Effects of Health Information Exchanges in the Adult Inpatient Setting: a Systematic Review



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BACKGROUND: Health information exchanges (HIEs) have proliferated over the last decade, but a gap remains in our understanding of their benefits to patients and the healthcare system. In this systematic review, we provide an updated report on what is known regarding the impacts of HIE on clinical, health care utilization, and cost outcomes in the adult inpatient setting.

METHODS: We searched Pubmed, Web of Science, Embase, Cochrane, and Ebsco databases for citations published between January 2015 and August 2021. Eligible studies were English-language experimental or observational studies. We assessed risk of bias via the National Heart Lung and Blood Institute's Quality Assessment Tool for Observational Cohort and Cross-Sectional Studies.

RESULTS: We identified 11 eligible studies—1 quasiexperimental and 10 observational. Five studies examined readmission rates and 3 found benefits from HIE. Three studies examined mortality with 2 finding benefits from the availability of HIE. Eight studies examined utilization and cost outcomes with 2 finding benefits from HIE, 1 finding poorer outcomes with HIE, and the others finding no impact.

CONCLUSIONS: Evidence for the impacts of HIE remains largely observational with little direct measure of HIE use during clinical care, making causality difficult to assess. The highly variable outcomes examined by these studies limit meaningful synthesis. The strength of evidence is low that HIE reduces unplanned readmissions and mortality and there is insufficient evidence for the impact of HIE on cost or utilization. The increased number of studies specific to inpatient settings that examine objective outcomes with more rigorous statistical methods is a promising development since prior reviews.

TRIAL REGISTRATION: PROSPERO 2021 CRD42021274049 Available from: https://www.crd. york.ac.uk/prospero/display_record.php?ID=CRD420 21274049

AMENDMENTS TO PROTOCOL: Initially planned use of the Newcastle-Ottawa quality assessment scale was substituted for the National Heart Lung and Blood Institute's Quality Assessment Tool for Observational Cohort and Cross-Sectional Studies as it was better suited to evaluate the primarily retrospective observational cohort studies identified in the review.

Received September 22, 2022 Accepted October 20, 2022 Published online November 14, 2022

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J Gen Intern Med 38(4):1046–53 DOI: 10.1007/s11606-022-07872-z © The Author(s), under exclusive licence to Society of General Internal Medicine 2022

BACKGROUND

Health information exchange (HIE) involves the electronic transfer of health information between health care organizations according to nationally recognized standards.¹ The passage of the Health Information Technology for Economic and Clinical Health (HITECH) Act of 2009 provided \$14-\$27 billion for electronic health record (EHR) adoption that included a goal of national HIE.² The Medicare and Medicaid EHR Incentive Program stage 1 objectives also included requirements for EHR interoperability with a goal of improved efficiency and quality.³ The Medicare Access and Children's Health Insurance Program Reauthorization Act of 2015 and other federal policies have encouraged the continued adoption of HIE by providers, hospitals, and health systems.⁴ Despite these substantial federal investments, the return on investment of HIE has not yet been well demonstrated in the literature.⁵ The impact of HIE on outcomes in the inpatient setting in particular has not been previously reviewed.

There have been prior systematic reviews evaluating the impact of the adoption of HIE after the passage of the HITECH Act. A 2011 review found 5 relevant studies-only 2 of which included inpatient data-that examined outcomes from HIE interventions, with small or inconsistent benefits.⁶ An updated 2014 review found only 2 studies examining the effects of HIE in the inpatient setting-one study found no difference in hospital readmission rates and the other found a positive association between HIE implementation and patient satisfaction.⁷ There were significantly more studies by 2015 when a review was published by Hersh et al.⁸, but these 24 studies were conducted in multiple care settings, and none examined clinical outcomes or harms-rather, they reported uncertain reductions in healthcare utilization and costs.⁸ The most recent review examining work published in 2010 through 2017 reported a growing body of research evaluating HIE but again included studies from outpatient, emergency, and inpatient settings without a clear picture of the specific impact on inpatient outcomes.9

Since the publication of the studies examined by these reviews, there has been a significant increase in the use of HIE in the inpatient setting.^{10–14} By 2021, 86% of general acute care hospitals or 3006 facilities had adopted electronic health records meeting criteria for certification by the Office of the National Coordinator for health information technology, including the capability to electronically exchange health information.¹⁵ We seek to provide an updated report on the state of what is known regarding the impacts of HIE use specifically in the adult inpatient setting. By limiting the review to a single setting of care, we may be able to better clarify the impact of HIE. We particularly seek to update the 2014 Hersh review to summarize what might be known about the clinical impact of HIE in addition to the previously studied health care utilization and cost outcomes.

METHODS

Data Sources and Searches

A systematic review protocol was developed and registered in PROSPERO.¹⁶ A clinical informationist developed the search in PubMed which was then peer-reviewed by a second clinical informationist. The search was then translated to PubMed, Cochrane Database, Embase, Web of Science, Cumulative Index to Nursing and Allied Health Literature, ProQuest Dissertations, and Theses Global (see Appendix 3 for technical search strategies). The search was supplemented by a review of references of eligible studies. Studies of hospitalized, inpatient adults published between January 2015 to August 2021 were included, and pediatric or animal studies were excluded.

Study Selection

English language studies were included that compared the presence versus absence of HIEs in adult inpatient care settings. Comparisons could be between institutions with and without HIEs or before and after HIE implementation in single systems. Studies set exclusively in emergency or ambulatory care settings were excluded. Included studies could be randomized control trials or observational studies, but not modelling experiments, case series, or case reports. We included studies that examined clinical, economic, or population outcomes as primary or secondary outcomes but excluded studies that examined HIE impacts only on research or other nonclinical effects (e.g., user experience). Two investigators independently evaluated each study for eligibility. Disagreement was resolved by consensus after discussion.

Data Extraction and Quality Assessment

Searches were uploaded in EndNote with an initial deduplication, then uploaded into Covidence systematic review software¹⁷ where a second deduplication took place. Final deduplication took place during screening. Screening and extraction were conducted by two authors (SD and ST).

Details of included studies were extracted by one investigator using a standardized extraction tool (Supplemental 1) and reviewed for accuracy and completeness by a second investigator. Variables extracted included geographic region in which the study was done, data collection period, study design, intervention or exposure, comparison group, primary outcome, secondary outcome(s), hospital type (academic, community, other), HIE type (enterprise, state or regional, etc.), inclusion and exclusion criteria, number of study participants, any covariates, methods of statistical analysis (e.g., bivariate statistics and regressions), primary and secondary findings, whether findings favor the presence of HIE, and major study limitations (either reported or identified by the reviewers). Disagreement was resolved by consensus after discussion.

Risk of bias assessments were similarly conducted by one investigator and independently reviewed by a second investigator. The risk of bias assessment used the National Heart Lung and Blood Institute's (NHLBI) Quality Assessment Tool for Observational Cohort and Cross-Sectional Studies.¹⁸ Studies were deemed to be of "good," "fair," and "poor" quality based on investigator discussion structured by the NHLBI assessments.

Data Synthesis and Analysis

Because of the variation in HIE characteristics and outcomes examined, we determined that it was inappropriate to combine data quantitatively. We constructed evidence tables, organized data by the outcome, and critically analyzed studies to compare their findings and methods. We qualitatively synthesized the results of our included studies in a narrative format. Strength of evidence was assessed only for those outcomes examined by more than one study (otherwise, evidence of an effect was automatically considered "insufficient"). Strength of evidence assessments were conducted based on method guidelines from the Agency for Healthcare Research and Quality (AHRQ), taking into account study limitations, directness, consistency, and precision of reported effects.¹⁹

Role of Funding Source

The funder had no role in the design, execution, or interpretation of this review.

RESULTS

Of the 668 potentially relevant citations identified in our literature searches, 65 articles were selected for full-text review and 11 studies were ultimately deemed eligible for inclusion (see PRISMA diagram, Fig. 1). There were two studies that were excluded during extraction despite initially seeming to meet inclusion criteria. The first described trends in HIE usage and hospital readmission rates around an unrelated intervention, but did not compare the presence versus absence

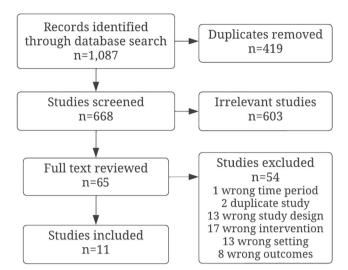


Figure 1 Flow diagram summarizing study selection process.

of HIE.²⁰ The other study was excluded as the analysis included both inpatient and outpatient data that could not be separated.²¹ Another study had several analyses partially excluded for the same reason, but those inpatient analyses reported separately were included.²² Two studies were included that examined the effects of HIE based outside the inpatient setting (in the emergency department and a skilled nursing facility) because they both reported the effects of these HIEs on subsequent inpatient outcomes.^{23,24}

Study characteristics are described in Table 1. The most common study design was a retrospective cohort; only 1 study was a randomized control trial. Most of the studies included patient data from one or more of the 10 US states (AR, CA, FL, IA, MA, MD, UT, VT, and WA). There were 2 studies from Israel and 1 from South Korea. Half of the studies examined multiple hospitals. Studies included a wide range of patient populations, ranging from patients newly admitted to inpatient units, (58%, 7 studies), to those recently discharged from inpatient units (17%, 2 studies) to patients following transfer to a different acute care hospital (25%, 3 studies). The majority of studies were not limited to specific diagnoses; however, one study only included patients admitted after myocardial infarction and another was limited to admissions related to six common conditions tracked by CMS (diabetes, asthma, myocardial infarction, congestive heart failure, chronic kidney disease, and hip fracture).

Of the 11 studies included, 3 were deemed of good quality (or low risk of bias), 6 were of fair quality, and 2 were deemed of poor quality. One poor-quality study was solely described in an abstract with insufficient detail to evaluate the methods. Another poor-quality study had an unclear methodology and therefore was deemed to be at high risk of bias.

Eight of the 11 studies reported healthcare utilization or cost outcomes, as described in Table 2. Five studies specifically examined readmission as an outcome—which we considered a distinct category of utilization as it is an important quality indicator used to evaluate hospitals.³³ Four studies reported

clinical outcomes including in-hospital mortality, discharge destination, and adverse drug events.

There were no clear trends between the outcomes reported and patient population or geographical region. There were slightly more net positive effects of HIEs reported by studies based on multi-hospital data versus single-hospital studies. There were two studies that verified actual usage of HIE at the time of admission—versus just noting the presence of HIE capabilities—and both reported significant reductions in unplanned readmissions when HIE was present and utilized.^{24,32} Neither study quantified how much HIE was utilized, however, but just reported it as a dichotomous variable if practitioners had opened the HIE software.

Readmission Rates

The reported effects on readmission rates were mixed but showed an association between HIE and reduced readmission rates in half of the 9 analyses conducted by 5 studies. One study found that fragmented readmissions (i.e., when a patient is readmitted to a different hospital) were also reduced when HIE was present.²⁶ Two of the five studies that examined 30day readmissions found a statistically significant reduction in rates when HIE was available compared to when it was not available. However, one of those studies only found a statistically significant reduction in readmissions when singlevendor HIE was present (i.e., multiple members of a health system exchanging information across a single vendor's EHR platform) compared to no HIE (-0.8%, p=0.04), but not in the presence of enterprise HIE (i.e., the exchange of information across different EHR platforms by members of the same healthcare system) compared to no HIE (-0.4%, p=0.06).³² The other study that found a significant reduction in 30 day readmission rates at hospitals with HIE (-1.3%, p<0.01) also reported a statistically significant reduction in readmission rates at 45 days (-1.1%, p<0.05) and at 60 days (-0.9%, p < 0.1).²⁶ Another large analysis found the odds of readmission within 7 days to be significantly lower (-6.5%, p < 0.001, OR 95%CI 0.90-0.97) when ED physicians accessed HIE prior to admission compared to when they did not.²⁴ In contrast, a small study of patients discharged to skilled nursing facilities found no difference in readmission rates at 7, 14, or 30 days when HIE with the discharging hospital was enabled.²³ There was also no significant difference found in 30-day readmission rates among Medicare patients discharged from hospitals with or without HIE.²⁷

Clinical Outcomes

There were very heterogeneous clinical outcomes examined in 9 analyses across 5 studies. Two studies found lower odds of inpatient mortality and lower hazard ratio of 90-day mortality when HIE was present (OR=0.75, p<0.001, 95%CI 0.64–0.88; OR 0.68, p<0.001, 95%CI 0.49–0.78; and HR=0.78, p<0.001, 95%CI 0.57–0.86, respectively).^{30,31} In contrast, another study of myocardial infarction survivors found no

Assessment
Bias
of
Quality/Risk
Including
Studies
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Characteristics
Table 1

Study ID	Study design	Geographic area	Hospital type	Study population criteria	Data collection period	Patient population size	Quality assessment
BenAssuli 2015 ²⁴	Observational-cohort Israel	Israel	Multiple, HMO participants	Patients admitted from the emergency department	2004-2007	340,804	Fair
Boockvar 2017 ²⁵	Experimental-RCT	USA (NY)	Single Veterans Affairs Hospital	wint creating study Patients admitted to non-ICU unit at the veterans' affairs hospital who also had a record in the Bronx Regional Health Information Organization system and agreed to participate (note: 48%	2012–2014	381	Fair
Chen 2019 ²⁶	Observational-cohort	USA (FL)	Multiple	decunied) Patients admitted to hospital after myocardial	2011-2014	83,458	Good
Cross 2019 ²³	Observational-cohort	NSA	Single academic center	Patients discharged to specific skilled nursing	2013-2017	8825	Fair
Daniel 2018 ²⁷ Flaks-Manov 2016 ²⁸ Park 2015 ²²	Observational-cohort Observational-cohort Observational-cohort	USA Israel South Korea (Seoul)	Multiple Multiple, HMO participants Single academic center	Medicare patients admitted to acute care hospital Patients discharged after acute hospitalization Patients referred to tertiary care hospital by	2006–2012 2010 2009–2010	100,000 27,057 461^{*}	Poor Good Fair
Rome 2019 ²⁹	Observational-cohort USA (MA)	USA (MA)	Single academic center	primary care provider Patients transferred from community hospital to general medicine, oncology or cardiology at a	2016 & 2018	201	Fair
Usher 2016 ³⁰ Usher 2018 ³¹	Observational-cohort Observational-cohort	USA USA (NY, FL, IA, 11T, and VT)	Single academic center Multiple	tertuary care hospital Patients transferred to study hospital Patients transferred between acute care hospitals	2011–2015 2011–2013	9873 130,539	Poor Fair
Vest 2019 ³²	Observational-cohort	USA (AR, CA, FL, IA, MD, NY, and WA)	Multiple, non-federal hospitals that belonged to a healthcare system	Patients admitted to units other than labor & delivery, survived to discharge, and total length of stay <50 days	2010-2014	7,956,515	Good
Abbreviations: RCT. 1	andomized control trial:	Abbreviations: RCT. randomized control trial: HMO. Health Maintenance organization	ce organization				

Abbreviations: RCT, randomized control trial; HMO, Health Maintenance organization *This represents patient population of inpatient analyses only, not including outpatients Length of stay (after transfer)

Length of stay (after readmission)

Outcome	Study ID	Effect of HIE presence vs absence	Significantly favors HIE?
Unplanned readmissions			
7 days	BenAssuli2015	-6.5% difference (OR 95%CI 0.90, 0.97)	Yes
•	Cross2019	No difference $(-1.2\%, p=0.548)$	ND
14 days	Cross2019	No difference $(+3.7\%, p=0.136)$	ND
30 days	Chen2019	-1.3% (DD p<0.01)	Yes
2	Cross2019	No difference (+2.2%, $p=0.431$)	ND
	Daniel2018	No difference (OR 95%CI 0.97, 1.07)	ND
	Vest2019	-0.8% difference (<i>p</i> =0.044)*	Yes
45 days	Chen2019	-1.1% DD (p<0.05)	Yes
60 days	Chen2019	-0.9% DD (p<0.1)	Yes
Quality of care		u /	
Medication discrepancies found [†]	Boockvar2017	No difference (β =0.6 95%CI -0.27, 1.5)	ND
Adverse drug events	Boockvar2017	No difference (OR 95%CI 0.49, 2.1)	ND
Inpatient mortality	Chen2019	No difference (DD + 0.2% , $p>0.1$)	ND
	Usher2016	OR 0.68 (95%CI 0.49, 0.78)	Yes
	Usher2018	OR 0.75 (95%CI 0.64, 0.88)	Yes
90-day mortality	Usher2016	HR 0.78 (95%CI 0.57, 0.86)	Yes
Discharge destination not home [‡]	Chen 2019	No difference (DD + 0.3% , $P>0.1$)	ND
Diagnostic discordance [§]	Usher2018	OR 0.83 (95%CI 0.77, 0.90)	Yes
Utilization & cost			
Single-day admissions	BenAssuli2015	-9.5% difference (OR 95%CI 0.88-0.95)	Yes
Number of procedures per stay	Chen2019	+0.241 DD (p<0.001)	No
Total charges per stay	Chen2019	+\$4569 DD (p<0.001)	No
0 F	Usher2018	No difference (mean \$81,603 vs. \$95,170)	ND
Repeat imaging	Rome2019	No difference (OR 95%CI 0.32, 1.36)	ND
Length of stay (index)	Chen2019	+0.248 days DD (p<0.001)	No

Abbreviations: HIE, health information exchange; DD, difference in difference; ADE, adverse drug event; OR, odds ratio; CI, confidence interval; ND, no statistically significant difference

-3.0 days (p < 0.01)

No association (p=0.47 for model) No difference (-6%, p=0.16)

No difference (mean 10.6 vs. 11.0 days)**

No difference for different hospital readmissions (p>0.05)

*For single-vendor HIE only; difference was not significant for enterprise HIE (-0.3%, p=0.095)

Flaks-Manov2016

[†]The number of medication discrepancies identified during pharmacist review after admission (more = higher quality care)

^tDischarge to site other than home (e.g., skilled nursing facility)

 $^{\$}$ The loss of a diagnostic code during a hospital transfer (more is considered poorer quality care)

Study authors labelled single-day admissions as inappropriate or low-quality admissions

Daniel2018

Park2015

Usher2018

Usher2016

¹Mean charges when both transferring and accepting hospitals had HIE vs. neither had HIE (standard deviations \$102,287 and 133,921, respectively). Calculated after log transformation of raw data

**Mean length of stay when both transferring and accepting hospitals had HIE vs. neither had HIE (standard deviations 10.8 and 14.1 days, respectively). Calculated after log transformation of raw data

significant difference in the odds of inpatient mortality when HIE was present.²⁶ There was also no difference in the odds of an adverse drug event or in the likelihood of identifying a potentially harmful medication discrepancy when HIE was present according to a single randomized control trial.²⁵ One study reported a statistically significant decrease in odds of "diagnostic discordance"-defined as the loss or acquisition of a diagnosis code following interhospital transfer-when HIE was available. However, this was a new outcome created by the authors that has not been widely studied in the hospital setting.31,34

ND

ND

ND

Yes

ND

Health Care Utilization and Cost

Of the 11 analyses from 8 studies reporting on health care utilization and cost outcomes, 6 found no difference in total

Outcome	No. of studies	Finding and direction of effect	Strength of evidence
Unplanned readmissions	5	2 good-quality studies, 1 study of fair quality favors HIE. 1 poor and 1 fair-quality study found no effect	Low (reduced rate of unplanned readmission)
Mortality (inpatient or 90-day)	3	1 fair and 1 poor-quality study favor HIE. 1 good-quality study found no effect.	Low (reduced inpatient or 90-day mortality)
Length of stay (index or after readmission or transfer)	6	1 good-quality study found longer stays with HIE. 1 good, 2 fair, and 1 poor-quality studies found no difference. 1 poor-quality study found reduced length of stay.	Insufficient evidence
Charges per stay	2	1 good-quality study found higher cost with HIE, one fair-quality study found no difference	Insufficient evidence

Table 3 Strength of Evidence Assessment

Abbreviations: HIE, health information exchange

charges,³¹ repeat imaging rates,²⁹ or length of stay,^{22,27,28,31} when HIE was present compared to when HIE was not available. One study reported 3 analyses that found that when HIE was present there were statistically significantly greater total charges (+\$4569, p<0.001), longer length of stay (+0.248 days, p<0.001), and increased number of procedures per admission (+0.241 procedures, p<0.001).²⁶ In contrast, one study found a significant reduction (-9.5%, p<0.001, 95%CI 0.88–0.95) in odds of single-day admissions (considered by the authors to be markers of low quality), and another reported a significant reduction in length of stay after transfer (-3.0 days, p<0.01) when HIE was available compared to when it was not available.^{24,30}

DISCUSSION

In this systematic review, we analyzed 11 studies evaluating the impact of HIE availability in the inpatient setting on patient and health system outcomes. Heterogeneous clinical outcomes across studies were difficult to compare; however, most studies found a decrease or no impact on patient mortality rates. Utilization and cost outcomes were less likely to show benefits from HIE. It was uncommon for studies to account for the actual use of HIE by providers rather than just HIE presence or absence.

Overall, the body of evidence around the effects of HIE on inpatient hospitalizations remains limited (Table 3). We would conclude that there is low strength of evidence that HIE is associated with a reduction in unplanned readmission rates. There is also low strength of evidence that HIE may reduce inpatient or 90-day post-discharge mortality rates. There is insufficient evidence to determine whether HIE is associated with length of stay or other measures of utilization or cost. We found no studies examining potential harm from HIEs.

Compared to prior systematic reviews of research on HIEs, we found several promising developments in the literature. First, there is more focus on clinical outcomes including patient mortality and morbidity. Second, though the vast majority of reviews remain observational, there has been a greater effort to statistically control for covariates affecting outcomes such as patient complexity or diagnosis-related group. Third, a few studies have even begun examining the actual use of HIE, rather than just the presence or absence of HIE at the hospital or system level. These studies still only consider HIE use as a dichotomous variable, however, and do not capture the amount of use, how it was used, or how the information obtained impacted clinical decision-making. Notably, these two studies that did consider actual use found that HIE use by providers was associated with modest reductions in odds/ probability of readmission. Fourth, and finally, one study did compare the impacts of enterprise versus single-vendor HIEs—a comparison that warrants further investigation going forward as hospitals select information exchange strategies.

Since the last major review was published, the proportion of US hospitals performing all four domains of interoperability

(e.g., send, receive, find, and integrate patient information) has more than doubled from 23% in 2014 to 55% in 2019.¹⁴ In 2019, three-quarters of hospitals reported electronically finding patient health information from sources outside their health system—53% of hospitals specifically used state, regional, or local HIE to do so.¹⁴ In early 2022, the Office of the National Coordinator released the long-awaited Trusted Exchange Framework and Common Agreement providing governance for nationwide healthcare information exchange that was mandated with the passage of the 21st Century Cures Act in 2016.³⁵ These efforts have been reflected in a similarly expanding body of research on HIE over the past 6 years. Our review provides a timely update on the state of the research on how HIE impacts patient and healthcare system outcomes.

Limitations

Our review has several limitations. First, the reported findings are limited to evaluations that appear in published literature. Second, most of the published studies we reviewed were exclusively observational with rare measurements of actual HIE use rather than just the presence or absence of HIE at the hospital or healthcare system level. Consequently, it is impossible to examine the strength of the effect of HIE if it is used more versus less, and so it is difficult to assess causality. Additionally, as previously mentioned, many studies relied on the same data sets such as the American Hospital Association Information Technology Supplemental Survey and the Healthcare Cost and Utilization Project Database. Finally, there were highly variable outcomes studied, so it is challenging to synthesize and come to conclusions about the evidence.

That the current state of the literature does not allow for a quantitative analysis of the impacts of HIE on the adult inpatient setting should be concerning to researchers in this field. If the goal is for sound evidence to inform policy decisions for health systems and governments to shape future HIE efforts, then future research efforts need to be selective in study design. In the future, to assess the impact of HIE, we would advocate for a more standardized selection of outcomes. It will improve the body of evidence around HIE as clinical and health care utilization outcomes are examined across multiple studies. The most common outcomes studied thus far that could be examined further include 30-day readmission rates, inpatient and post-discharge mortality, length of stay, and total charges or cost of admission. Additionally, given that HIE is now quite widespread-and in order to better establish associations between HIE and certain outcomes-we recommend that future studies try to incorporate more direct measures of HIE use by providers rather than just the presence or absence of HIE capabilities. Finally, there should be a greater examination of the effects of different types of health information sharing, such as the use of enterprise HIE versus single EHR vendor-driven data sharing to inform future policy and hospital strategizing.

CONCLUSION

There is low strength of evidence suggesting that HIE availability reduces unplanned readmission rates and possibly mortality. There is insufficient evidence for the impact of HIE on other clinical, cost, or utilization outcomes. To further our understanding of the impact of HIE, future studies need to select consistent outcomes, measure HIE use, and diversify the sources of hospital and exchange data.

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Supplementary Information The online version contains supplementary material available at https://doi.org/10.1007/s11606-022-07872-z.

Funding Dr. Dupont's work on this project and paper was supported in part by the Health Resources and Services Administration (HRSA) of the US Department of Health and Human Services (HHS) under grant number D33HP31669 and title "Preventive Medicine Residencies" for \$1,936,878. This information or content and conclusions are those of the author and should not be construed as the official position or policy of, nor should any endorsements be inferred by HRSA, HHS, or the US Government.

Dr. Turbow is supported in part by the Program for Retaining, Elevating, and Supporting Early Career Researchers at Emory (PeRSEVERE) from the Emory School of Medicine, a gift from the Doris Duke Foundation, and through the Georgia CTSA NIH award (UL1-TR002378).

Declarations:

Conflict of Interest: The authors declare that they do not have a conflict of interest.

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