ORIGINAL ARTICLE



A systematic review of biomarkers among hospitalized patients with COVID-19 predictive of venous thromboembolism: A communication from the Predictive and Diagnostic Variables Scientific and Standardization Committee of the ISTH

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Abstract

Background: Thrombosis is reported to occur more often among patients with COVID-19 than otherwise expected in the setting of viral pneumonia and sepsis. Systemic inflammatory biomarkers may be associated with venous thromboembolism (VTE) risk. The ISTH subcommittee on Predictive and Diagnostic Variables in Thrombotic Disease aimed to report the evidence on prognostic biomarkers for VTE in hospitalized patients with COVID-19.

Methods: Using a standardized Preferred Reporting Items for Systematic Reviews and Meta-analysis methodology, we conducted a systematic literature review to identify studies reporting prognostic biomarkers for VTE among hospitalized patients with COVID-19. Eligible studies included adults hospitalized with COVID-19 and reported the prognostic associations between any biomarker measured on admission, and the subsequent diagnosis of deep vein thrombosis or pulmonary embolism. Two authors

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. © 2022 The Authors. *Research and Practice in Thrombosis and Haemostasis* published by Wiley Periodicals LLC on behalf of International Society on Thrombosis and Haemostasis (ISTH). reviewed titles and abstracts, and three authors extracted study data and performed review of bias. Results were displayed descriptively. Meta-analysis was not possible. **Results:** From the initial 196 identified studies, full-text review was performed for 72 studies. Admission D-dimer levels were associated with VTE during hospitalization in five studies, and elevated platelet count was associated with VTE during hospitalization. Overall, there was a paucity of high-quality prognostic studies. Studies on other biomarkers did not meet the systematic review inclusion criteria.

Conclusions: Admission D-dimer was associated with VTE diagnosis during hospitalization for COVID-19; however, prospective validation of this finding is needed to identify optimal D-dimer thresholds to guide VTE prophylaxis measures.

KEYWORDS

COVID-19, D-dimer, prognostic biomarkers, venous thromboembolism, VTE

Essentials

- Prognostic biomarkers may predict venous thromboembolism (VTE) in hospitalized patients with COVID-19.
- We performed a systematic review to report prognostic biomarkers for VTE in hospitalized adults.
- Few low-quality studies suggested D-dimer drawn on admission may predict diagnosis later of VTE.
- More research is needed before biomarkers are used to stratify the risk of VTE in these patients.

1 | BACKGROUND

The severe acute respiratory syndrome coronavirus 2 infection (COVID-19) was identified in December 2019, and the World Health Organization declared a pandemic in March 2020.¹ The risk of venous thromboembolism (VTE) in hospitalized patients with COVID-19 infection is increased compared to other viral pneumonia or acute respiratory distress syndrome illness.^{2–8} Reports of COVID-19-associated VTE incidence have varied considerably with initial Chinese reports of VTE in up to 40% of hospitalized patients.^{9,10} Subsequently, it was recognized that the real incidence of VTE is closer to 20% in intensive care unit (ICU) patients^{5,11} and less than 10% in patients admitted on the medical wards.^{12,13} The control arms of the randomized trials assessing different anticoagulant dosing regimens have reported VTE rates between 4% and 9% of hospitalized patients.^{12,14}

Because of the perceived high risk of COVID-19-associated VTE, many centers started to prescribe anticoagulants at higher intensity for VTE prevention in patients hospitalized with acute COVID-19. Given the bleeding risks associated with anticoagulation, identification of patients at increased risk of VTE could enable targeted anticoagulation for those with the highest benefit-risk ratio.

There have been many reported associations between inflammatory biomarkers and both COVID-19 mortality¹⁵⁻¹⁹ and VTE.²⁰⁻²³ Among these biomarkers, D-dimer, a product of fibrin degradation, is an indirect marker of thrombin generation and is also raised in acute inflammatory states. Many studies have reviewed the association between D-dimer blood concentration and COVID-19-associated VTE diagnoses, however, most have been retrospective analyses of administrative data, introducing the potential for confounding.

The ISTH Standardization Subcommittee on Predictive and Diagnostic Variables convened with the aim of performing a systematic review and descriptive analysis to report the evidence on the prognostic biomarkers for identifying hospitalized patients with COVID-19 at higher risk of developing VTE.

2 | METHODS

The methodology of this study was presented at the 2021 ISTH congress, Philadelphia, Pennsylvania.²⁴ This systematic review and descriptive analysis was performed in adherence with the Preferred Reporting Items for Systematic Reviews and Meta-analysis statement.²⁵ The study protocol was published on the international prospective registry of systematic reviews (registered March 25, 2021, CRD42021245249; www.crd.york.ac.uk). We searched for studies reporting the prognostic association between any biomarker measured at hospitalization in patients with COVID-19 and the subsequent future diagnosis of VTE. We searched PubMed including combinations of MeSH terms and title/abstract terms, which included MEDLINE records, PubMed Central records, and the NCBI Bookshelf for studies in all languages until March 18, 2021. The search strings are available in Appendix S1. This study was approved by uthe Intermountain Healthcare ethics review board. This research was conducted in accordance.

2.1 | Study eligibility and review

Inclusion criteria were studies including hospitalized adult patients with a confirmatory laboratory test for COVID-19, or an agreed-upon defined clinical diagnosis such as findings characteristic for COVID-19 on computed tomography (CT) pulmonary angiography in the proper clinical setting. Studies had to report VTE during follow-up as the primary outcome. To be included, the study had to report proximal lower limb deep vein thrombosis (DVT) and/or pulmonary embolism (PE) by objective testing. Studies had to measure the biomarker of interest on hospital admission. Studies reporting exclusively on unusual-site thromboses, isolated distal DVT, catheter-associated DVT, or arterial thrombosis were excluded. We excluded studies with fewer than 50 patients to avoid inclusion of anomalous results. Diagnostic studies where biomarkers were tested as part of investigation for VTE were excluded.

Titles and abstracts were independently reviewed by two authors using the online program Covidence. If either author indicated that the publication should be reviewed further, the publication underwent full-text review. Three authors performed full-text review, and disagreements were resolved by discussion and consensus. When relevant information was missing (e.g., the timing of biomarker testing), the paper was excluded.

2.2 | Data extraction

Included studies underwent systematic data extraction into a standardized data capture tool by three authors who performed this task independently. Data extraction included first author name, country of origin, ICU versus hospital ward, single hospital versus multiple hospital, follow-up duration, timing of biomarker acquisition, study design, use of thromboprophylaxis, population age and sex distribution, VTE outcome type (DVT vs. PE vs. both), biomarker (including manufacturer) and the reported study results (extracted as reported in the publication).

2.3 | Quality assessment

Risk of bias for selected studies was assessed using the Quality in Prognosis Studies risk-of-bias assessment instrument for prognostic factor studies (modified from Hayden et al.).²⁶ The six risk-of-bias domains were study participation, study attrition, prognostic factor measurement, outcome measurement, study confounding, and statistical analysis and reporting. Studies were rated for each domain (yes, no, partial, unsure), and ultimately a risk of bias characterized as low, moderate, or high. Each study was independently assessed by three co-authors for risk of bias, and any disagreement was resolved upon discussion.

2.4 | Analysis

While the initial study design included meta-analysis, an early determination of the number and quality of included studies led to a

3 | RESULTS

justed for other prognostic factors.

We identified 196 studies in our search, of which 124 were excluded upon review of the title and abstract. Seventy-two publications were selected for full-text review,^{8,20,27-80} including 13^{81-93} identified by experts in the field. Reasons for study exclusions are presented in Figure 1, the most common included being a diagnostic, not prognostic, study (n = 24), biomarker timing not specified (n = 11), and fewer than 50 subjects enrolled (n = 11). Study characteristics of included studies are found in Table 1.

Among the studies that met the inclusion criteria, Middeldorp et al.⁹⁴ was a single hospital retrospective study in the Netherlands that enrolled adult patients who were COVID-19 positive, admitted from the onset of the pandemic until April 22, 2020. Pharmacologic VTE chemoprophylaxis was administered to 84%. Patients were followed until the time of death or discharge or April 30, 2020, whichever occurred first. Testing for VTE was initially conducted at the discretion of the treating physician. However, during the study period, screening with proximal lower limb venous compression ultrasonography (CUS) was variably implemented in the ICU. When it was determined that the study would end on April 30, 2020, lower limb proximal CUS was uniformly performed among all hospitalized medical ward patients on April 20, 2020. Among the 198 patients (75 ICU, 123 medical ward), 39 thromboembolic events occurred, including 13 PEs, and 26 DVTs (14 proximal DVTs, 11 distal DVTs, and 1 upper extremity DVT). The VTE event rate was 19.7%, and 6.6% of patients experienced PE. D-dimer was the only prognostic biomarker that was collected within 72 h of admission. The median D-dimer value for all patients at baseline was 1.1 mg/L (95% confidence interval [CI], 0.7-2.3) and 2.0 (95% CI, 0.8-8.1) among ICU patients compared with 1.1 (95% CI, 0.7-1.6) among ward patients. D-dimer association with VTE was reported as a hazard ratio in a competing risk regression model. The median D-dimer was 2.6 mg/L (95% CI, 1.1-18) among patients with VTE compared to 1.0 mg/L (95% CI, 0.7-1.7) among those without VTE. Following multivariate adjustment for age, sex, and ICU admission, the hazard ratio for VTE was 1.4 (95% CI, 1.1-1.9).

Artifoni et al.⁹⁵ reported a multicenter retrospective French study that enrolled adult patients who were COVID-19 positive or those with a typical COVID-19 pattern on chest CT admitted to the medical ward in two French hospitals between March 25 and April 10, 2020.

Pharmacologic VTE chemoprophylaxis was administered to 99%. Patients were followed until the time of death or discharge. All patients had a standardized systematic lower-limb CUS screening for DVT at hospital discharge or earlier if DVT was clinically suspected. The VTE event rate was 22.5%, and 10% of patients experienced





Study/Country of origin	Number of subjects	Study dates	Location	Age ^{a,b} /%male	Biomarker	Multivariate adjustment?	Increased risk for VTE
Artifoni/France	71	Mar 25, 2020-Apr 10, 2020	Wards and ICU	64 ^b /61	D-dimer	No	Yes
Bilalogiu/USA	3334	Mar 1, 2020–Apr 17, 2020	Wards and ICU	64 ^a /60	D-dimer	Yes	Yes
Maatman/USA	109	Mar 12, 2020-Mar 31, 2020	ICU	61ª/57	D-dimer	No	Yes
					Increased platelets	No	Yes
Middeldorp/ Netherlands	198	Jan 1, 2020-Apr 22, 2020	Wards and ICU	61 ^a /66	D-dimer	Yes	Yes
Trimaille/France	289	Feb 25, 2020-Apr 19, 2020	Wards	62ª/59	D-dimer	No	Yes
					Increased WBC	Yes	Yes

Abbreviations: CRP, C-reactive protein; ICU, intensive care unit; VTE, venous thromboembolism; WBC, white blood cell count. ^aMean.

^bMedian.

PE. Among the 71 patients, 16 thromboembolic events occurred including 7 PEs and 9 DVTs (7 were isolated distal DVT). D-dimer was drawn upon admission in 65 of the 71 patients. The median D-dimer for all patients at baseline was 0.79 mg/L (95% CI, 0.48-1.61 mg/L). The median D-dimer was significantly higher, at 1.63 mg/L (95% CI, 0.86-4.94) among patients with VTE compared to 0.67 mg/L (95% CI, 0.45-1.12) among those without VTE. No multivariable adjustment analysis was performed.

Bilaloglu et al.⁹² reported a retrospective study among sputum or nasopharyngeal-, or oropharyngeal-swabbed adult patients who were COVID-19 positive and admitted to a US medical ward or ICU between March 1 and April 17, 2020. "Low-dose" pharmacologic



VTE chemoprophylaxis was administered "in most patients." Patients were followed until the time of death, discharge, or end of study. VTE assessment occurred at the discretion of the physician during routine clinical care, and natural language processing was used to interrogate the electronic health record to identify thrombotic events with findings confirmed upon manual chart review. Among the 3334 patients, there were 207 VTE events (6.2%), with 106 (3.2%) of patients with PE, and 129 (3.9%) with DVT. Following multivariable adjustment, higher D-dimer levels at hospital presentation were associated with a VTE.

Trimaille et al.⁹¹ reported a nine-hospital retrospective study in France among consecutive adults with COVID-19 with either a positive nasopharyngeal swab or typical findings of COVID-19 at chest CT admitted to the medical ward or ICU between February 25 and April 19, 2020. Standard preventive thromboprophylaxis was administered to some (however, the percentage was not reported). Patients were followed until the time of death, discharge, or end of study. VTE assessment occurred at the discretion of the physician during routine clinical care. Among the 289 patients, there were 49 VTE events (17.6%), with 42 PEs, 12 DVTs, and 3 cerebral venous sinus thromboses. Following univariable adjustment, D-dimer at hospital admission was associated with VTE. Following multivariable adjustment, increased leukocyte count was associated with VTE.

Maatman et al.⁸⁷ reported a three-hospital retrospective US study among consecutive adults with laboratory-confirmed COVID-19 admitted to the ICU between March 12 and March 31, 2020. One hundred percent of patients received standard chemoprophylaxis. Patients were followed until the time of death, discharge, or May 6, 2020. VTE assessment occurred at the discretion of the physician during routine clinical care. Among the 109 patients, there were 31 VTE events (28%), with 26 having DVT, 4 having DVT/ PE, and 1 PE alone. Following univariable adjustment, D-dimer and elevated platelet count at hospital admission was associated with VTE. Neutrophil : lymphocyte ratio, lactate dehydrogenase, Creactive protein, and fibrinogen level were not.

Risk of bias for each study is reported in Table 2.

4 | DISCUSSION

We conducted this systematic review to assess the prognostic association between admission biomarkers and subsequent diagnosis

of VTE among patients hospitalized for COVID-19. Despite the high number of studies drawing conclusions on the prognostic value of Ddimer and other biomarkers for VTE, few met our inclusion criteria. The evidence to date suggests that D-dimer may be predictive of future VTE diagnosis during hospitalization for COVID-19, although inadequate evidence exists to refute possible candidate biomarkers, including white blood cell count and platelet count, among others. There are recent international randomized trials comparing the effectiveness of prophylactic-dose to treatment-dose anticoagulation among patients who are moderately or severely ill with COVID-19.12-14 These trials provide additional indirect evidence that D-dimer levels are associated with the risk of VTE during hospitalization. For example, the VTE rate was 2.5% in the control arm of one study enrolling patients with COVID-19 with D-dimer level above the manufacturer-recommended cutoff.¹² compared to 15% symptomatic DVT and 8% symptomatic PE in another study enrolling patients with COVID-19 with D-dimer more than four times the manufacturer-recommended cutoff.14

Our most important finding was a general low quality of evidence among published studies. Of those included studies, only one was prospectively conducted, and risk-of-bias scores ranged from low to high risk of bias. All studies had been truncated and terminated data collection within 3months of the pandemic start. No study followed the entire cohort to a predetermined time end point; rather, each study was stopped at a set date. Inter- and intrastudy variability existed in outcome measurement. Two main methodological limitations were observed among the excluded studies. The first limitation was a great heterogeneity among studies regarding the measured VTE outcome and the lack of a clear VTE definition and including diagnostic criteria. The second major limitation was the absence of information on the timing of biomarker measurement in many studies, precluding any conclusion on their prognostic rather than diagnostic usefulness. For prognostic assessment, a biomarker should be measured at a time VTE is neither suspected nor already diagnosed.

The main limitations of our systematic review are the low number of studies that met inclusion criteria and the uncertain heterogeneity of aspects that permitted inclusion (e.g., D-dimer assay used, interstudy variability in ultrasound technology and technique) that inform outcome measurement. It is unknown whether any biomarkers studied early in the pandemic will be relevant to subsequent variants of the virus that may have different clinical manifestations.

TABLE 2 Quality in Prognosis Studies risk-of-bias assessment of selected studies rating of risk of bias for included studies

	Artifoni	Middeldorp	Bilalogiu	Maatman	Trimaille
Study participation	Moderate	Moderate	Moderate	Moderate	Low
Study attrition	High	Moderate	High	High	High
Prognostic factor management	High	Low	Moderate	Moderate	Moderate
Outcome measurement	Moderate	Low	High	Low	Moderate
Study confounding	High	High	High	High	Moderate
Statistical analysis and reporting	Moderate	Moderate	Moderate	Moderate	Moderate

Note: Green: Low risk of bias; Yellow: Moderate risk of bias; Red: High risk of bias.

Limited data reporting from the individual does not permit analysis of any impact that race, ethnicity, and social determinants of health have on the outcomes. Despite the plenitude of published studies, few met the rigorous inclusion criteria, demonstrating the paucity of high-quality studies published. We did not contact study authors to obtain further details on inclusion criteria such as biomarker timing and outcome definition. One of the studies that met the inclusion criteria described biomarkers upon admission as being acquired within the first 72h. However, VTE was reported during those first 72h such that uncertainty exists that these biomarkers could be interpreted as predictive and not diagnostic. We do not know the timing of D-dimer measurement in relationship to when VTE chemoprophylaxis was administered. Strengths of this report include that we considered studies for which the diagnosis of COVID-19 was confirmed according to current widely accepted laboratory and/or imaging criteria. The VTE outcome definition used was restricted to clinically relevant objectively diagnosed DVT and PE. We included studies reporting the timing of biomarker ascertainment so as to identify prognostic rather than diagnostic associations between biomarkers and VTE.

To our knowledge, our work represents the first systematic review reporting the prognostic value of biomarkers for VTE among hospitalized patients with COVID-19. We concluded that admission D-dimer may be associated with VTE diagnosis during hospital admission for COVID-19; however, prospective validation of this finding is needed to identify optimal D-dimer thresholds to guide VTE prophylaxis measures. Furthermore, at present there is a lack of evidence on alternative prognostic biomarkers for VTE. The quality of the studies performed and the extant literature to date is inadequate for us to endorse any biomarker to be adopted into routine clinical care to predict VTE among patients admitted to a hospital with COVID-19 at this time.

AUTHOR CONTRIBUTIONS

All authors were involved in conceptualization, data curation, analysis, investigation, and methodology. SCW drafted the manuscript. All authors participated in the writing, review, and editing of later drafts and approval of the manuscript. 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. All authors participated in concept, design, drafting of manuscript, critical review, and refinement.

RELATIONSHIP DISCLOSURE

SCW, DC, KDW, CM, JBH, PEM, PLD, and HRE report nothing to disclose. FAK discloses received research support from: Bayer, BMS, Boehringer-Ingelheim, MSD, Daiichi-Sankyo, Actelion, the Netherlands Organization for Health Research and Development, the Dutch Thrombosis Association, and the Dutch Heart Foundation.

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SUPPORTING INFORMATION

Additional supporting information can be found online in the Supporting Information section at the end of this article.

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