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Review

Clinicians' reasoning as reflected in electronic clinical note-entry and reading/retrieval: a systematic review and qualitative synthesis

Tiago K Colicchio and James J Cimino

Informatics Institute, University of Alabama at Birmingham, Birmingham, Alabama, USA

Corresponding Author: Tiago K Colicchio, PhD, MBA, Informatics Institute, University of Alabama at Birmingham, 1900 University Boulevard, Suite 142, Birmingham, AL 35294-3412, USA (tcolicchio@uabmc.edu)

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ABSTRACT

Objective: To describe the literature exploring the use of electronic health record (EHR) systems to support creation and use of clinical documentation to guide future research.

Materials and Methods: We searched databases including MEDLINE, Scopus, and CINAHL from inception to April 20, 2018, for studies applying qualitative or mixed-methods examining EHR use to support creation and use of clinical documentation. A qualitative synthesis of included studies was undertaken.

Results: Twenty-three studies met the inclusion criteria and were reviewed in detail. We briefly reviewed 9 studies that did not meet the inclusion criteria but provided recommendations for EHR design. We identified 4 key themes: purposes of electronic clinical notes, clinicians' reasoning for note-entry and reading/retrieval, clinicians' strategies for note-entry, and clinicians' strategies for note-retrieval/reading. Five studies investigated note purposes and found that although patient care is the primary note purpose, non-clinical purposes have become more common. Clinicians' reasoning studies (n = 3) explored clinicians' judgement about what to document and represented clinicians' thought process in cognitive pathways. Note-entry studies (n = 6) revealed that what clinicians document is affected by EHR interfaces. Lastly, note-retrieval studies (n = 12) found that "assessment and plan" is the most read note section and what clinicians read is affected by external stimuli, care/information goals, and what they know about the patient.

Conclusion: Despite the widespread adoption of EHRs, their use to support note-entry and reading/retrieval is still understudied. Further research is needed to investigate approaches to capture and represent clinicians' reasoning and improve note-entry and retrieval/reading.

Key words: electronic health records, documentation/methods, clinical documentation, cognition

BACKGROUND AND SIGNIFICANCE

Health care providers rely on clinical notes such as progress notes, visit notes, or discharge summaries to facilitate memory and recall and enable understanding and coordination of patient care.¹ Due to the longitudinal characteristics of patient records, paper-based notes tend to become cluttered and fragmented, which facilitates their replacement with electronic health records (EHRs).² In the United States, over 90% of hospitals and over 80% office-based physicians

have adopted a certified EHR.³ Like paper-based notes, clinical notes produced with EHRs frequently contain redundant information and errors,^{4,5} and may never be read despite containing relevant information for patient care.⁶

The increased adoption of EHRs has also been associated with the so-called "physician burnout."⁷ A recent study found that for every hour of patient care, physicians spend up to two hours with electronic documentation.⁸ Clinical notes play an important role in the

© The Author(s) 2018. Published by Oxford University Press on behalf of the American Medical Informatics Association. All rights reserved. For permissions, please email: journals.permissions@oup.com documentation burden, as they contribute to information overload, especially in the United States, where notes tend to be significantly longer than similar documentation in other developed countries.9 In addition, EHRs facilitate duplication of data from one location to another, known as "copy-and-paste," which has contributed to the proliferation of bloated notes that prevent clinicians from having a "big picture" of their patients' problems.¹⁰ As pointed out by Weed¹¹ in 1968, effective patient records must provide documentation of what clinicians are thinking about the patients and their problems; however, several decades later, we still lack an understanding of the concepts and relationships of clinical reasoning.¹² Some researchers have called for a fundamental redesign of electronic clinical notes to increase clinicians' situational awareness,¹³ defined as "the perception of the elements in the environment within a volume of time and space, and the comprehension of their meaning to provide a basis for action."¹⁴ Such a redesign will have to consider the cognitive aspects of creation and use of clinical documentation, which requires an understanding of how EHRs are currently being used to support clinical reasoning and documentation.

Several studies have explored clinicians' perceptions and strategies related to adoption and use of EHRs to support creation and use of clinical documentation, and some of these studies have been assessed by recent systematic reviews. However, previous reviews have focused on specific processes such as handoffs,^{15–17} on specific types of notes such as discharge summaries,¹⁸ or on the effect of copy-and-paste.¹⁹ In addition to their narrow scope, none of these reviews has assessed how EHRs are used to support clinicians' interpretation of their clinical cases and strategies adopted to document their interpretation in clinical notes. A better understanding of these factors is necessary to guide researchers to create more effective EHR systems that can facilitate creation and use of clinical documentation, improve clinicians' situational awareness, and decrease the documentation burden.

OBJECTIVE

The objective of this systematic review is to describe the literature exploring the use of EHRs to support creation and use of clinical documentation in order to guide future research.

METHODS

We used PRISMA standards to elaborate, conduct, and report this systematic review,²⁰ and have registered the study protocol in an international database of systematic reviews²¹ under protocol # CRD42018094744.

Data sources and search strategy

We developed a strategy to search MEDLINE, CINAHL, and Scopus from their inception to April 20, 2018. We did not specify an initial search date to allow the broadest sample possible. Articles in any language were considered. We consulted an experienced research librarian to iteratively develop the search strategy for each database. Keywords and subject headings included terms for types of clinical notes, documentation processes, and EHR-related terms. Examples include medical history taking/methods, visit note, progress note, note entry, reading, EHRs, and electronic medical records. The complete search strategy for each database can be found in the Supplementary Material. We also identified potential studies from the reference lists of included articles.

Study selection

We defined electronic clinical documentation as any clinical note such as admission, history and physical, progress, discharge, visit, summary, or handoff/signout notes created or accessed by a clinician using an EHR system. We used a broad definition for clinicians that included attending physicians, medical residents or interns, physician assistants, nurse practitioners, and nurses. Although the notes included have varying uses, we did not choose studies of a specific type of note or population to allow coverage of EHR use across a large spectrum of note types and users. Study selection was done in 2 phases. The first phase included original research studies applying qualitative or mixed-methods examining electronic clinical documentation as previously defined. Studies applying only quantitative methods were excluded because this review aimed at understanding how EHRs are used to support creation and use of clinical documentation and not the *frequency* or other quantitative assessments of EHR use. As we focused on EHR use, we excluded studies assessing only paper-based notes. We also excluded studies assessing patients' perceptions of their clinicians' notes because we considered them to be an indirect and potentially misleading interpretation of clinicians' perspectives.

The second phase included studies that did not meet the inclusion criteria above but provided recommendations to inform the development and design of EHR functionality to support creation and use of clinical documentation. A brief sub-analysis of these studies was performed to extract recommendations relevant for developing EHR functionality to support note creation and use.

The 2 authors independently reviewed the title and abstract of all retrieved citations and then reviewed the full text of potentially relevant citations to select the final list of studies for inclusion in the review. Conflicts were resolved by consensus with studies reassessed as needed.

Data extraction and bias assessment

Using an iteratively designed structured form, 1 of the authors (TKC) abstracted information about the following: study design, data collection method, location, clinical setting (*hospital* or *ambulatory*), study setting (*clinical* or *simulated*), sample size, and a descriptive summary of findings. The second author (JJC) was consulted for parallel data extraction as needed, and conflicts were resolved via consensus. Due to the subjective nature of qualitative research, we conducted a critical analysis of included studies using the Critical Appraisal Skills Program (CASP) checklist.²² We specifically assessed whether the data collection method(s) used was adequate for analyzing the outcome(s) reported by the included studies, and we assessed the studies for the use of methodological triangulation as previously recommended.²³

Data synthesis

The 2 authors conducted a qualitative synthesis in which studies were read and re-read iteratively to identify key recurring themes emerging from the studies' outcomes (eg, studies assessing use of templates for note-entry were classified as "clinicians' strategies for note-entry"). The key themes were used to classify the studies and integrate their findings into descriptive summaries. This approach has been used in systematic reviews of qualitative research in other health care domains,^{24,25} as well as in informatics.²⁶ The qualitative nature of methods and outcomes of included studies prevented synthesis using meta-analysis.

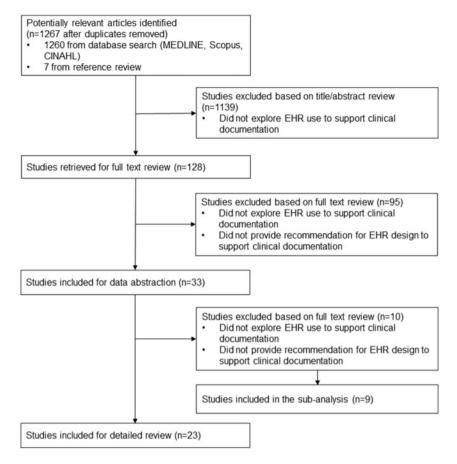


Figure 1. Trial flow diagram.

RESULTS

The search strategies identified 1267 potentially eligible articles. Database searches yielded 1260 studies with 7 additional studies added from reference review. Of these 1267 articles, 128 were selected for full-text review (raw inter-rater agreement 93%; kappa 0.6). Twenty-three of these met the inclusion criteria (raw agreement 91%; kappa 0.8) and were reviewed in detail (see Figure 1). Included studies were conducted in the United States (n=20), Australia (n=2), and Canada (n=1), in hospital (n=12), ambulatory (n=10), and mixed (n=1) settings. The most common types of notes explored were visit notes (n=8) and discharge summaries (n=4). Four key themes were identified and are described in detail below. Table 1 summarizes the studies reviewed in detail.

Our bias assessment revealed 7 studies that did not use more than 1 method of data collection.^{27–33} All articles were included, as they provided valuable insights to inform the use of EHRs to support creation and use of clinical documentation. Table 2 summarizes the bias assessment of studies reviewed in detailed.

Nine studies that did not meet the inclusion criteria but provided relevant information to improve EHR design were included in a subanalysis and were briefly reviewed (see Table 3).

Purposes of electronic clinical notes

Five studies explored EHR use to support specific note purposes mostly through semi-structured interviews and focus groups. Four studies explored the purposes of notes created in ambulatory settings^{27,28,34,35} and 1 in hospital settings.²⁹ All ambulatory-based

studies reported *supporting recall and memory for clinical care* as the primary driver for creating clinical notes. Two studies^{28,34} reported visit note purposes that provide little or no support for direct patient care including *billing, legal, quality improvement and compliance, research*, and *education*. Combined, these studies describe interviews with over 60 primary care providers who frequently reported frustration with the need to use visit notes for nonclinical purposes, which contributes to information overload. One study²⁹ explored the purposes of signout notes created during inpatient handoffs by qualitatively assessing note content. Signout notes are primarily created to support *patient care* and *care team coordination*.

Clinicians' reasoning for note-entry and reading/ retrieval

We found only 3 studies that directly assessed how clinicians interpret clinical cases and/or document their reasoning in the EHR. All studies assessed visit notes in a simulated ambulatory setting. Tuepker et al.²⁷ interviewed 38 allied health professionals following review of a visit note of a post-traumatic stress disorder (PTSD) patient. They found that providers tend to decide when to include sensitive information in their patients' notes. Information deemed to present a risk to a patient's access to care is frequently left out of the record (eg, sexuality or non-military trauma). Farri et al.³⁶ used a think-aloud (TA) protocol to observe 6 primary care physicians reviewing multiple clinical cases using a prototype EHR, and developed a cognitive pathway describing how clinicians perform notereading/retrieval to formulate their assessment and plan (A/P). The

Table 1. Summary of studies reviewed in detail (n = 23)	udies reviewed in d€	etail (n=23)				
Author	Key theme	Location	Clinical setting (study setting)	Type of note	Sample size	Summary of results
Salmon et al. (2016) ³⁵	Purposes	United States	Ambulatory (not specified)	Patient summary	13: Medical directors	 Clinical summary purposes: (1) clarify medication regimen; (2) follow-up appointments; (3) patient instructions; (4) referral appointments
Ho et al. (2014) ²⁸	Purposes	United States	Ambulatory (not snecified)	Visit note	46: PCP, NP	 Visit note purposes: (1) clinical; (2) billing and compliance; (3) leval: (4) research: (5) education
Campion et al. (2010) ²⁹	Purposes	United States	Hospital (clini- cal)	Signout note	730: Signout notes	 Signout note purposes: communicate patient treatment and care team coordination
Koopman et al. (2015) ³⁴	Purposes/ note-retrieval/ reading	United States	Ambulatory (simulated)	Visit note	16: PCP	 Visit note purposes: clinical, billing, quality improvement, avoid malpractice, and compliance Navigation patterns: A/P is the most important information and the first note section read
Tuepker et al. $(2016)^{27}$	Purposes/ reasoning	United States	Ambulatory (simulated)	Visit note	38: Mixed	 Visit note purposes to support recall and memory to evaluate and refine patient care Information deemed irrelevant for patient care is frequently left out of the notes
Farri et al. (2013) ³⁰	Reasoning	United States	Ambulatory (simulated)	Visit note	8: Interns	 Untimed simulations: clinicians focused on (1) time onset of problems, (2) treatment time Timed simulations: clinicians focused on (1) test results, (2) treatment effectiveness Subsequently, clinicians (3) correlated problems and treatment, and (4)
Farri et al. (2012) ³⁶	Reasoning	United States	Ambulatory (simulated)	Visit note	6: Interns	 Cognitive pathway to formulate A/P: (1) review chief complaint; (2) review previous diagnoses and history; (3) review previous treatments; (4) correlate past treatment and complaint; (5) create a mental model summarizing the clinical case
Haglin et al. (2017) ³⁷	Note-entry	United States	Hospital (simu- lated)	H&P	8: Interns	 Four of 13 (31%) interns observed recorded inaccuracies in their notes Six of 13 (46%) omitted pertinent information collected during the en-
Wilcox et al. (2010) ³⁸	Note-entry	United States	Hospital (mixed)	Progress note	15: MD, residents	 Counter ICU physicians tend to avoid templates because their structure conflicts with their mental model Their perception toward templates was positive after evaluating an EUD functional research source for a structure.
Patel et al. (2000) ³⁹	Note-entry	Canada	Ambulatory (clinical)	Visit note	7: Endocrinologists	 Using an EHR clinicians documented significantly more chief com- native and significantly loss review of systems.
Robelia et al. (2017) ³¹	Note-entry	United States	Ambulatory (not specified)	Discharge summary	474: PCP	 Discharge summaries frequently include information about list of diagnosis (64%), narrative summary (56%), and treatment provided (42%) Medication list with changes was the most important information for 94% of respondents, only 40% find it in their discharge summies
Cao et al. (2003) ⁴¹	Note-entry	United States	Mixed (clinical)	Discharge sum- mary/ signout note/ visit note	383 500: Mixed notes	Less than 1% of the clinical notes reviewed communicate medical errors

(continued)

Author	Key theme	Location	Clinical setting (study setting)	Type of note	Sample size	Summary of results
Rizvi et al. (2016) ⁴⁰	Note-entry/ note-retrieval/ reading	United States	Hospital (clinical)	H&P/ progress note/ discharge summary	12: Residents	 Templates are ubiquitously used for note-entry H&P and progress notes are created from the A/P or Subjective sections, and discharge summaries from Hospital course by problem or Discharge diagnosis The sequence of note sections read depends on stimulus or task to perform form
Nolan et al. (2017) ³²	Note-retrieval/ reading	United States	Hospital (clinical)	Mixed	24: MD, NP	 Chart review time is spent on clinical notes (47%), followed by labs (22%), and imaging (13%). The most common navigation naternet with clinical notes followed by imaging and labs
Pain et al. (2017) ³³	Note-retrieval/ reading	Australia	Hospital (not specified)	Mixed	53: Mixed	 Stimuli to read allied health professional notes: patient care, patient function, discharge planning, and a holistic approach to patient care SOAP was the most common note-retrieval format
Kendall et al. (2013) ⁴²	Note-retrieval/ reading	United States	Hospital (simulated)	Signout note	21: MD, residents	 Clinicians spent 52% of their review time in narrative data sources and 40% in structured data sources Navigation patterns vary widely even within cases Structured data are more frequently read after receiving new information about the case
Staggers et al. (2011) ⁴³	Note-retrieval/ reading	United States	Hospital (clinical)	Patient summary	26: RN	 Electronic patient summary does not meet nurses' information needs Effective patient summaries to support nursing care must include medical history
Callen et al. (2014) ⁴⁴	Note-retrieval/ reading	Australia	Hospital (clinical)	Discharge sum- mary/ visit note	97: MD, RN	 Nurses and physicians tend to read patient medical history to advance common orders Past history is more likely to he read for inteent cases
Wright et al. $(2016)^{45}$	Note-retrieval/ reading	United States	Hospital (clinical)	Mixed	20: MD, NP, RN	 Stimuli to read clinical notes include (1) new patient assessment; (2) reviewing the status of a known patient; (3) search for specific information, and (4) prioritize multiple patients
Hilligoss and Zheng (2013) ⁴⁶	Note-retrieval/ reading	United States	Hospital (clinical)	Mixed	73: MD, surgeons	 Stimuli to read clinical notes: (1) patient overview; (2) handoff/ subsequent care; (3) avoid biases (ie the tendency to consider a diaronois supersted by the merions movider)
Brown et al. $(2014)^{47}$	Note-retrieval/ reading	United States	Hospital (simulated)	Progress note	10: Hospitalists	 Sixty-seven percent of the rading time was dedicated to A/P, followed by labs (8%), and medications (7%) Time reading a note section has very little to do with the volume of data in the section was very little to do with the volume of the percent of the section has very little to do with the volume of the percent of the section was very little to do with the volume of the section was very little to do was very little to do
Clarke et al. (2014) ⁴⁸	Note-retrieval/ reading	United States	Ambulatory (simulated)	Visit note	15: PCP	 History of present illness and A/P are the most important and most read sections of a visit note Review of Systems is the least read section
Horsky and Ramelson (2016) ⁴⁹	Note-retrieval/ reading	United States	Ambulatory (simulated)	Patient summary	9. PCP	• Clinicians review patient summaries in three stages: (1) look for histor- ical data and read A/P; (2) look for changes since last visit; and (3) look for data about current state (eg, vitals, labs)

Abbreviations: PCP: primary care provider; NP: nurse practitioner; MD: practicing/attending physician; H&P: history and physical note; EHR: electronic health records; ICU: intensive care unit; RN: registered nurse; TA: think-aloud protocol; A/P: assessment and plan.

Table 2. Bias assessment of studies reviewed in detail ($n = 23$)	tudies reviewed in detail	l (n = 23)			
Author	Key theme	Study design	Data collection method	Triangulation	Bias assessment
Salmon et al. (2016) ³⁵	Purposes	Mixed-methods study	Interviews, chart review	Yes	Data collection methods seem adequate. Interviewees' perceptions are
Ho et al. (2014) ²⁸	Purposes	Qualitative study	Focus group	No	augmentee by review of patient summaries content. Findings could have been augmented by observations of the note-entry workflow to identify factors influencing physicians' decision about note
Campion et al. (2010) ²⁹	Purposes	Qualitative study	Chart review	No	purpose. Findings could have been augmented by observations of the note-entry workflow to identify factors influencing physicians' decision about note
Koopman et al. $(2015)^{34}$	Purposes/note- retrieval/reading	Qualitative study	TA, interviews	Yes	purpose. Data collection methods seem adequate. Inferences from TA are aug- mented by semi-structured interviews.
Tuepker et al. $(2016)^{27}$	Purposes/reasoning	Qualitative study	Interviews	No	Findings could have been augmented by observations of the note-entry workflow to identify factors influencing physicians' decision about what
Farri et al. (2013) ³⁰	Reasoning	Qualitative study	TA	No	to document in their notes. Findings could have been augmented by observations of physicians in nat- uralistic settings to determine the impact of interruptions in real clinical
Farri et al. (2012) ³⁶	Reasoning	Qualitative study	TA, video recordings	Yes	scenarios. Although sample size is small (6 interns), data collection methods seem ad- equate Inferences from TA are anomented by video recordings
Haglin et al. $(2017)^{37}$	Note-entry	Mixed-methods study	Video recordings, survey,	Yes	Data collection methods seem adequate. Self-evaluations from the survey
Wilcox et al. (2010) ³⁸	Note-entry	Qualitative study	chart review Observations, interviews, TA	Yes	are complemented by video recordings and chart review. Data collection methods seem adequate. Researchers use observations to create an EHR prototype, then evaluate it with TA and semi-structured
Patel et al. (2000) ³⁹	Note-entry	Descriptive study	Chart review, interviews, EHR log data	Yes	interviews. Data collection methods seem adequate. Findings from chart review are augmented by video recordings of physicians' interaction with the EHR
Robelia et al. (2017) ³¹	Note-entry	Descriptive study	Survey	No	Findings could have been augmented by in-depth interviews with a subset of survey respondents to identify factors affecting physicians' decision obstructions to communicate in discharce summaries
Cao et al. (2003) ⁴¹	Note-entry	Descriptive study	Database search, chart re- view	Yes	Findings could have been augmented by adding clinicians' perceptions of documentation of medical errors in clinical notes with interviews or documentations.
Rizvi et al. (2016) ⁴⁰	Note-entry/note- retrieval/reading	Qualitative study	Observations, survey	Yes	survey. Data collection methods seem adequate. Findings from ethnographic observations are compared to data from a survey
Nolan et al. (2017) ³²	Note-retrieval/reading	Qualitative study	Observations	No	Findings from ethnographic observations could have been augmented by comparing researchers' notes with video recordings as demonstrated hv ⁴² .
Pain et al. (2017) ³³	Note-retrieval/reading	Qualitative study	Focus group	No	Findings from focus group interviews could have been augmented by direct observations, video recording or use of eye-tracking device to monitor the note-retrieval/reading process.
Kendall et al. (2013) ⁴²	Note-retrieval/reading	Mixed-methods study	Observations, screen record- ing, video recording	Yes	Data collection methods seem adequate. Researchers cross data from observations with screen and video recording to identify note retrieval reading strategies.

Table 2. Bias assessment of studies reviewed in detail (n=23)

(continued)

Table 2. continued					
Author	Key theme	Study design	Data collection method	Triangulation	Bias assessment
Staggers et al. (2011) ⁴³	Note-retrieval/reading Qualitative study	Qualitative study	Observations, audio record- ing, interviews	Yes	Data collection methods seem adequate. Findings from observations are augmented by audio recording of clinicians' interaction and semi-struc- tured interviews.
Callen et al. (2014) ⁴⁴	Note-retrieval/reading	Note-retrieval/reading Mixed-methods study	Interviews, focus group, observations	Yes	Data collection methods seem adequate. Findings from ethnographic observations are automethed by in-death interviews and focus arouns
Wright et al. (2016) ⁴⁵	Note-retrieval/reading Qualitative study	Qualitative study	Eye-tracker, interviews	Yes	ous contractors are argumented by an experimentation and route groups. Data collection methods seem adequate. Findings from eye tracking in nat- urelistic setting are automethod by semi-structured interviews.
Hilligoss and Zheng (2013) ⁴⁶	Note-retrieval/reading Qualitative study	Qualitative study	Observations, audio record- ing, interviews	Yes	Data collection methods seem adequate. Findings from ethnographic observations are augmented by audio recording of clinicians' interaction and semi-termented interviews
Brown et al. (2014) ⁴⁷	Note-retrieval/reading Descriptive study	Descriptive study	Eye-tracker, audio recording	Yes	and some sum out out of the seem adequate. Findings from eye tracking were commond to outfor seconding formed handloff.
Clarke et al. (2014) ⁴⁸	Note-retrieval/reading Qualitative study	Qualitative study	TA, interviews	Yes	compared to actual eccontang of anticated nativolas. Data collection methods seem adequate. Inferences from TA are aug- mented by following.
Horsky and Ramelson (2016) ⁴⁹ Note-retrieval/reading Qualitative study	Note-retrieval/reading	Qualitative study	TA, open card sorting, inter- views	Yes	Data collection methods seem adequate. Inferences from card sorting are augmented by TA and semi-structured interviews.
		-			

Abbreviations: EHR: electronic health records; TA: think-aloud protocol.

Author	Study design	Location	Clinical Setting	Type of note/process	Sample size	Summary of recommendations
Bansler et al. (2016) ²	Descriptive study	Denmark	Mixed	Mixed paper- based notes	Not specified	 Authors recommend designing EHRs that can keep the richer narrative format of clinical notes and develop solutions to convert narrative data into structured data for secondarv uses.
Miles 2006 ⁵⁰	Descriptive study	United States	Nursing home	Paper-based progress note	Not specified	 Aurhors used visual symbols to document clinicians' reasoning in pa- per-based progress notes, similar symbols can be used for representing clinicians' reasoning in FHRs.
Mukhopadhyay et al. (2014) ⁵¹	Qualitative study	Singapore	Hospital	Handoff (process)	580:MD, RN	 For donor, its the provider handing a patient over) nurses signout notes must inform the complexity of the cases and for donor residents overall management plans. On the recipient side, signout notes must inform past medical history including allergies for nurses, and management plan over the next 48 hours for residents.
Halloran and Halloran (2015) ⁵²	Descriptive study	United States	Mixed	Patient summary	Not specified	 Provides a checklist of data needed to create nursing patient summaries based on the International Counsel of Nursing - Basic Principles of Nursing Care.
Denny et al. (2009) ⁵³	Randomized case-control study	United States	Mixed	H&P	319:H&P notes	 The study is an evaluation of an algorithm (SecTag) to identify note section headers. The algorithm identified non-labeled content in several H&P notes. Most common unlabeled sections include substance abuse history, vital signs, labs and radiology, and family history. Future EHRs must provide better solutions to inform note section headers.
Hebal et al. $(2017)^{54}$	Case-control study	United States	Ambulatory	Visit note	149:Mixed notes	 Aurhors developed and evaluated a visit note template in a bowel clinic and demonstrated that the use of a template significantly increases doc- umentation and retrieval of relevant information.
Mistry et al. $(2010)^{55}$	Descriptive study	Canada	Hospital	Signout note	49:MD	 Based on data gathered from a survey notes review, authors provide a minimum data set for handoffs to inform design of electronic signout notes.
Flemming et al. $(2015)^{56}$	Descriptive study	Germany	Hospital	Handoff (process)	28:RN	 Based on cognitive psychology and HCI principles authors developed a cognitive framework to support information transfer during handoffs. They recommend the use of visual shapes (eg, squares, hexagons) and colors trepresent information relevant to communicate.
Belden et al. $(2017)^{57}$	Descriptive study	United States	Ambulatory	Progress note		 Based on usability testing of clinical note prototypes and semi-struc- tured interviews, researchers found that the APSO format coupled with collapsible note sections as more acceptable and efficient for physi- cians.

Table 3. Recommendations for EHR design from studies included in the sub-analysis (n = 9)

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objective.

pathway is divided into 5 steps: (1) clinicians start by reviewing presenting complaints/symptoms to generate disease hypotheses; (2) this is followed by a review of previous diagnoses and medical/family history to support initial hypotheses; (3) clinicians then review previous treatments to (4) determine the correlation between past and present complaints; and (5) create a mental model summarizing the clinical case narrowing the range of diagnoses and interventions. In a follow-up study,³⁰ Farri and colleagues used similar methods to verify whether exposure to time constraints impact clinicians' thought process. They observed a difference in initial steps of clinicians' reasoning between untimed and timed scenarios. In the untimed simulations, clinicians focused on (1) determining time onset and duration of current problems, and on (2) treatment length of time; whereas in the timed simulations, clinicians (1) synthesized test results to determine the progress of patient problems and (2) searched for links between test results and treatment effectiveness. After these initial steps, clinicians in both scenarios followed a similar path (3) establishing possible connections between problems and prescribed treatment, and (4) reassessed treatment effectiveness.

Clinicians' strategies for note-entry

We found 6 studies that assessed note-entry strategies. Three studies were conducted in hospital settings,^{37,38,40} 2 in ambulatory settings,^{31,39} and 1 in mixed settings.⁴¹ Intensive care unit (ICU) physicians tend to create progress notes based on data gathered from group discussions during medical rounds and patients' previous notes.³⁸ Two studies assessing use of templates for note-entry found different physicians' perspectives. While ICU physicians tend to avoid the use of templates for progress notes,³⁸ internal medicine physicians ubiquitously used templates for history and physical (H&P) notes, progress notes, and discharge summaries with several different template styles.⁴⁰

One study assessed the most common sequence of note sections used by clinicians.⁴⁰ H&P notes more frequently started with A/P (9/32, 28%), followed by 4 different completion patterns; progress notes more frequently started with either A/P (40/73, 55%) or the *subjective* (33/73, 45%) section, followed by 5 different completion patterns; and all discharge summaries observed started with either *hospital course by problem* (22/38, 59%) or *discharge diagnosis* (16/38, 42%), followed by 5 different completion patterns.

Three studies explored what clinicians communicate in their clinical notes. Patel et al.³⁹ compared handwritten visit notes with EHR notes in an endocrinology clinic and found that EHR notes contain significantly more information about *chief complaints* and significantly less information about *review of systems*. Robelia et al.³¹ surveyed 474 primary care providers and found that information more frequently reported in the discharge summaries received from hospitals include *list of diagnoses* (64%), followed by *narrative summary* (56%), and *treatment provided* (42%). *Medication list with changes* was the most important information for 94% of respondents; however, only 40% of them find this information in their discharge summaries. Cao et al.⁴¹ used a database search algorithm to assess the content of 383 500 notes including discharge summaries, signout notes, and outpatient notes and found that less than 1% of these notes communicate medical errors.

Clinicians' strategies for note-retrieval/reading

Twelve studies assessed note-retrieval/reading strategies, 9 in hospital settings^{32,33,40,42-47} and 3 in ambulatory settings.^{34,48,49} Most studies involved observations of clinicians performing note-retrieval/

reading in preparation for clinical tasks such as patient admission or pre-visit summary review. These studies reported 4 main outcomes: navigation patterns, 32-34,40,42,47,49 note/patient records content read, 43,44,47,48 time reading, 32,42,47 and stimuli to read. 33,40,44-47 Horsky and Ramelson⁴⁹ combined multiple methods to describe the sequence of information retrieved by primary care physicians in preparation for a visit, and analyzed their EHR navigation patterns. The retrieval/reading process is conducted in 3 stages: (1) clinicians review last visit's A/P; (2) they look for changes since last visit on clinical notes, discharge summaries, and test results; and (3) they search for information about the patient's current state reviewing vitals and labs. Brown et al.47 observed 10 hospitalists in a simulated hospital environment to analyze what they read and ignore, and found that when clinicians are reviewing progress notes, they frequently skim through the note or ignore some sections other than A/ P. They also found that 67% of the reading time was dedicated to the A/P section, followed by labs (8%) and medications (7%). Length of time reading a note section is not associated with the volume of data on that section.

Some studies reported that both the *navigation pattern* and the *content read* by clinicians seem to be affected by the stimuli to read. Rizvi et al.⁴⁰ observed 12 physicians performing note-retrieval/ reading at a large academic medical center and found that the sequence of note sections read is related to the stimulus or task to be performed. For example, when writing a second note, clinicians frequently start by reading the previous note from A/P, whereas when prepping for rounds, they start from the subjective section. Wright et al.⁴⁵ used an eye-tracker device to observe 20 ICU physicians and nurses performing chart review and found that what they read depends on specific goals and on what they already know about the patient. For example, when their goal is to review the status of a known patient, what to read depends on factors such as patient stability, familiarity with the patient, and planned interventions.

Recommendations for EHR design to support clinical note-entry and reading/retrieval

Nine studies that did not meet the inclusion criteria but provided relevant information about EHR design were briefly reviewed.^{2,50-57} These studies provide information relevant for both developing EHR functionality and relevant information that should be captured by such functionality. Miles⁵⁰ described a paper-based progress note that uses a set of non-standardized visual symbols. Although nonstandard, the symbols proposed can be used for representing clinicians' reasoning and would be useful for designing future clinical documentation systems that can capture what clinicians are thinking. For example, the use of a blank triangle indicates that a treatment change is being considered by the attending provider, and a black triangle indicates that the practitioner disagrees with current treatment. Mukhopadhyay et al.⁵¹ interviewed over 500 ICU residents and nurses following a patient handoff and identified that the most relevant information for donor (ie, the provider handing a patient over) nurses was the complexity of the cases, while donor residents were more concerned about the overall management plans. On the recipient side, nurses found past medical history including allergies the most useful information, and doctors found the management plan over the next 48 hours most useful.

DISCUSSION

In the present systematic review, we investigated the literature exploring how EHRs are being used to support creation and use

Key theme	Finding	Suggestion for future research
Note purposes	 Clinical care is the primary purpose for creating clinical notes in both ambulatory and hospital settings^{28,29} Non-clinical purposes are common and a source of frustration³⁴ 	 Investigate the impact of billing and other administrative requirements on note-entry and develop solutions to alleviate the documentation burden Investigate how billing and other compliance requirements (eg quality improvement, accreditation) contribute to non-clinical note purposes
Clinicians' reasoning	 Clinicians tend to judge the clinical relevance of information they communicate in their clinical notes²⁷ Clinicians' thought process for note-retrieval/reading can be represented in cognitive pathways³⁶ Cognitive pathways are affected by time restrictions³⁰ 	 Investigate what information clinicians find relevant to communicate (or not) and why Investigate how EHRs could capture and represent what clinicians are thinking about the patients and their problems, and the impact of such a representation on clinicians' situational awareness
Note-entry strategies	 The use of templates varies within and between physicians and across specialties^{38,40} What clinicians communicate can be affected by the data entry structure of EHR systems³⁹ Discharge summaries frequently miss information considered to be relevant for follow-up care³¹ 	 Investigate how EHRs can seamlessly support note- entry without forcing specific content to be added or removed Investigate information needs of clinicians and de- velop solutions to capture data needed to create more informative notes
Note-retrieval/reading strategies	 What content and in what order clinicians read are factors influenced by external stimuli, care goals, and what they already know about the patient^{33,40,45} A/P is the first and most read section of both ambulatory and hospital notes^{34,47,48} 	• Investigate how EHRs can seamlessly support note- retrieval/reading with stimulus- or goal-based user interfaces that allow a holistic view of the patient and flexible navigation across different parts of the record

Abbreviations: EHR: electronic health records; A/P: assessment and plan.

of clinical documentation. The 4 key themes identified include EHR use to support specific note purposes, how clinicians interpret their clinical cases and document their interpretation, and common strategies for note-entry and retrieval/reading. Table 4 lists the key findings. In summary, although it seems obvious that clinical notes are primarily created to support patient care, billing and other administrative drivers have become more common and are a source of frustration among clinicians.³⁴ Studies assessing clinicians' interpretation of clinical cases were less common and have mostly focused on understanding how clinicians synthesize data from the EHR to formulate their assessment and plan.³⁶ Such a thought process seems to be affected by time constraints common to fast-paced clinical settings.³⁰ The use of templates for note-entry varies substantially,^{38,40} and what clinicians communicate in their clinical notes can be influenced by the structured nature of EHRs.³⁹ What clinicians read can be influenced by external stimuli, care/information goals, and familiarity with the patient.^{33,40,45} Lastly, A/P seems to be the most relevant and most read note section in both ambulatory (eg, visit notes) and hospital (eg, progress notes) notes.

Our sub-analysis of studies that provided recommendations for EHR design revealed that visual cues that include use of symbols, colors, and syntaxes to represent note content are frequently recommended as optimal tools to facilitate clinicians' interpretation of clinical notes. Although some recommendations were derived from assessments of paper-based records, they address an important aspect of creation and use of clinical documentation, which is the representation of what clinicians are thinking.⁵⁰ In addition, some studies recommended optimal content and presentation format of specific types of clinical notes such as patient summaries,⁵² signout notes,⁵⁵ and progress notes,⁵⁷ which are of paramount importance for developing more effective clinical documentation tools.

Strengths and limitations

As with all reviews, our findings are limited by the quantity, quality, and research focus of published work. Since EHR interfaces and functionality for note-entry and retrieval/reading evolve, our conclusions may also be limited by publication date, as the findings and recommendations extracted from the studies reviewed may not stand the test of time. Although we identified 33 original research studies that assessed clinical documentation processes, only 23 assessed how EHRs are being used to support creation and use of clinical documentation, and the distribution of these studies across the key themes identified was disproportional. While 12 studies assessed note-retrieval/reading strategies, only 3 studies assessed EHR use to support clinicians' reasoning. Likely due to the often voluminous and rich collection of qualitative data, most studies applying qualitative methods such as TA protocols, interviews, and observations had moderate to small sample sizes-except for studies applying focus groups or descriptive surveys-and were often conducted in simulated environments, which compromises their generalizability. Although the subjective nature of qualitative methods may hamper the generalizability of our findings, the key themes identified allowed detailed descriptions of EHR use to support creation and use of clinical documentation as reflected in studies previously published.

Strengths of our systematic review include a rigorous search strategy of multiple databases from their inception conducted in conjunction with an expert research librarian, duplicate review at all stages of inclusion with acceptable agreement, prospective registration of the review in an international database of systematic reviews, and involvement of experts in the field.

Integration with prior work

The increasing adoption of EHR systems has contributed to the reuse of clinical documents for purposes other than patient care.^{34,58} The need to reuse data from clinical notes coupled with an increasing complexity of billing requirements has contributed not only to the proliferation of bloated notes, but also to physician burnout and frustration.⁹ The studies included in the present review confirm these findings, as they revealed clinicians' frustration with the fact that most note purposes provide little or no contribution to direct patient care. The complexity and documentation burden imposed by billing and other medicolegal requirements has been so intense that in a recent national survey of U.S. pediatricians, over two-thirds of respondents indicated the necessity of including billing/coding in the medical curriculum.⁵⁹

Previous systematic reviews assessing the methodological nature, and effectiveness of electronic tools and interventions to support patient handoffs,15-17 shared concerns about weak research designs and lack of appropriate outcomes of the studies reviewed. The studies included in the present review suffer from similar limitations. One-third of the studies included did not attempt to use multiple data collection methods, and we found no study exploring how EHRs are used to capture and represent what clinicians are thinking about the patients and their problems. A formal representation of concepts and relationships that can be used by EHRs to communicate clinicians' reasoning has the potential not only to develop more effective clinical documentation systems,^{12,13} but to decrease the overzealous alerts and reminders frequently ignored by clinicians.⁶⁰ Clinical notes are a natural source of information about a patient's "situation," as they contain clinicians' assessment of the clinical case and their plan for future interventions, and could be used to formally represent how symptoms, findings, plans, problems, therapies, and goals relate to each other.¹² Investigations of how EHRs can be used to capture and represent clinicians' reasoning are needed for developing more effective clinical documentation systems that can represent information about the patient and the situation that clinicians know but is not being captured by the EHR, and therefore cannot be communicated to other clinicians.

Implications for future research and EHR design

Clinical notes are often used for multiple purposes, which worsens the documentation burden.9,34 Decreasing such a burden will demand a combination of more effective EHR systems to support note-entry and a decreased complexity-or increased automationof billing and other medicolegal requirements. To facilitate data collection, functionality for data entry must take advantage of the digital infrastructure available today and demand less typing. Some researchers have proposed the use of conversational speech recognition (CSR) technology as a potential solution.⁶¹ Such an approach seems to be closer to fruition with some CSR solutions achieving human parity in regard to transcription error rate.⁶² However, simply capturing and transcribing the conversation between clinician and patient may not suffice. As demonstrated by our findings, clinicians' may make conscious decisions about what information to communicate in their notes. Future research should focus on understanding what information clinicians document (or not) in their clinical notes and what information they do not communicate verbally to the patient but document in their clinical notes (eg, sensitive data such as a

suspected but not confirmed tumor), so that the application of CSR could be properly adapted to handle such situations.

We found that the use of templates for note-entry is not universally accepted and varies substantially, indicating that an understanding of their impact and effectiveness is suboptimal. We also found that the structured nature of EHR interfaces seems to influence the content of clinical notes, which creates a "tension" between the need for the narrative and richer data preferred by clinicians and the need for collecting structured data for secondary uses imposed by the EHRs.⁶³

Further research is needed to develop clinical documentation systems to support note-entry that captures clinicians' reasoning and note-retrieval/reading interfaces guided by stimulus or informationseeking goals to allow a holistic view of the patient and more flexible navigation across different parts of the record.

CONCLUSIONS

Despite the widespread adoption of EHRs, their use to support note-entry and reading/retrieval is still understudied. Available evidence confirms their potential to improve creation and use of clinical documentation and to increase clinicians' situational awareness, but further research is needed to investigate approaches to capture and represent clinicians' reasoning and improve note-entry and retrieval/reading with more effective electronic clinical systems.

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CONTRIBUTIONS

TKC and JJC conceived this review. TKC conducted the literature search. TKC and JJC extracted the data. TKC led the writing of this manuscript with JJC commenting on subsequent drafts. Both authors gave their approval for the final version to be submitted and published.

SUPPLEMENTARY MATERIAL

Supplementary material is available at *Journal of the American Medical Informatics Association* online.

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