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# Computerised physician order entry-related medication errors: analysis of reported errors and vulnerability testing of current systems

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## ABSTRACT

**Importance** Medication computerised provider order entry (CPOE) has been shown to decrease errors and is being widely adopted. However, CPOE also has potential for introducing or contributing to errors.

**Objectives** The objectives of this study are to (a) analyse medication error reports where CPOE was reported as a 'contributing cause' and (b) develop 'use cases' based on these reports to test vulnerability of current CPOE systems to these errors.

**Methods** A review of medication errors reported to United States Pharmacopeia MEDMARX reporting system was made, and a taxonomy was developed for CPOE-related errors. For each error we evaluated *what* went wrong and *why* and identified potential *prevention* strategies and recurring error scenarios. These scenarios were then used to test vulnerability of leading CPOE systems, asking typical users to enter these erroneous orders to assess the degree to which these problematic orders could be entered.

**Results** Between 2003 and 2010, 1.04 million medication errors were reported to MEDMARX, of which 63 040 were reported as CPOE related. A review of 10 060 CPOE-related cases was used to derive 101 codes describing *what* went wrong, 67 codes describing reasons *why* errors occurred, 73 codes describing potential *prevention* strategies and 21 codes describing recurring error scenarios. Ability to enter these erroneous order scenarios was tested on 13 CPOE systems at 16 sites. Overall, 298 (79.5%) of the erroneous orders were able to be entered including 100 (28.0%) being 'easily' placed, another 101 (28.3%) with only minor workarounds and no warnings.

**Conclusions and relevance** Medication error reports provide valuable information for understanding CPOE-related errors. Reports were useful for developing taxonomy and identifying recurring errors to which current CPOE systems are vulnerable. Enhanced monitoring, reporting and testing of CPOE systems are important to improve CPOE safety.

Computerised provider order entry (CPOE) has long been considered and demonstrated to be a high-leverage tool for preventing medication errors, and incentives are being provided to accelerate its adoption.<sup>1–3</sup> However, there is a growing awareness and increasing documentation of concerns that CPOE can also introduce or facilitate new errors.<sup>4–6</sup> The Institute of Medicine Committee report 'Health IT and Patient Safety: Building Safer Systems for Better Care' recognised that Health Information Technology (HIT) is part of a complex sociotechnical system and recommended investing in efforts to uncover and understand the vulnerabilities of HIT systems to errors and unintended consequences.<sup>7</sup> More recently, the US Food and Drug Administration Safety and Innovation Act (FDASIA) similarly recommended developing similar approaches for reporting with a key recommendation advocating compilation of reports of errors across multiple systems.<sup>8</sup>

In 1999, the United States Pharmacopeia (USP) launched a pioneering online medication error reporting system that has now

collected more than two million medication errors.<sup>9</sup> In 2003, in response to the growing number of reports suggesting that CPOE was playing a role in the medication errors being reported, USP added a coded field for reporters to check off 'CPOE' as a contributing cause of the error. Shortly thereafter, the USP's MEDMARX annual report stated that computer entry and CPOE errors had become the third leading contributing cause being checked off in medication error submissions.<sup>10</sup> However, since that initial report there has been no detailed investigation or analysis of CPOE-related MEDMARX error reports. Furthermore, the report narratives have not been assessed previously. To better understand how and why the errors were occurring, as well as ways they could have been prevented, we undertook a study of the USP MEDMARX CPOE medication error reports, subjecting these reports to a detailed review as well as testing the vulnerability of current CPOE systems to the types of errors identified.

The aims of this study are to (1) analyse the USP MEDMARX medication error reports where CPOE was checked off as a 'contributing cause' of the error by performing in-depth review of 10 000 of the error report narratives to understand details of each error and develop a new taxonomy for CPOE-related errors and (2) develop and test 'use cases' based on these actual error reports and assess the vulnerability of leading CPOE systems to these errors.

## METHODS

### Phase I: MEDMARX data analysis—taxonomy development and coding

We queried the USP MEDMARX (now part of Quantros Safety and Risk Management suite) for all medication error reports from January 2003 to April 2010 that were coded by the error reporters as having 'CPOE' as one of the 'contributing causes' of the errors. These spontaneous error reports were submitted from institutions subscribing to the MEDMARX medication error reporting system. Reporters typically included a mix of centralised quality assurance staff (who collected reports from front-line staff and then entered reports for their institution into MEDMARX) and in a minority of institutions, front-line staff directly entering reports.

We identified a total of 63 040 medical error reports having CPOE checked off as a contributing cause in 1.04 million total reports. These reports served as the data for analysis of CPOE errors and taxonomy development. A total of 10 060 error reports were then manually reviewed, representing all 191 of the reports categorised as National Coordinating Council for Medication Error Reporting and Prevention (NCC MERP) outcome categories E–I (ie, categories where patient harm occurred, which we designated as highest priority to review in detail) plus a random sample of the remaining A–E category reports.<sup>11</sup> Each of these 10 060 error reports was reviewed and coded by one

of three clinical pharmacists (MGA, JJB and ACS) with an emphasis on detailed review of the free text narrative description of the error. For cases where there were questions, or consideration of new codes, the cases were re-reviewed in detail by the entire team of three pharmacists and a general internist (GDS). These codes grounded in the data and served as the basis for our taxonomy development (grounded qualitative analysis).<sup>12</sup>

The coding was done using a customised qualitative-coding software tool developed in Microsoft Access with codes progressively developed or added based on the error report narratives and iteratively refined via weekly meetings of the clinical review team. Each report was coded to categorise three elements of the error: (a) *what* happened, (b) *why* it happened and (c) potential *prevention* strategies. Pharmacist reviewers were instructed to code *what* and *why* exclusively based on information in the narrative and accompanying report. For potential *prevention* strategies, pharmacist investigators were encouraged to suggest ways the error could have been prevented based on the report and their knowledge of medication safety and information technology. To ensure conservative coding, when reports lacked sufficient information to determine a *what*, *why* and *prevention* classification, reviewers were instructed to assign them as 'unknown'. Each case could be assigned one or more codes in each category. Inter-reviewer reliability was assessed using a 1% random sample of reviews to calculate a kappa statistic. Once the coding was completed, the codes were re-reviewed and reorganised using several card sorting and iterative team consensus exercises to group and refine the final taxonomy.

### Phase II: CPOE vulnerability testing based on reported error scenarios

During the above qualitative review of the error reports, reviewers were instructed to flag cases that might serve as representative 'test cases' to assess whether errors identified could be replicated in current CPOE systems. A weighted scoring system based on error frequency, severity, generalisability and testability was used to narrow this list down to key error scenarios for testing. Based on this prioritisation, 21 test scenarios were chosen. Scenarios included erroneous or problematic CPOE orders related to wrong units, major overdoses, drug allergies, order element omission errors, wrong frequency and drug–disease contraindications, as well as three 'correct' but 'complex' test orders (eg, prednisone tapers, alternate-day dosing, non-formulary drug) that reports often suggested led to problem-prone workarounds such as potentially confusing free text comments in the drug order (see online supplementary appendix 1 for list of test case scenarios).

We identified a convenience sample of leading vendor and homegrown CPOE system test sites and obtained institutional and institutional review board permission to enter these problematic orders on test

patients at these sites. To test each of these error scenarios, we recruited one to two typical users (mostly medical residents or primary care attending physicians) with at least 1-year experience with the CPOE system (range 1–8) and instructed them to enter the erroneous orders. Users understood that these orders were problematic but were instructed to proceed with placing these orders as they typically would, using any methods they might routinely use to enter a desired order. Outcomes of whether orders were successfully entered and behaviours of medical doctors and CPOE systems were recorded by physicians or pharmacists (GDS, TE, MGA and ACS) and research assistant (DLW) observers who rated the ease or difficulty of entering the erroneous or complex orders using pre-defined operational definitions (table 1).

## RESULTS

### Phase I: qualitative review

Of 1.04 million reported errors, 63 040 (6.1%) were classified by the reporters as CPOE related. Our pharmacists reviewed and coded 10 060 (15.7% sample) of these

63 040 reports and derived a taxonomy that included 101 codes describing *what* occurred, 67 codes describing *why* errors occurred as well as 73 codes describing potential *prevention* strategies (see online supplementary appendix 2 for full taxonomy). Tables 2–4 summarise findings for the top 25 most frequent codes assigned for the *what*, *why* and *prevention* codes. Many reports lacked sufficient detail describing the error to permit adequate coding, particularly to classify *why* the error occurred. Although all of these reports had ‘CPOE’ checked off by the reporter as a contributing cause, our reviewers could determine the role of the CPOE system in only 5004 (49.8%) of the reports based on report content alone. Pharmacists’ inter-rater agreement rates and kappa scores for the taxonomy coding of *what* occurred and *why* the error occurred were 66%, kappa 0.56 (95% CI 0.39 to 0.72) and 64%, kappa 0.58 (95% CI 0.42 to 0.73), respectively.

### Phase II results: CPOE vulnerability testing

Our pharmacist reviewers identified 338 error reports as potential candidate scenarios for testing the

**Table 1** Operational definitions used to classify ease of entry of ‘error scenario’ test orders

| How easy was it to place the order?  |                   |                  |           |            |
|--|-------------------|------------------|-----------|------------|
| 1  | 2                 | 3                | 4         | 5          |
| Easy   | Minor workarounds | Some protections | Difficult | Impossible |
| <p>1. Easy</p> <ul style="list-style-type: none"> <li>▶ End user successfully and quickly entered the erroneous order</li> <li>▶ No alerts/warnings</li> <li>▶ No workarounds or additional mouse clicks required</li> <li>▶ Order ‘sailed through’ (order simply accepted as if was a normal error)</li> </ul> <p>2. Minor workarounds</p> <ul style="list-style-type: none"> <li>▶ End user is able to enter the order fairly easily</li> <li>▶ No alerts/warnings</li> <li>▶ Requires some kind of additional workarounds (eg, needed to adjust default dosing or enter all or part of the order in free text, or use of comments field to complete order)</li> </ul> <p>3 Some protections</p> <ul style="list-style-type: none"> <li>▶ End user is able to enter the order</li> <li>▶ ‘Passive’ alerts/warnings appear               <ul style="list-style-type: none"> <li>– Warning appears but it can be ignored (no over-ride required)</li> <li>– Warning appears but can over-ride with single mouse-click (this includes selecting a reason for over-ride from pull-down menu)</li> </ul> </li> <li>▶ Typical response from the provider is to say ‘I usually just blow through these [warnings]’ or equivalent.</li> </ul> <p>4 Difficult</p> <ul style="list-style-type: none"> <li>▶ End user is able to enter the order, but doing so requires a conscious, concerted effort</li> <li>▶ ‘Active’ alerts/warnings appear that require additional action from provider (eg, typed reason for over-ride)</li> <li>▶ Often, typed workarounds and extra mouse clicks are required to over-ride</li> <li>▶ Order often does not go through on first attempt</li> <li>▶ Significant time and thought required to enter successfully</li> <li>▶ Articulated end-user frustration</li> </ul> <p>5 Impossible</p> <ul style="list-style-type: none"> <li>▶ Order could not be entered, despite attempted workarounds</li> <li>▶ No way to enter order in free text comments field</li> <li>▶ Hard-stop warnings appear or significant changes are required to send to pharmacy (eg, required to d/c order or remove drug/diagnosis)</li> <li>▶ System is completely ‘bulletproof’, at least in regard to this particular order</li> </ul> |                   |                  |           |            |

**Table 2** Top 25 what happened? Codes

| Code  | N    |
|---|------|
| Missing or incorrect directions/patient instructions        | 2088 |
| Ordered wrong dose or strength                              | 877  |
| Missing quantity or wrong number ordered                    | 877  |
| Unknown   | 680  |
| Wrong schedule entered                                      | 566  |
| Duplicate order: same exact drug                            | 510  |
| Overdose or potential overdose                              | 376  |
| Ordered wrong formulation/dosage form                       | 363  |
| Order not processed/delayed                                 | 361  |
| Extra dose potential  | 337  |
| Ordered wrong drug  | 302  |
| Routing issue   | 275  |
| Comment field issue   | 267  |
| Missed does potential                                       | 256  |
| Nursing administration issues                               | 240  |
| Wrong time selected   | 234  |
| Ordered/entered for wrong patient                           | 229  |
| Discontinuation issues                                      | 216  |
| Not processed/delayed: order confusing/needed clarification | 203  |
| Patient missed dose   | 203  |
| Omitted drug  | 167  |
| Ordered wrong PO formulation, (eg, ER, XR, etc)             | 160  |
| Patient given extra dose                                    | 152  |
| Telephonic/verbal order issues                              | 139  |
| Correct drug ordered/wrong drug processed                   | 138  |

ER, extended release; PO, by mouth; XR, extended release.

vulnerability of current systems. This list was narrowed to 21 scenarios by combining similar scenario types (ie, various drug overdoses; orders for drug to which patient was allergic) and prioritised based on preselected criteria of (a) frequency, (b) seriousness and (c) testability. These scenarios included five inpatient-only scenarios (eg, intravenous orders) that were not tested on outpatient systems, and three ‘complex’ orders (not errors per se, but designed based on reports that repeatedly arose from similar potentially error-prone orders reported). We recruited a convenience sample of 13 representative systems (four homegrown, one open source, eight commercial, including each of the leading inpatient and outpatient vendors) at 16 test sites. Not all tests could be performed on all systems (because of formulary and other design limitations). Excluding these scenarios, we entered a total of 375 erroneous orders during 24 testing sessions on 13 systems at 16 test sites.

Overall, 298 (79.5%) erroneous orders were able to be placed, including 100 (28.0%) being ‘easily’ placed (order simply accepted with no extra steps or warnings), with another 101 (28.3%) placed with only ‘minor workarounds’ (eg, adjusting default dosage, with no warnings). Thus, 201 (56.3%) of the errors could be relatively easily replicated (entered easily or

**Table 3** Top 25 why did it happen? Codes

| Code  | N    |
|---|------|
| Unknown   | 5326 |
| Multiple systems (two or more electronic systems)     | 1211 |
| Use of system or SIG abbreviations                    | 494  |
| Failure to follow established procedures or protocol  | 480  |
| Profiling Issues: failure to perform or use correctly | 443  |
| Inexperienced end user                                | 415  |
| Lack of computer training/system knowledge            | 325  |
| Typing error  | 206  |
| Hybrid system (electronic and paper)                  | 205  |
| Communication issues                                  | 200  |
| System limitations/inadequacy: routing/mapping issue  | 186  |
| Lack of clinical knowledge                            | 186  |
| Medication reconciliation issue                       | 184  |
| Alert ignored/overridden                              | 153  |
| Nursing administration issues                         | 149  |
| Pharmacy order entry problems/issues                  | 134  |
| Transcriptions (copy/paste)                           | 133  |
| Comments field free text confusing/confusion          | 121  |
| eMAR/MAR issues                                       | 119  |
| Order set/template/protocol issues                    | 113  |
| Drug dictionary miscode/out-of-date drug information  | 109  |
| Patient identification issue                          | 95   |
| Initial vs continuing order issue                     | 93   |
| Patient transferred (within hospital)                 | 91   |
| Misinterpretation of order(s)                         | 72   |

eMAR, electronic medication administration record; MAR, medication administration record; SIG, sig code for directions on how to take a medication.

with minor workarounds) with no warning or blocking of potentially dangerous orders. Table 5 lists the frequencies of how often erroneous orders were prevented versus went through easily or with some difficulty. Only 26.6% of orders generated specific warnings related to the erroneous order. Of these, 69% were passive alerts (information display only or easily over-ridden and/or ignored). Another 29% required workarounds but nonetheless, could still be entered. Notable failures included erroneous orders for pioglitazone accepted for patients with congestive heart failure in 87.5%, orders for insulin 60 ‘mL’ (rather than ‘units’) going through in 75.0% and no specific warnings for a 1000-fold levothyroxine overdose in 37.5% of attempts. Figure 1 illustrates a breakdown of which of the erroneous order scenarios had greater protection (ie, were more difficult to enter; higher mean scores overall) versus those where systems were generally more vulnerable (lower mean scores overall). Finally, for 40 of 72 (55.6%) of the error-prone more complex (eg, variable daily warfarin, prednisone taper) test orders, prescribers encountered problems or ordering difficulties, creating potentials for error-prone workarounds.



**Table 4** Top 25 prevention codes

| Code  | N    |
|---|------|
| Unknown   | 3021 |
| Systems integration   | 1520 |
| Standardised constructs for dosing regimens                   | 1142 |
| Enhanced education/training                                   | 791  |
| Standardised SIGs   | 775  |
| Autocalculation for prescription quantities                   | 604  |
| Duplicate order checking/support                              | 403  |
| Default dosing selections                                     | 318  |
| Drug database improvements/enhancements                       | 232  |
| Dose range checking   | 212  |
| Individual dosing calculations                                | 207  |
| Improved design/functionality                                 | 201  |
| Medication reconciliation support                             | 200  |
| Scheduling feedback   | 169  |
| Blank field checking  | 141  |
| Standardised constructs for dose form-route                   | 136  |
| System for reconciling new/now with continuing dosing         | 116  |
| Enhanced allergy entry for drugs not included in allergy list | 109  |
| Direct order entry to minimise verbal/telephonic issues       | 106  |
| Route-formulation checking                                    | 93   |
| Include time in checklist (12, 24, etc)                       | 91   |
| Duplicate therapy checklist/support                           | 89   |
| Formulary status and restrictions warnings                    | 89   |
| Medication handoff/transfer standardisation                   | 86   |
| Better testing of order sets/updates                          | 69   |

SIG, sig code for directions on how to take a medication.

## DISCUSSION

We analysed a large medication error database for errors that were reported as being related to CPOE and developed a new taxonomy of the types, causes

**Table 5** Frequency distribution of erroneous orders going through, ease with which they went through, and whether there was a warning

|                          | N   | Per cent |
|--------------------------|-----|----------|
| Did order go through?    |     |          |
| Yes                      | 298 | 79.5     |
| No                       | 59  | 15.7     |
| Untestable               | 18  | 4.8      |
| Likert scale: difficulty |     |          |
| Easy                     | 100 | 28.0     |
| Minor workarounds        | 101 | 28.3     |
| Some protections         | 69  | 19.3     |
| Difficult                | 28  | 7.8      |
| Impossible               | 59  | 16.5     |
| Warnings?                |     |          |
| Yes                      | 95  | 26.6     |
| No                       | 216 | 60.5     |
| Irrelevant warnings only | 44  | 12.3     |
| Uncertain/maybe          | 2   | 0.6      |

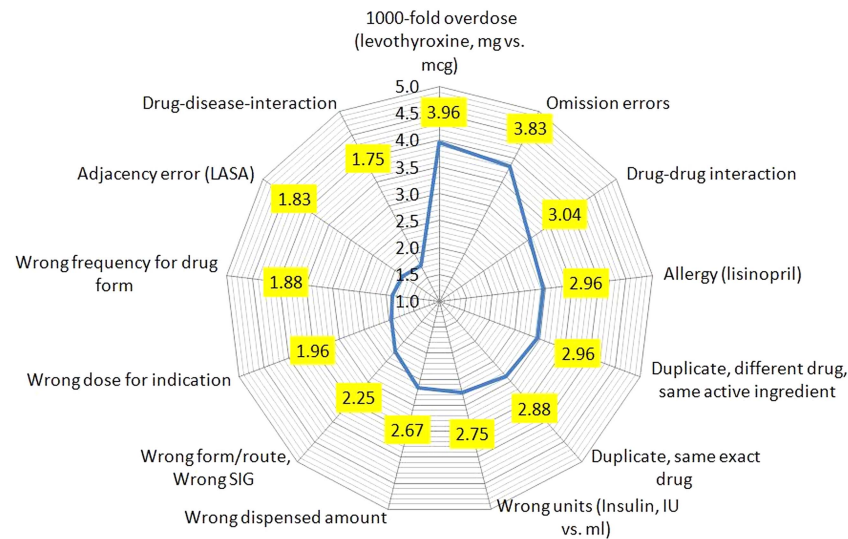
and prevention strategies that we could identify in these reports, resulting in a number of useful insights regarding the frequency of specific error types. We then performed vulnerability testing to examine whether these errors could be replicated in current CPOE systems with the worrisome finding that the majority (overall, 56.3%) of the selected erroneous orders could be readily entered.

Report narratives provided both rich details of the types of errors that occur in CPOE systems and served as the basis for the development of a taxonomy that facilitated classification of the types. Leading CPOE-related errors included missing or erroneous sig (label directions) or patient instructions, wrong dose or strength, problems with wrong quantity or strength, scheduling problems (particularly related to inpatient orders and timing of stat vs continuing orders), delays in medication processing or administration due to confusing orders and wrong drug or wrong patient errors.

Many of these problems are not unique to CPOE and could also occur with handwritten ordering, although some, in theory (eg, drug overdoses), should be preventable with properly designed electronic systems.<sup>2 13–15</sup> Reasons for these errors were discernible for roughly half of the error narrative reports and included problems with miscommunication between multiple electronic or hybrid paper-electronic systems, user issues such as failure to follow established protocols, inexperience or lack of training in using the CPOE system, typing and pull-down menu errors, medication reconciliation issues, ignoring or over-riding alerts and confusion related to or arising from comments fields.

Although it may be argued that many errors were isolated occurrences or perhaps based on the vulnerability of older systems, when we tested current systems, we found that current systems had high degrees of susceptibility to many of these errors. Nearly 80% of the erroneous orders could be entered, with more than half entered with little or no difficulty or warnings. More than a quarter (28.0%) of the orders were easily entered (in the words of our test physicians and research pharmacists, ‘sailed right through’), with no warnings or additional efforts on the part of the ordering physicians.

Systems that overalert or frustrate busy physicians attempting to enter appropriate orders are also an important problem and can lead to the so-called ‘alert fatigue’. Thus, systems need to balance ease of ordering with appropriate protections. Our study was not designed to determine the best balance, although better designed systems have the potential to achieve both better efficiency (eg, well-designed order sets) and improved signal-to-noise ratio (better ratio of appropriate to nuisance alerts).<sup>15–18</sup> Shockingly, one of our test systems had zero warning alert fire in response to our erroneous test orders; we discovered



**Figure 1** Radar plot showing mean score for each test scenario across all tested computerised provider order entries in difficulty of entering erroneous orders. To maximise safety, the plot ideally should occupy the most outer grid (score 5); that is, impossible to enter the erroneous orders. For example, greatest protection was against 1000-fold overdose of levothyroxine; however, drug–disease contraindication checking had the lowest mean score indicating least protection, hence making it easier to enter this erroneous order.

that all alerts had been turned off for a system upgrade several months earlier and it was not until we performed our testing that it was discovered they had not been reinstated. We documented a high degree of variability of vulnerability and alerting from system to system. We even observed variations in different implementations of the same system or even different users entering orders in different ways at the same site. This is similar to the findings when the Leapfrog tool was used to test potential errors, revealing wide variations in detection of test orders that would cause adverse events with varied local implementations, even of the same vendor's systems.<sup>19</sup>

From the policy perspective, one approach would be to regulate electronic health records and/or clinical decision support. Another would be to allow vendors to continue the current approach in which there is relatively little regulation but to improve postmarket surveillance. The FDASIA committee has recommended the latter approach to the Food and Drug Administration (FDA), Office of the National Coordinator and Federal Communication Commission.<sup>8</sup> The data from our study suggest that it is possible to aggregate large numbers of reports across multiple vendors and draw useful conclusions.

Our study was limited by the fact that the reported CPOE-related errors were based on spontaneous self-reporting of medication errors. Thus, no conclusions can be drawn about the actual incidence or relative frequency of these errors and problems. In addition to the well-known problem of under-reporting from spontaneous reporting systems, there are problems with the quality and non-verifiability of the reports we studied.<sup>20–21</sup> Many reports were incomplete, lacked details of the role CPOE played in the error (ie, only that they had the box checked that CPOE was contributing factor). Thus, as instructed, our reviewers

conservatively coded these reports as 'unknown', for what happened and why, making this a leading category. Despite these limitations of the quantity and quality of these spontaneous reports, the errors speak for themselves as noteworthy and likely (particularly based on our vulnerability testing results) representative CPOE safety issues. This points to the need to improve the quality of such reports and perhaps standardise collection of contributing causal factors. Additional potential limitations are that, reports and subscribers to MEDMARX may not be representative of all prescribing systems, and outpatient reports were under-represented as subscribers were mainly hospitals and hospital systems. Many of the reports were nearly a decade old, although our efforts to replicate these errors demonstrate that vulnerabilities also exist in current systems. Our study did not examine the likelihood that the erroneous orders placed would be intercepted by pharmacists or other staff and hence, not cause harm. Nonetheless, the MEDMARX reports contained many examples of where errors did reach or harm patients. Finally, our qualitative pharmacist coding and rating of the error scenarios was based on subjective reviewer judgement. To offset this, we assigned clear operational definitions to the codes as they were developed, had a consensus process for adjudicating questions or disagreement and achieved reasonably good inter-reviewer reliability scores in assessment of the reports. We have continued to refine this taxonomy for a white paper to be published by the US FDA that can help guide future research as well as organisations analysing CPOE-HIT error reports in the future.

In conclusion, we reviewed error reports to identify patterns of CPOE-related errors and used them to develop a new taxonomy and recurring error scenarios. We then tested current systems and found areas

of noteworthy vulnerability. Developers and users need to be aware of this potential for error and should build in protection strategies at multiple levels to learn from and protect patients by continuously improving the safety of CPOE systems.<sup>22–25</sup> Efforts that permit both better reporting and awareness of medication errors as well as testing the vulnerabilities of local CPOE systems are needed; such efforts are crucial to safe prescribing, ongoing postimplementation monitoring and improvement of CPOE systems.

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**Competing interests** GDS is currently working on an FDA-funded grant investigating CPOE systems and medication safety. RK works with a company, Wearable Intelligence that is bringing Google Glass to healthcare, specifically for use in rounding, with Emergency Medical Systems crew, for handoffs, for use in the operating room to display what the surgeon is viewing and for alerting clinicians. There is no direct competition and it does not affect the issues discussed in our article, but it is a role in an HIT effort. DWB is a coinventor on patent no. 6029138 held by Brigham and Women's Hospital on the use of decision support software for medical management, licensed to the Medicalis Corporation. He holds a minority equity position in the privately held company Medicalis which develops web-based decision support for radiology test ordering. He consults for EarlySense, which makes patient safety monitoring systems.

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## Appendix 1. Test Case Scenario List and Instructions

### Test Case 1:

#### Order instructions:

1. Enter patient allergy for Lisinopril in test patient's chart.
2. Enter order for Captopril 12.5 mg PO TID.

Special instructions: If Lisinopril is not on formulary, use Enalapril 5 mg PO daily.

### Test Case 2:

#### Order instructions:

1. Enter order for Imdur (isosorbide Mononitrate) 30 mg PO daily.
2. Enter order for Revatio (sildenafil) 20 mg PO TID.

Special instructions: Enter both orders in sequence without discontinuing 1st order.

### Test Case 3:

#### Order instructions:

1. Enter "congestive heart failure" or equivalent to patient problem list.
2. Enter order for Pioglitazone 45 mg PO daily.

Special instructions: None.

### Test Case 4:

#### Order instructions:

1. Enter order for Lovenox 40 mg SQ daily.
2. Enter order for Lovenox 100 mg SQ BID.

Special instructions: Enter both orders in sequence without discontinuing 1st order. Note: intention is for first order to be prophylactic dose, second order to be later initiation of therapy without d/cing prophylactic dose. If Lovenox is not on formulary, use:

(a) 1. Dalteparin 5000 units SC daily AND 2. Dalteparin 15,000 units SC daily (for 75 kg person at 200 units/kg) OR

(b) 1. Arixtra (fondaparinux) 2.5 mg SC q24 hrs AND 2. Arixtra (fondaparinux) 7.5 mg q24 hrs (for 50-100 kg person)

**Test Case 5:**

Order instructions:

1. Enter order for Insulin Aspart, 60 ml SQ BID.

Special instructions: None.

**Test Case 6:**

Order instructions:

1. Enter order for Metformin 1000 mg PO BID

2. Enter order for Glucovance (glyburide/metformin) 5 mg/500 mg PO BID

Special instructions: Enter both orders in sequence without discontinuing first order.

**Test Case 7:**

Order instructions:

1. Enter order for Metronidazole 250 mg with SIG: "Take two tablets by mouth twice a day." Duration: 7 days, Dispense amount: #14.

Special instructions: Enter order using 250 mg tablets only (total dose: 500 mg BID).

**Test Case 8:**Order instructions:

1. Enter order for Sertraline PO daily (without entering a dose).
2. D/c first order
- [3. Enter order for Sertraline 25 mg PO (without SIG).]

Special instructions: Note: This is a 2-part test.

**Test Case 9:**Order instructions:

1. Enter order for Synthroid (levothyroxine) 100 mg PO daily.

Special instructions: None.

**Test Case 10:**Order instructions:

- 1.Type "penicil" into drug search function.
2. Select Penicillamine from menu (even though what was desired was penicillin).

Special instructions: None.

**Test Case 11:**Order instructions:

1. Enter order for Tylenol Junior Strength Chewable Tabs, 160 mg #24 with instructions (SIG) to administer "1 dropperful every 4 hours."

Special instructions: None.

**Test Case 12:**Order instructions:

1. Enter order for Cardizem CD (diltiazem) 120 mg PO QID.

Special instructions: Make sure to select CD (extended-release) formulation.

**Test Case 13:**Order instructions:

1. Enter order for Methotrexate 15 mg PO daily.

Special instructions: None.

**Test Case 14:**Order instructions:

1. Enter order for Edurant (rilpivirine) 25 mg PO 9am.

Special instructions: None.

**Test Case 15:**Order instructions:

1. Enter order for Prednisone PO as 6-day taper with decreasing doses of: 60 mg x 1 day, 50 mg x 1 day, 40 mg x 1 day, 30 mg x 1 day, 20 mg x 1 day, 10 mg x 2 days.

Special instructions: None.

**Test Case 16:**Order instructions:



1. Enter order for Coumadin 6 mg PO daily Saturday and Thursday, 4 mg PO daily all other days (Mon, Tues, Wed, Fri, Sun).

Special instructions: None.

**Test Case 17:**

Order instructions:

1. Enter order for Streptomycin 0.5 mg IM daily.

Special instructions: None.

**Test Case 18:**

Order instructions:

1. Enter order for Levofloxacin 750 mg IV q24 hours.

2. Enter order for Levofloxacin 500 mg PO q24 hours.

Special instructions: Enter both orders in sequence without discontinuing 1st order. If Levofloxacin not on formulary, enter orders for 1) Cipro 400 mg IV q12 AND 2) Cipro 500 mg PO q12.

**Test Case 19:**

Order instructions:

1. Enter order for Vancomycin 1.25g IV q12 hours.

2. Change dose on first order to 900g IV q12 hours.

Special instructions: *Modify the order without d/c-ing it, if possible.*

**Test Case 20:**

Order instructions:

1. Enter order for Cefepime 2 gm IV q8 hours PRN.

Special instructions: If Cefepime not on formulary, enter order for Cephazolin 2 gm IV q8 hours.

**Test Case 21:**

Order instructions:

1. Enter order for Dexamethasone 100mg IV push.

Special instructions: Note: original prescriber intended to order Hydrocortisone.

Appendix 2. **BRIGHAM and WOMENS NSPF MEDMARX CPOE ERRORS PROJECT - CPOE ERRORS TAXONOMY**

**WHAT Happened**

**Patient**

- Meds ordered for wrong patient
  - Meds ordered on wrong patient account
- Meds labeled for wrong patient
- Meds administered to wrong patient
  - Same or similar patient names

**Drug**

- Omitted drug
- Drug not available in TPN template
- Missing drug form
- Ordered wrong drug
  - Look alike sound alike drug
- Correct drug ordered/wrong drug processed
- Ordered wrong formulation/dosage form
  - Ordered wrong PO formulation (ER, XR, etc.)
  - NDC Mismatch/wrong package size
- Ordered wrong diluents (IV)
- Allergy
  - Prescribed drug to white patient was allergic
  - No Allergy Assessment
- Contraindicated
- Duplicate Order
  - Same exact drug
  - Same drug different routes
- Duplicate Therapy
  - Different drug same class
- Ordered a drug that was non-formulary
- Ordered a drug that was restricted
- Ordered a drug that was out of stock/drug shortage
- Ordered for a home medication
- Non-existent medication

**Dose**

- Ordered wrong dose or strength
  - Incorrect units used
- Correct dose ordered/incorrect dose processed
- Dose range order
- Wrong concentration/volume
- Unavailable dose ordered
  - Combinatory issues
  - Dose modification issue
- Missing number/quantity or wrong number ordered

- Missing dose on Rx
- Under dose or potential under dose
- Patient missed dose
- Potential for missed dose(s)
- Dose lower than ordered
- Overdose or potential overdose
- Patient given extra dose
- Patient potential for extra dose
- Dose higher than recommended
- Prolonged infusion (e.g. extra dose for IV infusion)

#### Route

- Missing route
- Ordered wrong route for patient
- Route-formulation mismatch
- IV/PO issue

#### Time

- Missing time/schedule information
- No start date entered
- No stop date entered
- Wrong time selected
- Wrong schedule entered
- Correct schedule entered/incorrect schedule processed
- Wrong order date
- AM/PM Mix-up
- Date/time mismatch
- Frequency range order
- Patient received delayed dose
- Drug product expires before infusion finished
- Drug product expires before prescribed amount finished
- Confusion related to initial start time and continuation
- ED order issues – scheduled vs. once or future
- Wrong administration rate
- No administration rate
- Refill information missing or erroneous

#### Miscellaneous

- Unable to enter desired order
- Staff workload increase and/or order not processed or delayed
  - Order missed
  - Data loss
  - Order entered prior to admission
  - Order wasn't renewed
  - Order not verified
  - Order was held
  - Hold order mismatched
  - Order was confusing: Order needed to be clarified
  - Order was confusion: Missing info/incomplete order



Order was confusing: Comments field has conflicting information

- Routing issue
- Missing or incorrect SIG/patient instructions
- Nursing process/administration issues
- Erroneous alert
- Ordered wrong template /order set
- Discontinuation issues
- Verbal/Telephonic issues
- Corollary order issues
- IV flush issues
- Controlled substance issues
- No valid order
- Administration/order label mismatch
- Monitoring
  - Order mismatch
  - Failure to act on critical lab
  - Inadequate monitoring
- Order entered under incorrect MD
- Ordered wrong non-drug product
- Electronic order correct; hard copy ordered incorrectly

## WHY it Happened

### CPOE – Order Entry Issues

- System interface/usability/visual display issues
  - Pull-down menu issues
  - SALA/LASA issues
  - Instructions/meds in comment field were not seen
  - Comments field or free text confusing/confusion
  - Use of system or SIG abbreviations
  - Computer dosing calculation issues
  - Weight information not available/inaccurate
  - Initial vs. continuing order issues
  - Discontinuation order issues
  - Hold orders
  - Order/reorder modification issues
  - Lack of transparency in duration/renewal status
  - CDS failure/problem
  - Order set/template/protocol issues
  - Issues with favorites
  - Patient information on screen after order was filed
  - Visual display confusing or inadequate
  - Transcription (copy/paste)
- System limitations/inadequacy
  - Drug formulary issues
  - Build issues—route/drug not in CPOE
  - Drug dictionary miscode/out-of-date drug information
  - Inadequate field length
  - Inability/problems in titrating/tapering
  - Inability to enter alternate day dosing
  - Error in default dose or schedule
  - Default SIG or other default issues
  - Scheduled drug routing issue
  - Pharmacy routing issue
  - Corollary orders: timing to properly linked
  - Routing/mapping issue
- Drug allergy issues
  - Drug ordered as text, unable to check for allergy in text
  - Failure to alert
  - Drug allergy field limit
  - Drug allergy incomplete/unclear/conflicting

### Computer System Issues

- Computer down/outage
- Hybrid system (electronic & paper)
- eMAR/MAR issues
- Multiple systems (2 or more electronic systems)
- Pharmacy order entry problems/issues

Profiling issues—failure to perform or do correctly  
TPN issues

#### Transition Issues

Medication reconciliation issue  
Home medication issue  
Patient transferred (within hospital)  
Patient discharged (out of hospital)  
Transferred from outside hospital

#### User Issues

Communication issues  
2 different clinicians entered  
Misinterpretation of order(s)  
Lack of computer training/system knowledge  
Inexperienced end user  
Failure to verify patient identification  
Failure to follow established procedures or protocol  
Lack of protocol knowledge  
Calculation error  
Lack of clinical knowledge  
Alert ignored/overridden  
Typing error  
Nursing administration

#### Miscellaneous/Patient Issues

#### Insurance Issues

#### Patient Access Issues

#### Inaccurate/Inadequate Patient Drug Knowledge

#### Administrative Issue/Delay

**Possible PREVENTION Strategies****Clinical Decision Support (CDS) Enhancements****Ordering facilitators/alerts****ALLERGY**

- Drug allergy checking (including class)
- Standardized SIGs

**DUPLICATE**

- Duplicate order checking/support
- Duplicate therapy checking/support

**DOSING SUPPORT**

- Dose availability checking
- Default dosing selections
- Dose range checking
  - Individual dosing calculations
- Auto-calculations for combinatory and other complex dosing regimens
- Dose conversion support
- Titration/dose change – better system for entering/conveying
- Scheduling feedback

**DURATION SUPPORT**

- Drug duration support
  - Drug expiration support
- Reminders about automatic stop dates/need for re-order drug

**route/mix/diluent****DDI**

- Drug-drug interaction checking

**COMPATIBILITY**

- Route formulation checking (eye drops, ear)
- Patient access route guidance
- IV mix support (IV compatibility, how to mix)
- Enhanced ability to modify orders and regimens (tapers)
- Auto calculation for prescription quantities
- System for reconciling new/now with continuing dosing

**FORMULARY**

- Formulary status and restrictions warnings
- Alerts for non-formulary medications
- Generic substitution

**DRUG LAB**

- Drug-laboratory linking checking
- Automatic corollary lab orders

**DRUG DISEASE STATE**

- Drug-disease alerting



Pregnancy alerting

#### MISCELLANEOUS WORK FLOW DESIGN FACILITATORS

- Order set support
- Protocol support
- Automatic corollary products/supplies
- Blank field checking

#### Alert Tiering Enhancements

- Hard stops
- Tiered alerts with hard stops when necessary

#### Management Support (Policies/Infrastructure/Standards)

- Order set QA testing/updates
- Standardize product formulation naming
- Standardized constructs for dosing regimens
- Standardized constructs for dose form-route
- Comment field display
- Communication related to hold orders
- Systems integration
- Electronic transmission of Rx
- Remove option to e-scribe federally controlled substances
- Staff authorization issues
- Improved downtime procedures
- Improved patient registration workflow/logistics
- Operationalize TPN and IV queues
- Tie into internal scheduling
- Direct order entry: Verbal/Telephonic issues
- Medication handoff/transfer standardization

#### Enhanced Education/Training

- Standardized SIGs
- Standardized weights (only in kilograms)
- Enhanced allergy entry for drugs not included in allergy list

#### Improved Design/Functionality

- Reminders for Staff
- Facilitation of products selection by pharmacists instead of MD
- Unlimited number of medication allergies
- Include a picture of the patient on the ordering screen
- Indication on prescription
- Include time in pick list (actual time)
- Patient location support
- Patient route access availability: IV access NPO
- Provide links to clinical references
- Tallman lettering
- Order set/sentences for complex tapers
- Order set/sentences for range orders
- Weight-based dosing

Medication reconciliation support

**Other CPOE & System Enhancements**

Indication on prescription (standardized SIG)

Mapping standards

Direct order entry: Verbal/Telephonic issues

Direct order entry and transmission of controlled substances

DEA direct order entry

**Drug Database Improvements/Enhancements**

**Other Pharmacist Interventions**