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6	3 4	Evaluation of Inappropriate COVID-19 RT-PCR Test Utilization at an academic medical center
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> Abstract **Background:** An evolving COVID-19 testing landscape and issues with test supply allocation, especially in the current pandemic, has made it challenging for ordering providers. We audited orders of the Xpert® Xpress SARS-CoV-2 RT-PCR platform-the fastest of several other testing modalities available—to illuminate these challenges utilizing a multidisciplinary laboratory professional team consisting of a pathology resident and microbiology lab director. **Methods:** Retrospective review of the first five hundred Xpert[®] Xpress SARS-CoV-2 RT-PCR test orders from a 2-week period to determine test appropriateness based on the following indications: emergency surgery, emergent obstetric procedures, initial behavioral health admission, and later including discharge to skilled care facilities and pediatric admissions. Our hypothesis was that a significant proportion of orders for this testing platform were inappropriate. **Results:** Upon review, a significant proportion of orders were incorrect, with 69.8% (n=349, p<0.0001) not meeting indications for rapid testing. Of all orders, 249 designated as emergency surgery were inappropriate, with 49.0% of those orders never proceeding with any surgical intervention; most of these were trauma related (64.6% were orders associated with a trauma unit). **Conclusions:** Significant, pervasive inappropriate ordering practices were identified at this center. A laboratory professional team can be key to identifying problems in testing and play a significant role in combating inappropriate test utilization. **Impact statement:** In the current pandemic, subject to an evolving testing landscape with frequent changes in recommendations for testing, providers may be especially challenged to order the

52 correct tests. At an academic center, we audited COVID testing of the rapid RT-PCR platform and 53 found that a significant proportion were misordered, suggesting the need for test utilization 54 guidance. Inappropriate laboratory utilization, which has the potential for patient harm and 55 contributes to rising healthcare costs, can be targeted through audits like these that utilize a multi-56 faceted, physician and laboratory teamwork-based approach.

58 Introduction

In the US, the "Choosing Wisely" campaign has embodied lab utilization efforts aimed at developing sustainable processes to decrease inappropriate laboratory testing and its downstream effects on patient care and healthcare costs^{1,2,3}. The causes of inappropriate testing in laboratory medicine are complex, but can be partially attributed to the rapidly evolving test platforms and guidelines that make appropriate ordering choices challenging for providers^{1,4}. The COVID-19 pandemic is an embodiment of these fast-paced changes in testing, and with this in mind, we chose to analyze COVID-19 ordering practices at our academic medical center in an effort to illuminate challenges in ordering practices and contribute to the growing lab utilization management literature.

There are six different COVID-19 testing platforms available at this academic center, among which is the GeneXpert Xpert® Xpress SARS-CoV-2 (Cepheid; Sunnyvale, CA) real-time reverse transcription polymerase chain reaction (RT-PCR) intended for qualitative detection of nucleic acid from SARS-CoV-2 in upper respiratory specimens from individuals suspected of COVID-19 infection. At this academic center, the GeneXpert (GX) assay that has the most rapid turnaround time of the various platforms (1 hour vs 6-24 hours). Testing for COVID-19 is routed between the GX and the five other platforms based on the medical indication selected by the ordering physician. For example, emergent indications routed the specimen to the GX whereas non-emergent indications may route to a batched testing platform with a 24 hour turnaround time. The decision to specifically target the GX platform of testing was based on the following: 1) as the fastest platform, this assay was most susceptible to inappropriate ordering as physicians tried to expedite test results, 2) this platform had a limited supply for testing based on test allocation, and 3) both the laboratory director and pathology residents on service identified frequent physician requests to change their COVID-19 order to this rapid GX platform. The decision was made to review the first 500 tests ordered in a two-week period and determine test appropriateness based on review of the electronic medical record for each patient and hospital consensus guidelines for testing. We hypothesized that there would be a mismatch between the order indication selected that would route to the GX platform and the actual indication for testing.

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3 4	88					
5 6	89	89 Materials and Methods				
7 8	90	Study setting and patients				
9 10 11 12 13 14 15 16 17 18 19 20 21 22 23 24	91	This study was submitted to and approved by the University of Maryland, Baltimore Institutional				
	92	Review Board as Exempt under protocol number HP-00094270. The GX test went live for				
	93	limited testing on 3/29/2020 until the initial algorithm for COVID-19 testing was implemented				
	94	on 6/1/2020, which linked order indications selected for testing to the appropriate test platform.				
	95	Test orders were part of a check box selection with no free text option in the electronic medical				
	96	record. Indications that lead to rapid testing on the GX were acute emergency surgery, emerge				
	97	obstetric procedures, initial behavioral health admissions, and ICU admission, with all other				
22	98	indications deemed non-urgent and placed on high-throughput batched testing. Our study period				
24 25 26 27 28 29 30 31 32 33 34	99	followed the updated COVID-19 testing algorithm that went live 11/3/2020, which was				
	100	developed by hospital system incident commend for influenza season. The International Disease				
	101	Society of America (IDSA) makes no strong recommendations for or against use of rapid tests				
	102	versus standard or batched RT-PCR testing. The IDSA conditionally recommends RT-PCR				
	103	testing in symptomatic individuals suspected of having COVID-19; however, testing platforms				
	104	and turnaround times are determined by the clinical laboratory in conjunction with clinical				
	105	stakeholders. For this study, the Cerner Millenium laboratory information system database was				
35 36	106	queried for patients who had GX orders placed between 11/23/2020 to 12/7/2020. Over the two-				
37 38	107	week study period, the first five hundred tests that routed to the GX were reviewed by a				
39 40	108	multidisciplinary team consisting of a senior pathology resident and the associate director of the				
41	109	clinical microbiology lab. For each patient, a retrospective chart review was performed and				
42 43	110	determination of test appropriateness based on hospital-established guidelines for this testing				
44 45	111	platform. Appropriate indications for testing initially included acute emergency surgery,				
46 47	112	emergent obstetric procedures, and initial behavioral health admission, but later included orders				
48	113	for discharge to skilled care facilities and pediatric patient admissions (initiated 11/31/2020) as				
49 50	114	well (see Table 1.); retrospective review included all indications for testing when evaluating test				
51 52	115	order appropriateness. Descriptive data for these patients was obtained by review of the				
53	116	electronic medical record and included order indication selected, unit associated with the order,				
54 55 56 57 58	117	and test result. An assessment of the actual indication for the order was then made by chart				

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review. Discrepancy between indication on the order form and actual indication as well as
whether or not the indications met current criteria for GX testing were used to determine
appropriateness of testing.

¹ 122 Data collection and analysis

123 Information pertinent to testing review was collected in a password-protected Excel file 124 (Microsoft, Redmond, WA). Pertinent laboratory data recorded for each request included the 125 order date, patient name and accession number for review in the electronic medical record, 126 ordering unit, order indication, and test outcome. Upon chart review, the actual indication for 127 testing was recorded. For any test where there was a mismatch between the actual and selected 128 order indication, a note regarding the clinical context was made. Differences between order 129 indication and actual indication were analyzed using Chi-square or Fisher's exact test as 130 appropriate. All statistical calculations were performed using SAS software (version 9.4; SAS, 131 Cary, NC).

⁹ 132

133 Results

134 Of the five hundred tests reviewed over the two-week study period, the majority of indications 135 selected were acute emergency surgery (n=339, 68%), followed by OB emergent (n=78, 16%), 136 behavioral health (n=47, 9.4%), and other [discharge (n=21, 4.2%) and pediatric admissions (n=15, 3%)]. There was a significant discordance between the order and actual indication for 137 138 testing, with 69.8% tests deemed inappropriate (n=349, p<0.001). The majority of inappropriate 139 orders were tests ordered with the indication of "acute emergency surgery" (n=249, see Fig. 1), 140 49% of which never had any surgical intervention; these orders were mostly from the Trauma or 141 Emergency department units (79%, n=203). These orders placed in anticipation for surgical 142 intervention with no subsequent intervention had no other indication for testing. In a proportion 143 of these inappropriate acute emergency surgery cases that never proceeded to surgery, the 144 patient's had been post a motor vehicle crash (25%, n=30) or other trauma-related event (34%, 145 n=41). Inappropriate ordering was also pervasive in labor and delivery, with "obstetric emergent 53 54 146 procedure" indication selected inappropriately in 77% of obstetric-related cases (n=60). 55 56

Examples of inappropriate obstetric emergency procedure orders included patient's who were gestational and presenting for a routine obstetric visit with respiratory symptoms or patient's who had no risk factors for cesarean section and proceeded to have an uncomplicated spontaneous vaginal delivery, among others. Behavioral health admissions were also inappropriate in 68% of cases (n=32), and the majority of inappropriate orders were patient's who were being worked up for behavioral health issues but were never admitted. Testing for the indication "discharge to skilled care facilities" was inappropriate in 35% of cases, and the findings in all of these cases was that the patient was not discharged due to ongoing medical or social problems preventing discharge. All pediatric indications selected were appropriate. Most patients ultimately tested negative for COVID (95.8%, n=479). Discussion Identifying inappropriate laboratory ordering practices is a crucial part of modern laboratory utilization and management efforts to optimize patient care and control healthcare costs. Laboratory order errors have been increasingly documented in the primary literature, described as a source of not only wasted healthcare resources but as a possible source of patient harm through unnecessary phlebotomy or diagnostic error leading to invasive procedures^{1,4-6}. Inappropriate orders are not a surprise given the rapid introduction of new and emerging diagnostic testing modalities, which makes it challenging for physicians to follow best ordering practices⁴. The range of errors include those ordered mistakenly, redundantly, or inappropriately, with the latter defined generally as tests ordered that violate a guideline produced by a professional society^{6,7}. Prior large scale auditing data has revealed significant variation in ordering practices that encompasses both under and over-utilization of tests that do not follow current guidelines⁷. This has significant implications not only in terms of cost-effectiveness, but in equity of access to laboratory testing and broader public health outcomes. At our tertiary medical center, audit of COVID-19 GX ordering practices was performed in order to determine order appropriateness and understand physician-ordering practices. Our medical center has various COVID-19 nucleic acid testing platforms that have been added over the course of the pandemic to deal with the increased volumes of testing, changing test

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recommendations, and limited supply of testing reagents and materials. Among these platforms is the GX platform that is attractive because of its short turnaround time but is one of the most limited in available testing resources in comparison to other testing platforms. A single cartridge is used per test, and test cartridges are allotted to the hospital at a set frequency because of national supply allocations. To deal with the high demand for this testing option and in anticipation of influenza season, hospital incident command developed a COVID-19 algorithm that went live November 3, 2020 that linked order indications selected for testing to the appropriate test platform. Patient indications that were linked to the GX, for both symptomatic and asymptomatic patients, included the following: acute emergency surgery, obstetric emergent procedure, and initial behavioral health admission, which later also included pediatric patient admissions and inpatients awaiting discharge to skilled care facilities. The clear consequence of overutilization of this testing platform was the limitation in resources for other patients who met criteria for the faster test; however, unlike other instances of inappropriate ordering, there was no clear direct patient harm that would result from misordering. The purpose of this study was to evaluate ordering practices of this RT-PCR testing platform and gain insight into ways to optimize lab management.

Over the two-week study period, a significant proportion of tests were found to be inappropriately ordered, and most often for an acute emergency surgery indication. A majority of these inappropriate "acute surgery" indication cases were ordered in the trauma or emergency department units, with the latter also responsible for the majority of inappropriate "behavioral health admission" indications. Although we did not explore specific reasons for inappropriate ordering, primary literature has established various contributing factors such as feelings of insecurity or lack of awareness and knowledge of testing by ordering providers^{1-3,8}. In our study, reasons for incorrect test order indication may have included foreshadowing need for emergent surgery, as many of these cases were patients in the emergency department or trauma center post motor vehicle accidents or gunshot wounds; however, following the guidelines outlined by the hospital, these patients should not have had COVID orders placed until patients were definitively heading to the OR. Some informal physician feedback included not being able to distinguish "priority" or acute emergency cases from "non-priority" cases. While these concerns are valid, they do not account for the 49% of patients with "acute surgery" selected as the indication in our

cohort who were discharged without any surgery. Inappropriate ordering was not only prevalent
in the ED or trauma units, but was also pervasive in labor and delivery, where the indication of
"OB emergent" was selected for scheduled cesarean sections in addition to routine gestational
visits and induction of labor cases with low risk of cesarean section. Even order indications that
seem straightforward (e.g., discharge), were often inappropriate.

Identifying misordering practices can broadly illuminate problems with test ordering design elements and the steps necessary to eliminate inappropriate ordering. For instance, in inappropriate "acute emergency surgery" or "obstetric emergency surgery" situations, the initial design of the orderable could have included the need for a case associated with the patient to be posted prior to being eligible to select this order indication. In the case of "initial behavioral health admission," the orderable could similarly be linked to an admission note or some other evidence to support selecting this indication. These examples highlight what is well established in the lab utilization literature, which is that the electronic health record can be utilized in a lab stewardship manner⁸⁻¹⁰. Utilization of computerized efforts to streamline lab management in addition to audits like this study as well as provider education and feedback regarding ordering practices could result in positive changes¹¹, although data is lacking regarding long-term order practice changes following similar interventions^{3,9}.

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Clearly, the pervasiveness of inappropriate ordering at this institution demonstrates an opportunity for laboratory stewardship, which could mean laboratory professionals working with ordering providers to audit the appropriateness of a test request, physician ordering practice feedback, or redesigning test elements. Information technology and the electronic medical record system can be utilized to direct tests appropriately and flag or stop inappropriate orders before they even reach the laboratory^{7,12}. The literature supports a multifaceted approach^{1,3,8,13}, but with the commonality that physicians work together with laboratory professionals so that the issues inherent to laboratory testing issues are approached in the context of meeting the clinical care needs of the patient. Inappropriate GX ordering at this medical center has not yet been formally addressed on a systems-level due to a lack of dedicated data management resources. However, physicians who place COVID-19 orders and wish to switch to the GX platform have had to

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negotiate test appropriateness with the microbiology lab directors on a test-by-test basis. In these
instances, the lab director has utilized the aforementioned ordering algorithm and provided
physician education concerning appropriate test ordering. In addition, clear disregard for the
testing algorithm (when identified) was addressed with hospital risk management in an effort to
increase provider education. This retrospective audit regarding the inappropriate use of the
platform will be informative for future decisions regarding test order design.

245 There are obvious limitations to our study. First, this was a retrospective single-center 246 investigation of only two weeks duration. However, the issues in ordering were uniform over that 247 period, and we have observed ongoing issues in ordering of this testing platform since the onset 248 of the pandemic due to the evolving test landscape and recommendations for testing. Second, we 249 did not investigate reasons for inappropriate ordering apart from speculation; it could be that 250 there was an element of the ordering process that made selection of a different order indication 251 impossible. However, this finding would also support the need for better design elements and 252 clinical-lab interface that is the overall recommendation from our findings. Additionally, 253 retrospective chart review of real time decisions made for test ordering does not necessarily take 254 into account the rationale of the provider. Medical decisions for ordering are complex, and 255 extrapolation of that decision making from the electronic medical record is somewhat limited. 256 However, review of test orders by a pathology resident—given their background medical 257 knowledge and training—in addition to the expertise of a clinical laboratory professional allows 258 for increased accuracy in final assessment of test appropriateness. Finally, physician feedback 259 regarding ordering was only provided in limited circumstances as described previously. Our data 260 have identified the need for additional systems-level interventions, which may include changing 261 design elements in the electronic health record or the way physicians are educated regarding 262 ordering, in order to tackle inappropriate lab utilization.

⁰ 264 **Conclusions**

Inappropriate laboratory testing for the COVID-19 GX platform was pervasive at this academic
medical center, reflecting growing literature highlighting similar findings in laboratory medicine
in general. Although this is a single-institution study, these findings suggest that multi-

institutional investigation of similar testing platforms may be warranted. Lab utilization literature emphasizes a combined effort in tackling inappropriate testing that includes tasks such as lab feedback regarding physician ordering practices, audits, and physician ordering education in addition to computerized systems that facilitate appropriate order choices. Like in our study, where physician-based knowledge of patient care was bridged with a laboratory professional in order to determine test appropriateness, it is through a laboratory-clinical interface that we can improve lab utilization with downstream clinical and financial implications. Author Contributions: All authors confirmed they have contributed to the intellectual content of this paper and have met the following 4 requirements: (a) significant contributions to the conception and design, acquisition of data, or analysis and interpretation of data; (b) drafting or revising the article for intellectual content; (c) final approval of the published article; and (d) agreement to be accountable for all aspects of the article thus ensuring that questions related to the accuracy or integrity of any part of the article are appropriately investigated and resolved. Authors' Disclosures or Potential Conflicts of Interest: No authors declared any potential conflicts of interest. Role of Sponsor: No sponsor was declared.

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Table 1. 2020 Fall COVID-19 testing algorithm

		Test indications			
	Platform	Asymptomatic Patients	Symptomatic Patients		
0 1 2 3 4	GX (TAT=1 HR)	Acute emergency surgery Emergent obstetric procedures Initial behavioral health admission Pediatric admissions**			
+ 5 6 7 8 9	BD (TAT=3-5 HR)	Ambulatory oncology or transplant same-day surgery Discharge to nursing home, skille care fac			
) 2 3 4		Asymptomatic screening for inpatient admission Pre-op 24-	PUI admission		
5 6 7 8 9	Roche/Abbott (TAT=24 HR)	Ambulatory oncology or transplant surgery in >24 hrs Obstetric scheduled c	transplant infusion PUI		
0 1 2 3 4	Reference Laboratory (TAT=3-5 days)	Routine, ambulatory	ED discharge home Ambulatory office visit PUI		
5 5 7	BioFire (TAT=3 HR)		Acute respiratory failure, active oncology or transplant inpatient		
3 355 9 356 0 357 1 358 2 359 3 360	*Discharged patients were later routed to the GX platform instead of BD. **Pediatric patients were added as an appropriate indication for GX testing beginning 11/31/20. Abbreviations: TAT=Turnaround time, GX=Cepheid GeneXpert [®] , BD=BD MAX [™] System, PUI=Patient under investigation, ED=Emergency department				
360 361	Figure 1. All GX orders d	uring study period, with pie graphs of th	e outcome and unit associated		
362	with the inappropriate eme	ergency surgery orders. Abbreviations: (DB=Obstetric, BH=Behavioral		
363	health, ED=Emergency de	health, ED=Emergency department			
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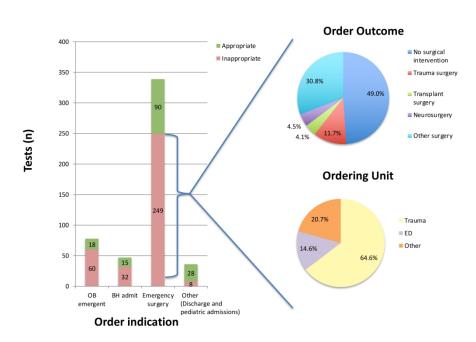


Figure 1. All GX orders during study period, with pie graphs of the outcome and unit associated with the inappropriate emergency surgery orders. Abbreviations: OB=Obstetric, BH=Behavioral health, ED=Emergency department

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