added benefit of site visits and direct engagement with providers compared with the distribution of paper-based reports of AC prescription percentages. Of note, the study follow-up for that trial was 2 years, much longer than the 8 to 10 weeks available to us for follow-up. In another UK-based cluster trial^{24,25} looking at direct engagement with educational meetings and visits there was a 10% increase in the proportion of patients with guidelineconcordant AC and aspirin use among those with AF, although like our study, the result was not statistically significant. More recently, investigators conducting the IMPACT-AF (Integrated Management Program Advancing Community Treatment of Atrial Fibrillation) cluster-randomized, multinational study²⁵ found that education of patients and providers in 5 middle-income countries with regular monitoring and feedback increased AC use among intervention patients by 9.1% more than controls. Individual countries were able to customize the educational content and mode of delivery, including use of digital and social media. Our intervention leveraged tools available through the EMR and external software that were not available to, or used by, the previous investigative groups. By contrast, we did not directly engage providers (ie we did not meet with them in person), which had mixed results in the studies cited above. Responses to EMR messages we sent suggest that providers could benefit from discussion with trusted advisors regarding controversial areas and important topics, including shared decision-making practices, issues of frailty and fall risk in relation to AC benefit, initiation of AC for AF that developed during a transient illness or surgery, and safe practices around AC resumption after a bleeding event. Increasing AC use may therefore require a combination of technology-based approaches and direct engagement with providers. Finally, we did not directly interact with AF patients. Given the success of IMPACT-AF, which interacted directly with patients, and our own findings that a number of providers indicated patient refusal as a reason for not starting/ resuming AC, other researchers developing interventions in this area may decide to include a component of direct interaction with patients.

ORIGINAL RESEARCH

Understanding the lack of impact of our findings can benefit from discussion of strategies suggested by experts in a published article for improving effectiveness when delivering practice-based feedback.²⁶ As recommended by the authors of this article, we obtained endorsement of clinical chiefs supervising providers whose practice we profiled. At the same time, we did not widely solicit feedback from individual providers about the priority of our intervention relative to other quality improvement efforts/other priorities. We provided multiple instances of feedback including 3 e-mails and separately EMR messages on each occurrence of a patient not on AC visiting his or her provider. We also provided feedback both quantitatively and visually. As mentioned above, we did not directly engage providers, which likely limited our impact.

There are other limitations to the findings we report. We had a short follow-up period (8-10 weeks), and it is possible that if we had longer to follow AC prescribing, we would have had seen a larger impact. Approximately 40% of patients saw their assigned provider over the duration of the study. We anticipate that with 6 months of follow-up, nearly every patient would have seen his provider given typical follow-up for a patient with AF on AC. The considerably higher average AC rates among cardiology and community-based intervention providers at baseline compared with control providers also limited our ability to detect a significant change in AC prescription. Perhaps, targeting providers with lower AC use would have enabled us to observe a more-substantial increase in AC rates with our intervention. Unfortunately, our health system's transition to another EMR system limited our ability to identify AF patients, profile their stroke risk, and deliver scripted messages in an uninterrupted fashion. To address this limitation, we looked at a subset of patients who were seen over the course of the intervention and compared the effect with that of the entire sample (most of whom were not seen during the course of the intervention). The subset analysis, however, did not suggest a more-positive effect. Other limitations include potential for residual confounding from the older age seen in communitybased primary care providers and also from the lower rate of AC use at baseline in the control population. Our inability to identify the discrete effectiveness of each component of the intervention and absence of information about bleed or fall risk in our AC profiling process are other limitations. The subset analysis mentioned above does provide important information about the effectiveness of the EMR messages sent before office visits with AF patients, but it is difficult to disentangle EMR message effects from the e-mails with reports of AC prescription percentages. We also did not provide clinicians receiving reports with information about bleeding or fall risk/history for their patients. We plan to provide this in our future work.

In summary, we confirmed the feasibility of profiling AC prescription practices for AF patients among ambulatory healthcare providers using a common EMR. Although we did not find a significant effect for our 2-component intervention, responses from providers, our process evaluation, and our analysis methodology allow us and others to determine the comparative effectiveness of future interventions focused on improving AC prescription practice. Based on our findings, we suspect that profiling and EMR messaging alone is not sufficient to overcome the AC prescription gap among eligible AF patients. Future work should examine the role of direct engagement with providers, focusing on the reasons for not prescribing AC that providers reported to us in the current work.

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SUPPLEMENTAL MATERIAL

Table S1. ICD-10 Diagnosis Codes for Atrial Fibrillation and CHA₂DS₂-VASc

Flediciors.		
CHA ₂ DS ₂ -VASc Predictors	ICD-10 Code in Allscripts	ICD-10 Code Name
Atrial Fibrillation	148.0	Paroxysmal atrial fibrillation
Amaribiniation	I48.1	Persistent atrial fibrillation
	148.2	Chronic atrial fibrillation
	I48.91	Unspecified atrial fibrillation
Congestive Heart Failure	150.1	Left ventricular failure, unspecified
	150.9	Heart failure, unspecified
Hypertension	I10	Essential (primary) hypertension
	l11.0	Hypertensive Heart Disease With Heart Failure
	111.9	Hypertensive Heart Disease Without Heart Failure
	112.0	Hypertensive Chronic Kidney Disease With Stage 5 Chronic Kidney Disease Or End Stage Renal Disease
	112.9	Hypertensive Chronic Kidney Disease With Stage 1 Through Stage 4 Chronic Kidney Disease, Or Unspecified Chronic Kidney Disease
	113.0	Hypertensive Heart And Chronic Kidney Disease With Heart Failure And Stage 1 Through Stage 4 Chronic Kidney Disease, Or Unspecified Chronic Kidney Disease
	113.10	Hypertensive Heart And Chronic Kidney Disease Without Heart Failure, With Stage 1 Through Stage 4 Chronic Kidney Disease, Or Unspecified Chronic Kidney Disease
	113.11	Hypertensive Heart And Chronic Kidney Disease Without Heart Failure, With Stage 5 Chronic Kidney Disease, Or End Stage Renal Disease
	113.2	Hypertensive Heart And Chronic Kidney Disease With Heart Failure And With Stage 5 Chronic Kidney Disease, Or End Stage Renal Disease
	115.0	Renovascular Hypertension
	115.1	Hypertension Secondary To Other Renal Disorders
	115.2	Hypertension Secondary To Endocrine Disorders
	115.8	Other Secondary Hypertension
	115.9	Secondary Hypertension, Unspecified
Diabetes	E10.10	Type 1 Diabetes Mellitus With Ketoacidosis Without Coma

Predictors.

E10.11	Type 1 Diabetes Mellitus With Ketoacidosis With Coma
E10.21	Type 1 Diabetes Mellitus With Diabetic Nephropathy
E10.22	Type 1 Diabetes Mellitus With Diabetic Chronic Kidney Disease
E10.29	Type 1 Diabetes Mellitus With Other Diabetic Kidney Complication
E10.31x	Type 1 Diabetes Mellitus With Unspecified Diabetic Retinopathy
E10.32x	Type 1 Diabetes Mellitus With Mild Nonproliferative Diabetic Retinopathy
E10.33x	Type 1 Diabetes Mellitus With Moderate Nonproliferative Diabetic Retinopathy
E10.34x	Type 1 Diabetes Mellitus With Severe Nonproliferative Diabetic Retinopathy
E10.35x	Type 1 Diabetes Mellitus With Proliferative Diabetic Retinopathy
E10.36	Type 1 Diabetes Mellitus With Diabetic Cataract
E10.37Xx	Type 1 Diabetes Mellitus With Diabetic Macular Edema, Resolved Following Treatment
E10.39	Type 1 Diabetes Mellitus With Other Diabetic Ophthalmic Complication
E10.40	Type 1 Diabetes Mellitus With Diabetic Neuropathy, Unspecified
E10.41	Type 1 Diabetes Mellitus With Diabetic Mononeuropathy
E10.42	Type 1 Diabetes Mellitus With Diabetic Polyneuropathy
E10.43	Type 1 Diabetes Mellitus With Diabetic Autonomic (Poly)Neuropathy
E10.44	Type 1 Diabetes Mellitus With Diabetic Amyotrophy
E10.49	Type 1 Diabetes Mellitus With Other Diabetic Neurological Complication
E10.51	Type 1 Diabetes Mellitus With Diabetic Peripheral Angiopathy Without Gangrene
E10.52	Type 1 Diabetes Mellitus With Diabetic Peripheral Angiopathy With Gangrene
E10.59	Type 1 Diabetes Mellitus With Other Circulatory Complications
E10.610	Type 1 Diabetes Mellitus With Diabetic Neuropathic Arthropathy
E10.618	Type 1 Diabetes Mellitus With Other Diabetic Arthropathy
E10.620	Type 1 Diabetes Mellitus With Diabetic Dermatitis
E10.621	Type 1 Diabetes Mellitus With Foot Ulcer
E10.622	Type 1 Diabetes Mellitus With Other Skin Ulcer
E10.628	Type 1 Diabetes Mellitus With Other Skin Complications

E10.630	Type 1 Diabetes Mellitus With Periodontal Disease
E10.638	Type 1 Diabetes Mellitus With Other Oral Complications
E10.641	Type 1 Diabetes Mellitus With Hypoglycemia With Coma
E10.649	Type 1 Diabetes Mellitus With Hypoglycemia Without Coma
E10.65	Type 1 Diabetes Mellitus With Hyperglycemia
E10.69	Type 1 Diabetes Mellitus With Other Specified Complication
E10.8	Type 1 Diabetes Mellitus With Unspecified Complications
E10.9	Type 1 Diabetes Mellitus Without Complications
E11.00	Type 2 Diabetes Mellitus With Hyperosmolarity Without Nonketotic Hyperglycemic-Hyperosmolar Coma (Nkhhc)
E11.01	Type 2 Diabetes Mellitus With Hyperosmolarity With Coma
E11.21	Type 2 Diabetes Mellitus With Diabetic Nephropathy
E11.22	Type 2 Diabetes Mellitus With Diabetic Chronic Kidney Disease
E11.29	Type 2 Diabetes Mellitus With Other Diabetic Kidney Complication
E11.31x	Type 2 Diabetes Mellitus With Unspecified Diabetic Retinopathy
E11.32x	Type 2 Diabetes Mellitus With Mild Nonproliferative Diabetic Retinopathy
E11.33x	Type 2 Diabetes Mellitus With Moderate Nonproliferative Diabetic Retinopathy
E11.34x	Type 2 Diabetes Mellitus With Severe Nonproliferative Diabetic Retinopathy
E11.35x	Type 2 Diabetes Mellitus With Proliferative Diabetic Retinopathy
E11.36	Type 2 Diabetes Mellitus With Diabetic Cataract
E11.37Xx	Type 2 Diabetes Mellitus With Diabetic Macular Edema, Resolved Following Treatment
E11.39	Type 2 Diabetes Mellitus With Other Diabetic Ophthalmic Complication
E11.40	Type 2 Diabetes Mellitus With Diabetic Neuropathy, Unspecified
E11.41	Type 2 Diabetes Mellitus With Diabetic Mononeuropathy
E11.42	Type 2 Diabetes Mellitus With Diabetic Polyneuropathy
E11.43	Type 2 Diabetes Mellitus With Diabetic Autonomic (Poly)Neuropathy
E11.44	Type 2 Diabetes Mellitus With Diabetic Amyotrophy
E11.49	Type 2 Diabetes Mellitus With Other Diabetic

		Neurological Complication
	E11.51	Type 2 Diabetes Mellitus With Diabetic Peripheral
		Angiopathy Without Gangrene
	E11.52	Type 2 Diabetes Mellitus With Diabetic Peripheral
		Angiopathy With Gangrene
	E11.59	Type 2 Diabetes Mellitus With Other Circulatory
	E11.610	Complications Type 2 Diabetes Mellitus With Diabetic Neuropathic
	E11.010	Arthropathy
	E11.618	Type 2 Diabetes Mellitus With Other Diabetic
		Arthropathy
	E11.620	Type 2 Diabetes Mellitus With Diabetic Dermatitis
	E11.621	Type 2 Diabetes Mellitus With Foot Ulcer
	E11.622	Type 2 Diabetes Mellitus With Other Skin Ulcer
	E11.628	Type 2 Diabetes Mellitus With Other Skin
	F () 000	Complications
	E11.630	Type 2 Diabetes Mellitus With Periodontal Disease
	E11.638	Type 2 Diabetes Mellitus With Other Oral Complications
	E11.641	Type 2 Diabetes Mellitus With Hypoglycemia With
		Coma
	E11.649	Type 2 Diabetes Mellitus With Hypoglycemia Without
		Coma
	E11.65	Type 2 Diabetes Mellitus With Hyperglycemia
	E11.69	Type 2 Diabetes Mellitus With Other Specified
	F 44.0	Complication
	E11.8	Type 2 Diabetes Mellitus With Unspecified Complications
	E11.9	Type 2 Diabetes Mellitus Without Complications
	E13.x	Other Specified Diabetes Mellitus
Stroke/TIA/ Thromboembolism	G45.9	Transient cerebral ischemic attack, unspecified.
	163.0x, 163.3x	Cerebral Infarction Due To Thrombosis
	163.1x, 163.4x	Cerebral Infarction Due To Embolism
	163.2x, 163.5x	Cerebral Infarction Due To Unspecified Occlusion Or Stenosis
	163.6	Cerebral Infarction Due To Cerebral Venous Thrombosis, Nonpyogenic
	163.8	Other Cerebral Infarction
	163.9	Cerebral Infarction, Unspecified
	174.01	Saddle Embolus Of Abdominal Aorta
	174.09	Other Arterial Embolism And Thrombosis Of Abdominal Aorta
	I74.x (x = 1 to 9)	Embolism And Thrombosis
	. ,	
Vascular Disease	l21.x (x = 0 to 3)	St Elevation (STEMI) Myocardial Infarction

l21.4	Non-St Elevation (NSTEMI) Myocardial Infarction		
l22.0, l22.1, l22.8, l22.9	Subsequent St Elevation (STEMI) Myocardial Infarction		
122.2	Subsequent Non-St Elevation (NSTEMI) Myocardial Infarction		
125.2	Old Myocardial Infarction		
l25.10, l25.11x	Atherosclerotic Heart Disease Of Native Coronary Artery		
I70.20x	Unspecified Atherosclerosis Of Native Arteries Of Extremities		
l70.21x	Atherosclerosis Of Native Arteries Of Extremities With Intermittent Claudication		
I70.22x	Atherosclerosis Of Native Arteries Of Extremities With Rest Pain		
I70.23x	Atherosclerosis Of Native Arteries Of Right Leg With Ulceration		
I70.24x	Atherosclerosis Of Native Arteries Of Left Leg With Ulceration		
170.25	Atherosclerosis Of Native Arteries Of Other Extremities With Ulceration		
170.0	Atherosclerosis Of Aorta		