

Dr. Krasowski



**ICD 10** Certain infe

Certain mie
Intestinal in
A00 Choler
ADT Tunhal
A02 Other s
A02 Other s A03 Shigeli A04 Other b A05 Other b A06 Amoeb
A04 Other b
A05 Other h
A06 Amoeh
A07 Cithorn
A07 Unier p
AUG Virai ai
A06 Amoeb A07 Other p A08 Viral ar A09 Diarrho Tuberculosi A15 Respira A16 Respira
Tuberculosi
A15 Respira A16 Respira A16 Respira A17† Tuber A18 Tuberc A19 Miliary
A16 Respira
A17† Tuber
A18 Tuberc
A 19 Miliary
A20 Plague A21 Tularae A22 Anthra
QA21 Tularae
A22 Anthra:
A22 Anthra A23 Brucell
A24 Glande
A25 Rat-bit
A27 Land
CA27 Leptos
OA28 Other z
A30 Lepros
či etio
de ario
em
ic.o
<u>_</u>
р.
8
Õn l
n/
om/critica
-Ti-
0
Iva
lues/
0
art
<u>c</u>
icle/9/
0/
/9/1
1
/1/24/18
5
<u></u>
ö 💴
Ň
32
02322
by
gue
le
tst
to
¥
_
16
16 A
A
bn
<u> </u>
St
N)
<u>10</u>
ıst 2022

By Matthew D. Krasowski, MD, PhD

10.1093/crival/vav003

# Data Mining to Improve Laboratory Utilization and Patient Care

All and a set of the s	Actors) ars colons contactions contactions contraction teriologically confirmed b teriologically confi	itic diseases (A00 Home Show	edical Record Sys	
All information Patient Name ations Best all information Doctor : Operative Note : Net Net Search HN Name Doctor Search HN Name Doctor Search	All information HN: Save Patient Name Quit Diagnosis Doctor : Doperative Note : Health Care Calendar Schedule Appointment Schedule	9)	and the second se	
nas cations less ai infection lagrons is unsurance Diagnosis Doctor : Diagnosis Doctor : Medical History Health Care Calendar Schedule Appointment Schedule Appointment Search HN Name Doctor Search	Insurance Patient Name Quit Diagnosis Doctor : Diagnosis Doctor : Operative Note : Medical History Health Care Calendar Schedule Appointment Search HN Name Doctor	Edit		
Personal Information Infectio Doctor Infectio Doctor Infectio Search • HN • Name • Doctor Infectio Search • HN • Name • Doctor Infectio	Personal Information Personal	THINK	Insurance	
al infection presumer plogically infined by 20-A28) B, not ets	al infection presumer plogically infined by 20-A28) Search HN Name Doctor Search Appointment Search Search	ations Patient Name Quit	Diagnosis	Personal Information
A28) Upperative Note : Medical History Health Care Calendar Schedule Appointment Search HN Name Doctor Search	A28)	Contra .	Treatment	
Bigs     Schedule       Appointment     Bigs       Bigs     Bigs       Search     HN       Name     Doctor       Search     HN	Bit     Schedule       Appointment       Bit       Search       HN       Name       Doctor       Search		Medical History	O Nex O Person
A28) Search IN Name Doctor	A28) Search IN Name Doctor		Health Care Calendar	
28) Comparison Search O HN O Name O Doctor Search	28) Under Search HN Name Doctor	i b.		
Addess Search  HN Name Doctor Search	No.A28) Search • HN • Name • Doctor		and the second se	
Search HN Name Doctor	Search HN Name Doctor	A20-A28)	Ownegati	
s, not els	s, not els		Address	
s, not els	s, not els		Belephon	a mumbler
s, not els	s, not els	Convolution LINI	COLUMN STOCKED	A
		Search CHIN	Name Doctor	(manual Chinese) Chinese (Chinese)
			Search	
eria	eria	es, not els		
		Ella		
			1 1	
			1 1	
6-2				
(TT)				

Laboratory testing is an integral part of modern medicine, with results influencing diagnosis, prognosis, and therapy. A number of published studies have focused on problems with laboratory utilization ("mis-utilization") and interventions to improve test ordering,<sup>1,2</sup> including over-utilization (ordering too many tests), under-utilization (not ordering clinically indicated testing), and ordering incorrect testing. Inappropriate test utilization can have a variety of adverse consequences, including iatrogenic blood loss, missed diagnoses, patient anxiety, unnecessary referrals, need for additional diagnostic tests, and patient financial liability for unreimbursed test costs. With a growing focus on healthcare costs, clinical laboratories are often tasked with improving laboratory utilization, while also remaining conscious of ensuring patients receive the appropriate testing for optimal patient care. The focus on laboratory test utilization has primarily been on two major categories of testing.<sup>1</sup> The first is high-volume, automated tests such as complete blood count and routine chemistry tests. Common interventions to tackle over-utilization of high-volume tests include limits on repetitive ordering, providing information to providers on ordering patterns and costs, and posting price information for tests in the electronic health record (EHR). The second category of testing that is often targeted is low-volume but very high-cost orders such as panels of genetic tests. These tests may have direct costs of thousands of dollars and sometimes poor reimbursement by health insurance. Frequent strategies for managing high-priced esoteric testing include requiring pre-approval prior to ordering (by pathology or other designated group) and limitation of certain tests to specific medi-



cal specialties. Some institutions have developed "laboratory test formularies" (following a model commonly employed by pharmacies), with a formal process for placing tiered restrictions on specific tests.

# **Getting the Data**

Hospital EHRs and laboratory information systems (LISs) contain large amounts of data that can potentially be analyzed to improve utilization of laboratory testing. Yet, a major challenge is the availability of tools that can mine data from the EHR, LIS, and other data sources. Commercial EHR and LIS software typically has modules for performing queries of data, although these can vary greatly in functionality and ease of use. With respect to laboratory data, common applications include determination of test-ordering patterns (e.g., "who is ordering specific tests and from what clinical areas") and turnaround time for testing. Clinical laboratory staff and management might not have direct access to EHR and LIS query tools or be required to request specific queries from informatics staff. Most EHR and LIS reporting tools work well for relatively simple requests, but more complicated queries can exceed the ability of standard reporting tools, particularly when questions involve the intersection of laboratory testing with other data (e.g., admission/discharge/transfer records, medical diagnoses, radiology results, and medication records).

Over the past five years, pathologists and laboratory management within the Department of Pathology at the University of Iowa have been involved in multidisciplinary efforts at the University of Iowa Hospitals and Clinics (UIHC) to improve laboratory test utilization.<sup>3</sup> To this end, we have extensively utilized tools from the EHR, LIS, and, more recently, a data warehouse to identify mis-utilization that may be amenable to interventions. With respect to high-volume tests, analysis of ordering patterns using the EHR indicated that there was substantial over-utilization on inpatient units. Two of the clearest examples were serum albumin and erythrocyte sedimentation rate (ESR), laboratory parameters that change relatively slowly (albumin over several weeks and ESR over days). Nearly 20 percent of albumin orders were repeats within 24 hours of a previous order. Similarly, 25 percent of ESR orders were repeats within 48 hours of a previous order. Modifications to the maximum repetitive order frequencies available in a single electronic order by provider had dramatic impacts of test volumes for albumin (36 percent decline), ESR (17 percent decline), and a number of other common chemistry and hematology tests. Overall, the order volume of high-frequency tests (adjusted for patient days) declined by 8 percent.<sup>3</sup>

As an example of incorrect ordering, we saw fivefold increases in test volumes for 1,25-Dihydroxyvitamin following implementation of a new EHR for UIHC in 2009.3 The routine test for assessment of vitamin D nutritional status is 25-hydroxyvitamin D, whereas 1,25-Dihydroxyvitamin D has much narrower clinical indications and is not a good marker of nutritional status. An analysis of test-ordering patterns indicated that increased orders were coming from multiple clinical areas and patient populations. Investigation revealed that a major problem was that dozens of electronic order sets had the wrong vitamin D test inserted in the transition to the new EHR. Correction of these order sets, coupled with education of ordering providers, reduced 1,25-Dihydroxyvitamin D ordering to the previous baseline. Following this issue, all electronic order sets involving laboratory testing now undergo review by pathology prior to being loaded into the EHR production system.

We also found other examples of mis-ordering between tests with similar names ("look-alike" tests). One striking example was mis-ordering of serum manganese for magnesium.<sup>3</sup> Prior to any intervention in the EHR, approximately 10

percent of manganese orders appeared to be mis-orders in which magnesium was the intended order. Introduction of a warning prompt and "hard stop" in the EHR when a provider attempted to order serum manganese reduced mis-orders to a very low percentage (less than 1 percent).

The utilization examples above were addressed using standard reporting tools in our EHR and LIS. In these examples, knowledge of ordering patterns that included basic information such as ordering providers, clinical area, and patient demographics were sufficient to identify the problems. Limited chart review further defined the issue where needed.

### Use of a Data Warehouse

Nevertheless, we realized that some questions simply could not be readily addressed with our existing EHR and LIS tools. Fortuitously, our medical center had been investing in a collaboration with a private company to create a 'data warehouse' that combined data from the EHR, hospital admission/discharge/transfer, pharmacy systems, and billing records.<sup>4</sup> The software has a graphical interface that allows users to generate queries without having detailed knowledge of computer code. The queries have a built-in Health Insurance Portability and Accountability Act log-in step, with data access logs capturing interrogation of patient data. With this system, we began to tackle more difficult questions.

One example was the issue of how often serum angiotensin converting enzyme (ACE) levels (typically ordered as part of the workup for possible sarcoidosis) were ordered in patients on ACE inhibitor drugs.<sup>5</sup> It was well known in the literature that ACE inhibitors profoundly lower ACE levels (and thus make them unreliable for sarcoidosis workup); however, many providers might be unaware of this interaction. To identify how often ACE levels are ordered in patients on ACE inhibitor therapy is not easy in standard EHR reporting tools. In our own EHR, there were more than 100 ACE inhibitor varieties (different drugs, doses, combination of drugs) in the pharmacy formulary, each of which would comprise a separate search item in the reporting system, leading to very long search times. In the data warehouse, the search was much simpler. Pharmacy data could be searched with a standard nomenclature (SNOMED), with a single search item capturing all ACE inhibitor formulations. Once completed, a query covering five years of data took less than a minute and revealed that nearly 10 percent of serum ACE orders occurred in patients on ACE inhibitors at UIHC. Collaboration with a national reference laboratory identified that a similar percentage of mis-utilization applied to samples for ACE level analysis from hospitals throughout the United States. Education of healthcare professionals and interventions in the EHR dramatically lowered the incidence of ACE level ordering for patients on ACE inhibitors.<sup>5</sup>

Further use of the data warehouse has assisted us with other difficult queries, such as estimated number of patients with positive blood cultures in the setting of neutropenic fever. This type of query involves several areas of clinical and laboratory data (e.g., fever from flow sheet records, neutropenia, timeframe, and laboratory diagnosis of pathogens filtering out contaminants). Searches using the EHR alone are very time-consuming and difficult.

# **Involvement of Pathology Residents and Fellows**

Lastly, we have found that pathology residents and fellows are very helpful in projects involving laboratory test utilization. Many of the projects cited above were part of management/quality improvement projects for our trainees.<sup>3-5</sup> Our residency curriculum now includes sessions on data mining, spreadsheet analysis, and analyzing research data. Residents and fellows can be invaluable in data analysis and also the more time consuming task of chart review. Although data mining tools can be powerful, many questions still require some degree of chart review.

It is important to keep in mind that the most important goal is to provide the appropriate testing for optimal patient care. Eliminating unneeded tests can minimize iatrogenic blood loss, unnecessary work-up of false positive results, and patient anxiety. Preventing mis-orders or under-utilization can maximize chance of accurate diagnosis and management. Utilization interventions should be accompanied by monitoring of quality measures (e.g., length of stay, mortality, adverse events) to identify and avoid unintended consequences. Overall, it takes a coordinated effort to detect mis-utilization and implement strategies to improve use of laboratory testing. Clinical laboratory professionals are in a unique position to work collaboratively as leaders in utilization management.

#### References

- Huck A, Lewandrowski K. Utilization management in the clinical laboratory: an introduction and overview of the literature. *Clin Chim Acta* 2014; 427111-117.
- Warren JS. Laboratory test utilization program: structure and impact in a large academic medical center. *Am J Clin Pathol* 2013; 139(3):289-297.
- Krasowski MD, Chudzik D, Dolezal A, et al. Promoting improved utilization of laboratory testing through changes in an electronic medical record: experience at an academic medical center. *BMC Med Inform Decis Mak* 2015; 1511.
- 4. Krasowski MD, Schriever A, Mathur G, et al. Use of a data warehouse at an academic medical center for clinical pathology quality improvement, education, and research. *J Pathol Inform* 2015; 645.
- Krasowski MD, Savage J, Ehlers A, et al. Ordering of the Serum Angiotensin-Converting Enzyme (ACE) Test in patients receiving ACE inhibitor therapy: An avoidable but common error. *Chest* 2015; 148(6):1447-1453.

Dr. Krasowski is a Clinical Associate Professor and Director of Clinical Laboratories in the Department of Pathology at the University of Iowa Hospitals and Clinics, Iowa City, Iowa.