Thromboprophylaxis patterns and determinants in critically ill patients: a multicenter audit

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Abstract

Introduction: Heparin is safe and prevents venous thromboembolism in critical illness. We aimed to determine the guideline concordance for thromboprophylaxis in critically ill patients and its predictors, and to analyze factors associated with the use of low molecular weight heparin (LMWH), as it may be associated with a lower risk of pulmonary embolism and heparin-induced thrombocytopenia without increasing the bleeding risk.

Methods: We performed a retrospective audit in 28 North American intensive care units (ICUs), including all consecutive medical-surgical patients admitted in November 2011. We documented ICU thromboprophylaxis and reasons for omission. Guideline concordance was determined by adding days in which patients without contraindications received thromboprophylaxis to days in which patients with contraindications did not receive it, divided by the total number of patient-days. We used multilevel logistic regression including time-varying, center and patient-level covariates to determine the predictors of guideline concordance and use of LMWH.

Results: We enrolled 1,935 patients (62.3 ± 16.7 years, Acute Physiology and Chronic Health Evaluation [APACHE] II score 19.1 ± 8.3). Patients received thromboprophylaxis with unfractionated heparin (UFH) (54.0%) or LMWH (27.6%). Guideline concordance occurred for 95.5% patient-days and was more likely in patients who were sicker (odds ratio (OR) 1.49, 95% confidence interval (CI) 1.17, 1.75 per 10-point increase in APACHE II), heavier (OR 1.32, 95% CI 1.05, 1.65 per 10-m/kg2 increase in body mass index), had cancer (OR 3.22, 95% CI 1.81, 5.72), previous venous thromboembolism (OR 3.94, 95% CI 1.46,10.66), and received mechanical ventilation (OR 1.83, 95% CI 1.32,2.52). Reasons for not receiving thromboprophylaxis were high risk of bleeding (44.5%), current bleeding (16.3%), no reason (12.9%), recent or upcoming invasive procedure (10.2%), nighttime admission or discharge (9.7%), and life-support limitation (6.9%). LMWH was less often administered to sicker patients (OR 0.65, 95% CI 0.48, 0.89 per 10-point increase in APACHE II), surgical patients (OR 0.41, 95% CI 0.24, 0.72), those receiving vasoactive drugs (OR 0.47, 95% CI 0.35, 0.64) or renal replacement therapy (OR 0.10, 95% CI 0.05, 0.23).

Conclusions: Guideline concordance for thromboprophylaxis was high, but LMWH was less commonly used, especially in patients who were sicker, had surgery, or received vasopressors or renal replacement therapy, representing a potential quality improvement target.
Introduction

Thromboprophylaxis is a key component of care for critically ill patients because of their high risk of venous thromboembolism [1] and because heparin is an effective and safe prevention strategy. The Stanford University Evidence Based Practice Center rates thromboprophylaxis as the foremost patient safety initiative for hospitalized patients [2]. Moreover, the Joint Commission now specifies thromboprophylaxis as a key quality measure for hospitalized patients [3] and thromboprophylaxis is also a hospital accreditation metric in Canada [4].

Analysis of a large registry of 175,665 critically ill adult patients in 134 ICUs in Australia and New Zealand from 2006 to 2010 showed a significant association between omission of early thromboprophylaxis and hospital mortality after adjusting for covariates, including multiple trauma, sepsis, cardiac arrest, and preexisting metastatic cancer [5]. From a patient and healthcare system perspective, ascertaining current practice and ensuring that it is commensurate with current best evidence is crucial. We therefore conducted a multicenter audit of thromboprophylaxis in medical–surgical critically ill patients to identify the types and rates of thromboprophylaxis and to analyze factors associated with appropriate use. We hypothesized that approximately 80% of patients would receive some anticoagulant, reflecting approximately 70% of eligible ICU-days, and that low molecular weight heparin (LMWH) would be used less than unfractionated heparin (UFH) [6].

Materials and methods

Design

We conducted a multicenter retrospective 1-month practice audit of all consecutive patients admitted to the ICU between 1 November and 30 November 2011 in 26 centers across Canada and two centers in the United States to record thromboprophylaxis practices. We excluded patients admitted for less than 12 hours and patients admitted directly from the operating or recovery room after a cardiac surgery or neurosurgical procedure.

Pilot reliability study

Case report forms and an implementation manual were developed and pretested by two research coordinators, adapted from prior studies [7,8]. We conducted a structured, independent, duplicate chart abstraction exercise to identify points of data disagreement, to clarify methodology, and to enhance the efficiency and validity of the audit process. Two research coordinators from eight participating centers reviewed the case report forms and implementation manual, and then each independently audited five charts, abstracting 27 baseline demographic variables and 30 daily data variables for each patient’s length of ICU stay, which ranged from 2 to 60 days. Only 2% of variables were discordant overall. This calibration exercise mitigated discordance within and across centers, and improved the operational efficiency of the audit [9].

Audit

Data were abstracted until death or ICU discharge, censored at 60 days. Trained research coordinators collected demographics and baseline characteristics (age, sex, Acute Physiology and Chronic Health Evaluation (APACHE) II score [10], medical vs. surgical status, ICU admitting diagnosis), and relevant clinical outcomes (deep vein thrombosis, pulmonary embolism, major bleeding [11], heparin-induced thrombocytopenia, mortality). Venous thromboembolism events were diagnosed by the treating physicians based on clinical judgment and objective testing.

Pharmacologic prophylaxis (UFH, LMWH, warfarin, danaparoid, other agents), mechanical prophylaxis (antiembolic stockings, pneumatic compression devices), therapeutic anticoagulation, antiplatelet treatments, and use of inferior vena cava filters were captured daily, as well as factors potentially modulating prescribing such as laboratory values (for example, platelet count), outcomes (for example, bleeding), confirmatory tests (for all venous thromboembolism events), and process of care variables (for example, mobility). We also recorded characteristics of participating centers, including the number of ICU beds, the presence of a dedicated thrombosis service, trauma service or ICU quality improvement team, and whether thromboprophylaxis was administered using preprinted orders or computerized physician order entry.

Adjudication

Venous thromboembolism events and bleeding events were adjudicated by one investigator unaware of the use of thromboprophylaxis using established and validated classification systems. For venous thromboembolism events, recent trial definitions were used [12]. Bleeding was classified as major if it was life threatening due to hypovolemic shock (for example, ruptured abdominal aortic aneurysm) or at a critical site (for example, intracranial), if the bleeding was overtly clinically important and was associated with one of several criteria within 24 hours of the bleed (decrease in hemoglobin >20 g/l, transfusion ≥2 packed red blood cells, decrease in systolic blood pressure >20 mmHg, or increase in heart rate >20 bpm in the absence of other causes), or if the bleeding required an invasive intervention (for example, reoperation) [11,12]. Heparin-induced thrombocytopenia was diagnosed by serotonin release assay [13]. Thrombosis was attributed to heparin-induced thrombocytopenia if it occurred within 1 week of the positive serologic test.
Analysis

We reported continuous data as the mean and standard deviation or the median and interquartile range when data were skewed. We reported absolute numbers of patients or days, and proportions. We used t tests and Wilcoxon rank-sum tests to compare continuous data and Fisher’s exact test to compare proportions.

We analyzed thromboprophylaxis overall and by center. Our primary outcome was guideline concordance with the 2008 American College of Chest Physicians Antithrombotic Therapy and Prevention of Thrombosis Guidelines’ 1A recommendation for daily heparin thromboprophylaxis (either UFH or LWMH) for all critically ill patients unless contraindications exist [14]. We calculated a guideline concordance rate for any type of heparin prophylaxis (UFH or LWMH) or therapeutic heparin, in those patients receiving it, by center and overall. Specifically, guideline concordance was defined as ICU days in which eligible patients for any type of pharmacologic thromboprophylaxis (any ICU patient without contraindications) were receiving it as recommended, plus noneligible patients who were not receiving it as recommended, divided by the total number of ICU patient-days. By eligible patients, we refer to those being in the ICU with no contraindications to pharmacologic prophylaxis (for example, active bleeding, high risk of bleeding, suspected or proven heparin-induced thrombocytopenia, or imminent or recent invasive procedure within 24 hours). Other reasons or no clear reasons were not considered contraindications.

To analyze the factors associated with guideline concordance, we used multilevel logistic regression, analyzing repeated measurements of concordance within patients and within centers. Possible determinants included two factors at the level of center (dedicated thrombosis service, use of preprinted orders), five factors at the level of patients (medical versus surgical admission, APACHE II score, cancer, history of venous thromboembolism events, or body mass index), and three time-varying factors at the level of patient-days (invasive mechanical ventilation, inotropes or vasopressors, and renal replacement therapy). Patient factors were therefore measured at either baseline (for example, cancer) or on a daily basis (for example, renal replacement therapy). We calculated odds ratios (ORs) and 95% confidence intervals (CIs). We considered factors significant at the $P < 0.05$ level.

In a second regression analysis, we examined factors associated with LMWH thromboprophylaxis rather than UFH thromboprophylaxis, including only those patient-days on which the patient received doses of either agent. This was based on a recent systematic review of randomized trials of LMWH versus UFH in medical–surgical patients performed by our group [15]. We considered the same covariates as in the first regression.

Research ethics

This retrospective audit was reviewed and approved by each participating center’s Research Ethics Board (see Acknowledgements), waiving the need for informed consent.

Results

We enrolled patients from 26 Canadian centers and two US centers. The centers contributed a median (interquartile range) of 55.5 (42.5, 74.0) patients to the audit. Participating centers had a mean (standard deviation) of 22.6 (9.8) ICU beds. Among the 28 centers, a dedicated thrombosis service existed in nine centers (32.1%), a dedicated trauma service in 17 centers (60.7%), and a dedicated ICU quality improvement team in 19 centers (67.9%). Thromboprophylaxis prescribing was facilitated by preprinted orders in 21 centers (75.0%), and by computerized physician order entry in six centers (21.4%).

We included 1,935 patients (mean age 62.3 ± 16.7) with a mean APACHE II score of 19.1 ± 8.3. Baseline characteristics are shown in Table 1 and patient outcomes in Table 2. Venous thromboembolic events were uncommon: leg thrombi (42 patients, 2.2%), nonleg thrombi (52 patients, 2.7%), and pulmonary embolism (36 patients, 1.9%). Heparin-induced thrombocytopenia occurred in two patients (0.001%), associated with venous thromboembolic events in both. Major bleeding occurred in 187 patients (9.7%). Among these patients, 74 were receiving either LMWH or UFH for thromboprophylaxis on their first day of bleeding. Mortality was 12.5% (242 patients) in the ICU and 19.4% (375 patients) in hospital.

Overall, 1,619 patients (83.7%) received some form of anticoagulant during their ICU stay. Pharmacologic thromboprophylaxis was with UFH in 1,044 patients (54.0%) or with LMWH in 535 patients (27.6%), whereas 390 patients (20.2%) were therapeutically anticoagulated at some time with UFH, warfarin, LMWH, or danaparoid for venous thromboembolism or other indication such as atrial fibrillation and acute coronary syndrome (Table 3). When considering patient-days as the unit of analysis, prophylaxis patterns were similar. Pharmacologic prophylaxis was administered for 65.4% of patient-days. There were 1,957 of 12,756 patient-days (15.3%) during which no thromboprophylaxis (neither pharmacologic nor mechanical) was administered (Figure 1).

We documented guideline concordance for 12,186/12,756 (95.5%) patient-days. The range of guideline concordance in participating centers ranged from 81.3 to 100.0%. The highest level of patient activity during these 570 patient-days of nonconcordance included bed rest (363 patient-days, 64.0%), transferring to a chair (100 patient-days, 17.5%), and walking (105 patient-days, 18.4%), with data missing for 2 patient-days. The respiratory status
during nonconcordant patient-days was spontaneously breathing (331 patient-days, 58.1%), non-invasive ventilation (215 patient-days, 37.7%), and invasive mechanical ventilation (24 patient-days, 4.2%). We did not identify any patients who received heparin when it was contraindicated.

Factors associated with guideline concordance with thromboprophylaxis are reported in Table 4. Guideline concordance was more likely in patients who were sicker (OR = 1.49, 95% CI = 1.17, 1.75 for each 10-point increase in APACHE II score), in patients who were heavier (OR = 1.32, 95% CI = 1.05, 1.65 for each 10-point increase in body mass index), in patients with cancer (OR = 3.22, 95% CI = 1.81, 5.72), in patients with a history of venous thromboembolism (OR = 3.94, 95% CI = 1.46, 10.66), and among those receiving mechanical ventilation (OR = 1.83, 95% CI = 1.32, 2.52).

For 3,167 patient-days (24.8%) where no form of anticoagulant was administered, the reasons given were high risk of bleeding (44.5%), bleeding (16.3%), no reason evident (12.9%), invasive procedure (10.2%), nighttime admission to or discharge from the ICU (9.7%), life-support limitation (6.9%), perception that it was unnecessary (4.8%), and among those receiving mechanical ventilation (OR = 1.83, 95% CI = 1.32, 2.52).

Table 1 Baseline patient characteristics

| Characteristic          | All patients (n = 1,935) |
|-------------------------|--------------------------|
| Age (years)             | 62.3 (16.7)              |
| APACHE II score         | 19.1 (8.3)               |
| Females                 | 869 (44.9)               |
| Admission diagnosis     |                          |
| Cardiovascular          | 283 (14.6)               |
| Respiratory             | 517 (26.7)               |
| Gastrointestinal        | 313 (16.2)               |
| Renal                   | 53 (2.7)                 |
| Neurologic              | 215 (11.1)               |
| Sepsis                  | 240 (12.4)               |
| Trauma                  | 14 (0.7)                 |
| Metabolic               | 133 (6.9)                |
| Hematologic             | 16 (0.8)                 |
| Other medical           | 71 (3.7)                 |
| Other surgical          | 80 (4.1)                 |
| Location prior to ICU   |                          |
| Operating room/recovery| 485 (25.1)               |
| Emergency room          | 669 (34.6)               |
| Ward                    | 480 (24.8)               |
| Other hospital ICU      | 83 (4.3)                 |
| Other hospital ward     | 218 (11.3)               |
| Medical admission       | 1453 (75.1)              |
| Mechanical ventilation  |                          |
| Invasive                | 997 (51.5)               |
| Non-invasive only       | 132 (6.8)                |
| None                    | 806 (41.6)               |
| Vasopressor/inotropes   | 611 (31.6)               |
| Dialysis                | 67 (3.5)                 |

Data presented as mean (standard deviation) or number (percentage). Characteristics of the 1,935 patients included in this audit on the first day of ICU admission, from 28 participating ICUs. APACHE, Acute Physiology and Chronic Health Evaluation.

Table 2 Patient outcomes

| Outcome                          | All patients (n = 1,935) |
|----------------------------------|--------------------------|
| Major outcomes                   |                          |
| ICU mortality                    | 242 (12.5)               |
| Hospital mortality               | 375 (19.4)               |
| Re-admitted to ICU               | 55 (2.8)                 |
| ICU length of stay (days)        | 4 (2 to 7)               |
| Hospital length of stay (days)   | 12 (6 to 24)             |
| Adjudicated outcomes             |                          |
| Leg thrombus                     | 42 (2.2)                 |
| Nonleg thrombus<sup>a</sup>      | 52 (2.7)                 |
| Pulmonary embolism               | 36 (1.9)                 |
| Any venous thromboembolism       | 117 (6.0)                |
| Heparin-induced thrombocytopenia | 3 (0.2)                  |
| Major bleeding                   | 187 (9.7)                |
| Any bleeding                     | 457 (23.6)               |

Data presented as number (percentage) or median (interquartile range). Venous thromboembolic outcomes, length of stay and mortality status of the 1,935 patients included in this audit, from 28 participating ICUs. Only the first ICU admissions during the audit month were considered. Outcomes are not mutually exclusive. *Thromboses occurring in sites other than the lower extremities, including the head and neck, trunk, and upper extremities.

CI = 1.46, 10.66), and among those receiving mechanical ventilation (OR = 1.83, 95% CI = 1.32, 2.52).

For 3,167 patient-days (24.8%) where no form of anticoagulant was administered, the reasons given were high risk of bleeding (44.5%), bleeding (16.3%), no reason evident (12.9%), invasive procedure (10.2%), nighttime admission to or discharge from the ICU (9.7%), life-support limitation (6.9%), perception that it was unnecessary (4.8%), and among those receiving mechanical ventilation (OR = 1.83, 95% CI = 1.32, 2.52).

Table 3 Use of anticoagulants

| Patients (n = 1,935) | Patient-days (n = 12,756) |
|---------------------|---------------------------|
| Prophylactic anticoagulants |                      |
| Subcutaneous LMWH     | 535 (27.6)                |
| Subcutaneous UFH<sup>b</sup> | 1,044 (54.0)           |
| Therapeutic anticoagulants |                      |
| Any therapeutic anticoagulant | 390 (20.2)            |
| Intravenous UFH       | 284 (14.7)                |
| LMWH                 | 35 (1.8)                  |
| Coumadin             | 94 (4.9)                  |
| Danaparoid           | 5 (0.3)                   |
| Other<sup>b</sup>     | 52 (2.7)                  |
| Any of the above      | 1,619 (83.7)             |

Data presented as number (percentage) or median (interquartile range). Anticoagulation management for the 1,935 patients included in this audit, and ICU patient-days. Some patients received more than one type of anticoagulation during their ICU stay. LMWH, low molecular weight heparin; UFH, unfractionated heparin. *Refers to doses of UFH that were not ordered to target an activated partial thromboplastin time. **Thrombolytic agents (streptokinase, recombinant tissue plasminogen activator), argatroban, fondaparinux, eptifibatide, dabigatran, rivaroxaban.
other (2.0%), or suspected or proven heparin-induced thrombocytopenia (1.4%) (Table 5).

Factors associated with prescription of LMWH instead of UFH per patient-day are reported in Table 6. LMWH was less likely used than UFH in sicker patients (OR = 0.65, 95% CI = 0.48, 0.89 for each 10-point increase in APACHE II score), in surgical patients versus medical patients (OR = 0.41, 95% CI = 0.24, 0.72), in those receiving inotropes or vasopressors (OR = 0.47, 95% CI = 0.35, 0.64), and in patients receiving renal replacement therapy (OR = 0.10, 95% CI = 0.05, 0.23).

Mechanical prophylaxis was ordered less often than pharmacologic prophylaxis (5.5% patient-days for anti-embolic stockings and 16.5% patient-days for pneumatic compression devices). These two devices were most often ordered when no anticoagulant was administered (Figure 2). More specifically, anti-embolic stockings were administered for 8.3% patient-days, and pneumatic compression devices on 34.8% patient-days. Overall, there were

### Table 4 Factors associated with guideline concordance: multilevel logistic regression

| Three-level model | Odds ratio (95% CI) | P value |
|-------------------|---------------------|---------|
| Patient factors   |                     |         |
| Surgical admission| 1.09 (0.68, 1.75)    | 0.718   |
| APACHE II score (10-point increase) | 1.49 (1.17, 1.89) | 0.001 |
| Cancer\(^a\)     | 3.22 (1.81, 5.72)    | <0.001  |
| History of venous thromboembolism | 3.94 (1.46, 10.66) | 0.007 |
| Body mass index (10-point increase) | 1.32 (1.05, 1.65) | 0.018 |
| Daily factors\(^b\) |                      |         |
| Any dialysis      | 0.79 (0.45, 1.40)    | 0.422   |
| Invasive mechanical ventilation | 1.83 (1.32, 2.52) | <0.001 |
| Vasopressors or inotropes | 1.26 (0.90, 1.78) | 0.184 |
| Site factors      |                     |         |
| Dedicated thrombosis consulting service | 1.91 (0.95, 3.86) | 0.069 |
| Preprinted orders including thromboprophylaxis | 1.00 (0.51, 1.98) | 0.989 |

Results of the multilevel logistic regression model examining determinants of guideline concordance (use of any pharmacological thromboprophylaxis unless contraindications exist). The three levels are center, patient, and ICU-day. There were 10,540 patient-days (10,154 with concordance, 386 without), \( n = 1,533 \) patients. Body mass index values were missing for 402 of the 1,935 patients enrolled in the study. These patients were therefore excluded from the regression analysis. APACHE, Acute Physiology and Chronic Health Evaluation; CI, confidence interval. \(^a\)Cancer refers to lymphoma, metastatic cancer, leukemia, multiple myeloma, active solid malignancy, or history of solid malignancy. \(^b\)Daily factors reflect exposure in the preceding 3 days.

### Table 5 Reason for not using anticoagulant

| Reason                     | 3,167 patient-days with no anticoagulant |
|----------------------------|-----------------------------------------|
| High risk of bleeding      | 1,410 (44.5)                            |
| Bleeding                   | 517 (16.3)                              |
| Invasive procedure/surgery | 324 (10.2)                              |
| Nighttime admission or discharge | 306 (9.7)   |
| Limiting life support      | 218 (6.9)                               |
| Perceived unnecessary      | 153 (4.8)                               |
| Other\(^a\)                | 62 (2.0)                                |
| Suspected/proven heparin-induced thrombocytopenia | 45 (1.4) |
| No reason evident          | 408 (12.9)                              |

Reasons for no anticoagulation for 3,167 patient-days among 1,116 patients. \(^a\)Examples include severe anemia, mildly abnormal laboratory values, prescribing omission, pharmacy error, expected short-term ICU admission, ambulation, and patient declined.

### Table 6 Factors associated with LMWH rather than UFH thromboprophylaxis: multilevel logistic regression

| Three-level model | Odds ratio (95% CI) | P value |
|-------------------|---------------------|---------|
| Patient factors   |                     |         |
| Surgical admission| 0.41 (0.24, 0.72)   | 0.002   |
| APACHE II score (10-point increase) | 0.65 (0.48, 0.89) | 0.007 |
| Cancer\(^a\)     | 1.12 (0.64, 1.94)   | 0.692   |
| History of venous thromboembolism | 1.18 (0.50, 2.76) | 0.704 |
| Body mass index (10-point increase) | 1.12 (0.88, 1.44) | 0.362 |
| Daily factors\(^b\) |                      |         |
| Any dialysis      | 0.10 (0.05, 0.23)   | <0.001  |
| Invasive mechanical ventilation | 0.77 (0.56, 1.06) | 0.105 |
| Vasopressors or inotropes | 0.47 (0.35, 0.64) | <0.001 |
| Site factors      |                     |         |
| Dedicated thrombosis consulting service | 4.20 (0.62, 28.60) | 0.135 |
| Preprinted orders including thromboprophylaxis | 1.79 (0.24, 13.44) | 0.556 |

Results of the multilevel logistic regression model examining determinants of LMWH rather than UFH thromboprophylaxis. The three levels are center, patient, and ICU-day. There were 6,856 patient-days (2,182 with LMWH prophylaxis), \( n = 1,181 \) patients. Body mass index values were missing for 402 of the 1,583 patients who received thromboprophylaxis. These patients were therefore excluded from the regression analysis. APACHE, Acute Physiology and Chronic Health Evaluation; CI, confidence interval; LMWH, low molecular weight heparin; UFH, unfractionated heparin. \(^a\)Cancer refers to lymphoma, metastatic cancer, leukemia, multiple myeloma, active malignancy, or history of malignancy. \(^b\)Daily factors reflect exposure in the preceding 3 days.
were 1,245 patient-days (9.8%) during which both mechanical prophylaxis (anti-embolic stockings and pneumatic compression devices) and pharmacological prophylaxis were applied. Inferior vena cava filters were inserted in 31 patients (1.6%), for a total of 157 patient-days. Two-thirds of inferior vena cava filters were inserted prophylactically (21/31 filters, 67.7%), and two patients developed a leg deep venous thrombosis after the filter insertion during their ICU stay.

Discussion
In this 1-month multicenter audit, we observed a guideline concordance for pharmacological thromboprophylaxis for 95.5% of ICU-days in medical–surgical critically ill patients. Guideline concordance for pharmacological thromboprophylaxis was more likely in sicker and heavier patients, and in patients with cancer, with a history of venous thromboembolism, and those receiving mechanical ventilation. LMWH was less commonly used than UFH, especially in patients who were sicker, who had surgery, or who received vasoactive drugs or renal replacement therapy.

The guideline concordance documented in this audit was somewhat higher than previous audits [7,16]. This increased concordance may reflect the growing number of randomized trials supporting the use of heparin in various populations, including in the ICU. Time has allowed for the passive diffusion of evidence into practice, and generalized application of heparin thromboprophylaxis. The encoding of thromboprophylaxis into hospital accreditation may also play a role. Our findings may reflect the low cost of heparin relative to other preventive or therapeutic interventions used in the ICU. High guideline concordance of pharmacologic thromboprophylaxis as a relatively simple intervention contrasts with some other multifaceted quality improvement initiatives such as ventilator-associated pneumonia prevention [17] for which there are several components (for example, body position, mechanical interventions, pharmacologic approaches).

Use of pharmacologic thromboprophylaxis was significantly more likely in patients with high illness severity, a diagnosis of cancer, a history of venous thromboembolism event, and a high body mass index. Clinician awareness of risk factors may have driven the higher penetration of pharmacologic thromboprophylaxis use for patients with these characteristics. Prior critical care research has shown that the risk of a venous thromboembolism event is greater in patients with a high APACHE II score [18], cancer [19], personal or family history of venous thromboembolism [20,21], and greater weight [22-24]. Inadequate dosing in obese patients leading to lower anti-Xa levels [25] may explain this association [26,27]. Of the three advanced life supports examined, only mechanical ventilation was significantly associated with guideline concordance, possibly reflecting perceived higher risk of a venous thromboembolism event in mechanically ventilated patients [28,29]. In terms of center effects, neither the presence of a dedicated thrombosis consulting service nor the use of preprinted orders was associated with guideline concordance, adjusting for other patientspecific factors. Although drug-prescribing modification is amenable to preprinted orders, the impact has not been well studied in the ICU.

As hypothesized, LMWH was administered less often than UFH, which is consistent with a national Austrian audit of 325 critically ill patients documenting lower use of LMWH [30]. In early 2013, the Surviving Sepsis Campaign issued a 1B recommendation to use LMWH daily thromboprophylaxis instead of UFH twice-daily thromboprophylaxis in the absence of contraindications [31]. This recommendation was partly based on the multinational Prophylaxis for Thromboprophylaxis in Critical Care Trial (PROTECT) in 3,764 critically ill patients showing that dalteparin significantly reduced the risk of pulmonary embolism in critically ill patients compared with UFH, with no difference in major bleeding and a trend toward lower rates of deep vein thrombosis, overall venous thromboembolism events, and heparin-induced thrombocytopenia [12]. Subsequently, a recent meta-analysis of five randomized trials enrolling more than 5,000 medical–surgical critically ill patients showed that LMWH reduced rates of overall and symptomatic pulmonary embolism compared with UFH, but not overall and symptomatic deep venous thrombosis or mortality, while major bleeding was not different [15]. The gap in care regarding the use of LMWH is moderately large, and may represent a quality improvement target. A prospective economic evaluation conducted alongside...
the PROTECT study indicated that a strategy of thrombo-
 prophylaxis was the least costly strategy until the cost of
dalteparin rose from a base case cost of $8.13 to $183 per
dose (R Fowler et al., Cost-effectiveness of dalteparin ver-
sus unfractionated heparin for the prevention of venous
thromboembolism in critically ill patients: a prospective
comparative economic evaluation of the Prophylaxis for
Thromboembolism in Critical Care Trial (PROTECT),
submitted). There was no threshold in which lowering
the acquisition cost of UFH favored this prophylaxis strategy.

In our study, patients receiving inotropes or vasopres-
sors were 50% less likely to receive LMWH than UFH.
Such patients are at higher risk of venous thromboem-
bolism [20], possibly due to the concomitant proinflamma-
tory and procoagulant state, or decreased subcutaneous
heparin bioavailability as suggested by lower anti-Xa levels
[32,33] related to peripheral blood shunting or edema
[34]. LMWH may be less likely prescribed to patients recei-
ving inotropes or vasopressors due to fear of bleeding,
as these patients have lower platelet counts, higher Inter-
national Normalized Ratio values, and higher partial
thromboplastin time values than those not receiving ino-
tropes or vasopressors. Surgical patients were also less
likely to receive LMWH than UFH compared with med-
ical patients, which may reflect concern about increased
risk of postoperative bleeding. This situation is paradoxical
in that the relative benefit of LMWH over UFH is stronger
in surgical populations [35] than in medical populations
[1]. Patients receiving renal replacement therapy were also
significantly less likely to receive LMWH than UFH. This
could reflect concern about LMWH bioaccumulation in
renal insufficiency. However, dalteparin 5,000 U subcuta-
nenously does not bioaccumulate, as demonstrated by un-
detectable mean anti-Xa levels in a multicenter study of
ICU patients with a range of renal dysfunction including
anuric renal failure [36]. Similarly, when administered at
prophylactic doses to patients with a range of renal
function, prophylactic tinzaparin did not bioaccumulate
whereas enoxaparin did [37].

Mechanical thromboprophylaxis with either anti-embolic
stockings or pneumatic compression devices was infre-
quent. Mechanical thromboprophylaxis was primarily
used in patients who were currently bleeding or at risk
of bleeding, which is congruent with the American
College of Chest Physicians 2012 recommendation to
use mechanical thromboprophylaxis for patients with
contraindications to heparin [1], and the Grade 2C
Surviving Sepsis Campaign recommendation [31]. Our
observation that 6% and 17% of patient-days involved
anti-embolic stockings and pneumatic compression de-
vices, respectively, highlights the frequency of contraindi-
cations to pharmacological prophylaxis in medical–surgical
patients. This observation also underscores the need
for higher quality research on the effectiveness of
mechanical prophylaxis, given the sparse data support-
ing their efficacy in this population [38]. Despite rec-
ommendations against the use of inferior vena cava
filters for venous thromboembolism events and prophyl-
axis [14,36,39] and clear evidence that they cause
thrombosis, the filters continue to be widely used for
prevention. Although we did not examine removal rates
in this audit, it is also concerning in real-world practice
that less than 20% of retrievable filters are actually re-
moved [40].

This study has several limitations. We could not in-
corporate physician factors as determinants of docu-
mented prophylaxis because physicians are numerous in
the ICU on any given day (for example, attending, fel-
low, resident) and prescribers change often throughout a
patient’s ICU stay, precluding the attribution of drug
prescribing to one physician on any given day or for any
given patient. Given the retrospective design, we could
not concurrently survey clinicians to determine the ra-
tionale for their prescribing choices. We did not collect
data after ICU discharge. In one observational study,
survivors with resolving critical illness were less likely to
receive thromboprophylaxis on the ward compared with
within the ICU [29]. Finally, our collaboration with North
American centers could to some extent explain why
prophylactic UFH was preferentially used over LMWH,
because LMWH was adopted sooner in Europe [41].

This study has several strengths. By building on our re-
cent research to document [7,8], understand [42], imple-
ment [43], and test [12,37] thromboprophylaxis in the ICU,
we examined whether and how clinicians use heparin
thromboprophylaxis in this audit. There were several fea-
tures of this study that contributed to its success – related
to the project itself (relevant topic, simple design, manage-
able amount of data), the operations (a supportive methods
center, user-friendly tools, formal training, provision of re-
sults to participating centers, funding), and the centers
(commitment, skilled personnel, membership in a network
in which the audit is embedded) [44]. Furthermore, we
provided each participating hospital with patient-centered,
site-specific data formulated as a quality improvement
metric of guideline concordance designed for heparin
thromboprophylaxis. The metric reflected individualized
pharmacotherapeutic care and incorporated potentially
changing daily thrombotic and bleeding risks over the
ICU stay relevant to a broad case-mix of medical–surgical
patients.

We included a large number of centers in North America
enrolling a wide range of patients. By examining the lar-
gest and most heterogeneous group of medical–surgical
ICU patients to date, we enhanced the generalizability of
our findings. We conducted a pilot reliability study dem-
onstrating perfect agreement on 98% of collected variables
between two data abstractors, suggesting reliable data
collection [9]. The comprehensive data collection included baseline premorbid conditions, and daily events and exposures over the ICU stay that influence thromboprophylaxis prescribing. We calculated concordance, which takes into account those who should and should not receive prophylaxis. We used ICU patient-days as the unit of analysis for guideline concordance because this acknowledges daily changes in a patient’s condition and drug prescribing, rather than treating each patient as concordant or not based on a threshold of concordance days [45]. We used multilevel modeling, which allows concurrent analysis of center and patient factors (fixed baseline characteristics and variable patient-days) as determinants of administration, and avoided overfitting [46].

Conclusions
In summary, in this 1-month multicenter audit of thromboprophylaxis administration in a large cohort of medical–surgical critically ill patients, we documented widespread use of anticoagulation in prophylactic or therapeutic doses, greater use of UFH than LMWH, and mechanical prophylaxis primarily in patients who are bleeding or at risk of bleeding. Guideline concordance with any type of anticoagulant was high (95.5% per ICU patient-day) and reasons for noncompliance were poorly documented. Patients who were sicker, heavier, have cancer, or have prior VTE were more likely to receive pharmacological thromboprophylaxis. Patients who were sicker, who had surgery, or who received inotropes, vasopressors or renal replacement therapy were less likely to receive LMWH than UFH, representing a potential quality improvement target.

Key messages
- UFH is more commonly used than LMWH for thromboprophylaxis in medical–surgical critically ill patients.
- Guideline concordance for pharmacological thromboprophylaxis of any type is 95.5% per ICU patient-day.
- Patients who were sicker, patients who were heavier, and patients with cancer or prior thrombotic events were more likely to receive pharmacological thromboprophylaxis.
- Patients who were sicker, who had surgery, or who received inotropes, vasopressors or renal replacement therapy were less likely to receive LMWH for thromboprophylaxis.

Abbreviations
APACHE: Acute Physiology and Chronic Health Evaluation; CI: confidence interval; LMWH: low molecular weight heparin; OR: odds ratio; PROTECT: Prophylaxis for Thromboembolism in Critical Care Trial; UFH: unfractionated heparin.

Competing interests
MC sat on advisory boards for Leo Pharma, Pfizer, Bayer, Boehringer Ingelheim, Alexion, CSL Behring, and Artisan Pharma; prepared educational materials for Pfizer, Octapharm, and CSL Behring; and provided expert testimony for Bayer. MC’s institution has received funding for research projects from Boehringer Ingelheim, Octapharm, Pfizer, and Leo Pharma. DC received peer review funding from CIHR for the randomized trial PROTECT comparing unfractonated heparin versus the low molecular weight dalteparin. Pfizer and Eisai Inc. donated dalteparin. NZ and Dri-A received conference support from Pfizer. The remaining authors declare that they have no competing interests.

Authors’ contributions
FL, JM, DJK, DH-A, MC, NZ, DF, SH, and DC contributed to study design. FL, JM, ED, RC-C, MJ, MC, NS, DF, FC, PT, NS, and DC participated in data collection. FL, DH-A, SH, and DC performed data analysis. FL, JM, ED, DJK, MJ, MC, TS, RC-C, MC, SH, and DC interpreted the data. FL, DH-A, and DC drafted the manuscript. All authors revised the manuscript for important intellectual content and approved the submitted version.

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