Clinical decision support systems-based interventions to improve medication outcomes: A systematic literature review on features and effects

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Abstract

Background: Clinical decision support systems (CDSSs) interventions were used to improve the life quality and safety in patients and also to improve practitioner performance, especially in the field of medication. Therefore, the aim of the paper was to summarize the available evidence on the impact, outcomes and significant factors on the implementation of CDSS in the field of medicine.

Methods: This study is a systematic literature review. PubMed, Cochrane Library, Web of Science, Scopus, EMBASE, and ProQuest were investigated by 15 February 2017. The inclusion requirements were met by 98 papers, from which 13 had described important factors in the implementation of CDSS, and 86 were medication-related. We categorized the system in terms of its correlation with medication in which a system was implemented, and our intended results were examined. In this study, the process outcomes (such as: prescription, drug-drug interaction, drug adherence, etc.), patient outcomes, and significant factors affecting the implementation of CDSS were reviewed.

Results: We found evidence that the use of medication-related CDSS improves clinical outcomes. Also, significant results were obtained regarding the reduction of prescription errors, and the improvement in quality and safety of medication prescribed.

Conclusion: The results of this study show that, although computer systems such as CDSS may cause errors, in most cases, it has helped to improve prescribing, reduce side effects and drug interactions, and improve patient safety. Although these systems have improved the performance of practitioners and processes, there has not been much research on the impact of these systems on patient outcomes.

Keywords: Clinical decision support system, Medication, Significant factors, Patient outcomes, Systematic review

Conflicts of Interest: None declared

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↑What is “already known” in this topic:
• CDSSs can help to reduce ADEs, medication errors, DDIs, improve patient safety, and medicine prescriptions.
• CDSSs have the potential to promote practitioners’ performance.
• DSS can lead to improved care and patient safety.

→What this article adds:
• Studies have shown that DSS has led to improvements in drug-related activities
• The integration of CDSS with other systems, in particular CPOE, is one of their key success factors, helping to enhance the effectiveness of the system.
• The participation of key personnel in the system development is also one of the key success factors of DSS system implementation
• Practitioners’ performance has also been improved with the use of DSS.
• Few studies have been conducted concerning the DSS effect on the outcomes of patients and economies, so it is recommended that further studies should be conducted in this regard.
• Almost all CDSS studies reported positive findings for clinical processes’ outcomes.
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Introduction

Recently, extensive attention has been paid to reduce medical error and in particular, medication errors (1) as one of the most common errors in medicine (2, 3). Medication error is one of the main concerns of health care (2). According to the Institute of Medicine report, nearly 80,000 people are admitted to hospital in the United States every year from whom, 7000 die as a result of medication errors that 32-69% of them are definitely or probably preventable (4). The consequences of medication errors, in addition to complications (adverse events) in patients, result in the imposition of financial burdens on the health care system (3), in such a way that it harms at least 1.5 million people a year and adds $3.5 billion to the hospital costs (2).

Medication errors often occur during prescribing procedures (5, 6). One study reported that the incidence of prescription error was 3 to 99 errors per 1000 prescriptions in hospitalized patients, leading to adverse events (ADEs) (6), and drug-drug interactions (DDIs) (3) that by accessing timely information and having a sufficient knowledge base, such as using the computer physician order entry system (CPOE) system, CDSS, or both (1) are potentially preventable (7).

It seems that one of the most important strategies to reduce errors is to simplify the work procedures and limit paperwork (5).

Information technology (IT), by automating tasks and monitoring actions, can reduce workload and increase productivity; therefore, it can reduce errors (8), improve patient safety (3) and also solve human problems (7). As a result, the use of IT-based programs has attracted the attention of many healthcare settings (2, 3). CDSS as one of the IT-based interventions has been known as a promising strategy to prevent medication errors (9-15).

It has also been considered as one of the most effective and efficient tools for improving prescription, avoiding adverse events, and optimizing correct drug dosing (16). Computerized decision support through drug recommendations, drug-allergy checks, and DDIs advice can help to select a correct drug (17). Hunt et al. defined computer-based: "clinical decision-making programs designed to specifically assist in matching the characteristic features of each patient with a computerized information base to provide patient-specific evaluation or advice to be sent to the clinician" (18). In this study, we term CDSS means the computerized physician order entry, the clinical decision support system, or electronic prescription.

DSS compliance with recommendations will enhance the ability to change behavior significantly, appropriately, and consistently. Thus, DSS may result in the appropriate entry to information, thus evidence use, clinical decision-making, and enhanced care quality. In addition, studies have shown that DSS, by reducing side effects, in addition to savings cost, increases the efficiency of patient care and saves the time of physicians (14). DSS can also collect information for easy examination, counseling, and provision of alternative suggestions that are not immediately become apparent to a clinical specialist. Therefore, one of the most important goals of CDSS is improving the quality of care and paying attention to safety features (19).

To our best knowledge, a number of systematic reviews (SRs) has been performed on CDSS impacts, but they have only reviewed a particular aspect of medication, such as drug prescription and management (20-23), ADEs (24), therapeutic drug monitoring and dosing (25), DDIs (3), medication dosing assistants (26), reduction of prescription errors (27), reduction of unsafe prescription (28), medication safety (29, 30) and assisting in changing prescription practice (31). Many studies have also been conducted on the factors affecting the implementation of CDSS and several factors have been identified (3, 31-45). Therefore, in the present systematic literature review, we aimed to comprehensively examine the effects of CDSS on more areas of medicine (reducing ADEs, DDIs, medication errors, prescription improvement, medication adherence, dosing, medication safety, and monitoring) rather than focusing on a particular aspect, to assess the CDSS impact on the performance of practitioner and outcomes of the patient, and finally to identify the most effective factors affecting the implementation of CDSS to help new developers.

Methods

Search strategy

PubMed, Web of Science, EMBASE, ProQuest, Scopus, besides databases of the Cochrane Library, were searched until 15 February 2017. The searches were not limited by language (studies in other languages were omitted due to incompatibility with the aim of this study).

The search strategy was based on a combination of the following two concepts: CDSS and significant factors affecting the implementation of CDSS. In this regard, the relevant systematic reviews were identified and then screened for inclusion.

The search query for the PubMed database is as follows: 1- (“systematic review” OR “meta analysis”) 2- (“Decision Support System” OR “Clinical Decision Support System” OR “Clinical Decision Support” OR (Decision Support AND Clinical) OR (Support AND Clinical Decision)) 3- (Achievement OR “success factors” OR “system success” OR “effective systems” OR “effectiveness of CDS systems” OR “critical factor” OR “key features” OR “features critical” OR Effect OR “features effective” OR effectiveness OR “Impact Assessment” OR Influence OR improvement OR quality OR safety OR efficacy OR “quality assurance” OR Enhancing OR development OR “Cost effectiveness” OR “cost-effectiveness”)
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4-1 AND 2 AND 3

Selection of studies

The search results were entered into the EndNote software, and the duplicates were removed and re-checked manually. The articles were then screened based on the titles and abstracts. A total of 665 articles was identified. By reviewing the full text of the articles, 98 papers were eventually included in our study (Fig. 1).

Inclusion and exclusion criteria

The systematic reviews assessed the CDSS efficiency in the field of medication were included in this review, including prescription, dosing, reducing medication errors, drug monitoring, Rx CDSS, medication management, medication safety, ADE, drug allergy, and DDIs. We included studies if they had; 1) assessed CDSSs (including clinical decision support system, electronic prescription, and computerized physician order entry system) that had been implemented in the field of medication such as; medication prescription, reducing medication errors, ADEs, drug-allergy checking, drug dosing support, and etc., and 2) evaluated significant factors affecting CDSS implementation. We excluded non-systematic review studies, commentaries, opinion papers, editorials, conference proceedings, summaries etc.

Review procedures and data extraction

We extracted data to summarize the key features of systematic reviews, including information about the researcher and publication year, research objective, assessed outcomes, and the review’s results, as well as information about significant factors affecting CDSS implementation in the included studies.

Three thousand three hundred electronic records (after eliminating copies) were recognized using a combination of search techniques, and then they were examined for eligibility. First, all titles and abstracts were screened by two reviewers independently to distinguish related investigations on the basis of the present research aims. For a full review, 665 hypothetically eligible works were chosen among the citations. In the next stage, to be included in the final review, the full-text papers independently were reviewed in detail based on the above-mentioned inclusion criteria. Any disagreement was resolved either through discussion or involving a third reviewer. In order to handle citations, Endnote version X7 was applied.

Classification of interventions and research outcomes

The system was classified in terms of its correlation with medication in which a system was implemented, and our intended results were examined. In this review, the interest outcomes, in turn, were classified as the process outcomes (e.g., prescription, drug-drug interaction, drug adherence, etc.), patient outcomes, and significant factors affecting the implementation of CDSS.

Results

Description of the studies

PRISMA flow diagrams of included and excluded studies are shown in Figure 1. In total, 4815 publications were obtained with the search strategy, from which 3300 studies
remained after the duplication removal. We screened the titles and abstracts and also reviewed the full text of 665 articles. Finally, 98 articles met the inclusion criteria from which 86 were medicated-related, and 13 had reported the successful system implementations.

About a third (27/85, 31.7%) of the articles were focused on prescription (14, 23, 32, 40, 46-68), eight reviews had evaluated interventions which were aimed at ADEs (24, 69-75), four studies had followed the drug dosing (25, 76-78), nine reviews were focused on medication error reduction (22, 27, 71, 74, 79-85), five reviews were about medication management (1, 20, 86-88), five reviews had discussed medication practice (89-93), six studies had assessed the effect of system on medication use (94-99), four reviews were about medication practice (89-93), six studies had assessed the effect of system on medication use (94-99), four reviews were about medication adherence (102), one study had assessed the impact of DDIs (13), thirteen reviews were focused on the effects of CDSS on practitioners’ performance and outcomes of patients (21, 26, 103-113) and thirteen reviews had analyzed the significant factors affecting CDSS implementation (35-38, 43, 107, 114-120).

**Synthesis of evidence (interventions’ Efficiency)**

In this part, study results were classified based on medication-related processes, patient outcomes, besides significant factors affecting the implementation.

### Impact on the medication-related processes

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<th>CDSS focus (study objective)</th>
<th>Effect measures</th>
<th>Main findings</th>
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</thead>
<tbody>
<tr>
<td>(24)</td>
<td>The relationship between CPOE and CDS and the occurrence of an adverse drug event (ADE)</td>
<td>Decreased ADEs</td>
<td>80% decrease in ADEs by using CPOE with CDS</td>
</tr>
<tr>
<td>(69)</td>
<td>Identification of automated/non-automated systems that can eliminate/reduce prescriptions that may cause ADEs at the patient level and their effectiveness</td>
<td>Eliminate/reduce prescriptions</td>
<td>Various systems, including CPOE with CDS can reduce/eliminate prescription of medications that cause ADEs. However, little evidence exists for supporting that. To show the benefits of such systems in medical care, further studies are required.</td>
</tr>
<tr>
<td>(70)</td>
<td>Assessing the effect of computerized laboratory alerts on lowering ADEs rate and process outcomes</td>
<td>Promotion of choosing clinical outcomes and process outcomes</td>
<td>No evidence exists about the usefulness and benefits of computerized clinical alerts. However, there was some improvement in process outcomes, including changes in laboratory behaviors and prescribing behavior. Therefore, more evidence is needed to prove the usefulness of such systems in electronic medical records.</td>
</tr>
<tr>
<td>(71)</td>
<td>Assessing the effect of CPOE on elimination/decrease in medicine errors and ADE</td>
<td>Elimination/decrease in medicine errors and ADE</td>
<td>Findings showed that automated prescription and decision support system could be useful in the elimination/decrease in medicine errors and ADE in clinical settings such as hospitals.</td>
</tr>
<tr>
<td>(72)</td>
<td>Assessing various clinical alerts such as pharmacy and laboratory signals currently used to measure ADEs in hospital</td>
<td>Promoting ADEs’ detection</td>
<td>The results showed that clinical alerts such as pharmacy and laboratory signals had been improved to identify ADEs. However, more research on this subject is needed to assess the use of such signals and CDS systems in different settings and analyze the system economically.</td>
</tr>
<tr>
<td>(73)</td>
<td>Detecting factors that are most effective in the elimination/reduction of medication error and evaluating the effect of CPOE in the elimination/reduction of preventable ADEs</td>
<td>Substantial decrease in medication errors and preventable ADEs</td>
<td>More than 50% use of CPOE to decrease preventable ADEs and medication errors</td>
</tr>
<tr>
<td>(74)</td>
<td>Measuring the cost-effectiveness of CPOE and its capability to eliminate/reduce preventable ADEs and medication errors</td>
<td>Elimination/reduction of preventable ADEs and medication errors</td>
<td>The combination of CPOE and decision support systems can eliminate/reduce SDEs and medication errors</td>
</tr>
<tr>
<td>(75)</td>
<td>Measuring the capability and economic usefulness of drug interaction detection software (DIS) in elimination/reduction of ADEs</td>
<td>ADEs’ rate did not change</td>
<td>The outcomes of DIS (benefits, consequences, and economic usefulness) and its effect on drug safety were not detected.</td>
</tr>
</tbody>
</table>

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**Impact on processes of prescribing:** Of twenty-seven studies investigating prescribing-condition, twenty-four studies showed positive effects such as prescription improvement, improvements in appropriateness of drug prescription, reduction in prescription errors, optimizing prescriptions, and reducing unsafe or unnecessary prescription (14, 23, 32, 40, 46-52, 55, 57-68), and also three studies demonstrated the effectiveness of CDSS on prescription improvement that were not convincing (53) and required more investigation (54, 56).

**Impact on adverse drug events (ADEs):** Three out of eight studies showed an improvement in reducing drug side effects (24, 71, 74). Results of other studies have shown that using integrated DSS with CPOE prevent prescription of medications that cause side effect (69). Predicting ADE in clinical settings (72), and reducing ADE by 50% using COPE were among other benefits of this system (73). Other studies either did not show any changes in ADE rate or showed a non-conclusive effect of the system on ADE (121, 122). This information is given in Table 1.

**Impact on drug dosing:** As presented in Table 2, In this category, studies reported that CCDSS could help to improve the care process through drug monitoring and dosing (25), increase the initial dose of the drug with computerized recommendations, reduce the time spending in hospital (77, 78) and control the treatment faster through dose adjustment (76).
Clinical decision support systems-based interventions to improve medication outcomes

Impact on medication errors: Almost half of the studies (44%) showed that, CDSS system, particularly when integrated with CPOE, lead to a reduction of medication error (27, 74, 80, 84). Other studies have pointed to the effectiveness of electronic prescribing in the reduction of medication error and ADE (71). Moreover, HIT especially DSS,

<p>| Table 2. The effect of CDSS on drug dosing |</p>
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<tr>
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<th>CDSS focus (study objective)</th>
<th>Effect measures</th>
<th>Main findings</th>
</tr>
</thead>
<tbody>
<tr>
<td>(25)</td>
<td>Evaluating the effect of CDSS on therapeutic drug monitoring and dosing (TDMD)</td>
<td>Therapeutic drug monitoring and dosing (TDMD) process improved</td>
<td>CDSS can improve the therapeutic drug monitoring and dosing (TDMD) process, especially vitamin K and insulin dosing. However, CDSS should be developed further and then it should be assessed through different studies using different research methods, particularly in terms of drug safety and patient outcomes. CDSS can improve the therapeutic drug monitoring and dosing (TDMD) process, especially vitamin K and insulin dosing. Findings referred to the ability of CDSS in adjusting the dose of anticoagulant</td>
</tr>
<tr>
<td>(76)</td>
<td>Assessing the capability of a computerized decision-making system in anticoagulant treatment</td>
<td>The computerized decision-making system improved dose adjustment</td>
<td>Computerized medication dosing had many benefits, including a major reduction in the toxicity of drugs, an increase in serum concentration and primary, dosing and shorter treatment time and hospitalization, thus, no effect on side effects.</td>
</tr>
<tr>
<td>(77)</td>
<td>The effect of electronic advice on medication dosing</td>
<td>Major reduction in the toxicity of the drug, an increase in serum concentration and primary, dosing and shorter treatment time and hospitalization, thus, no effect on side effects.</td>
<td></td>
</tr>
<tr>
<td>(78)</td>
<td>Evaluating the computerized medication dosing compared to non-computerized medication dosing</td>
<td></td>
<td>Computerized medication dosing has many benefits, including increased serum concentrations, reduced hospitalization, and significant reduction of side effects.</td>
</tr>
</tbody>
</table>

<p>| Table 3. The effect of CDSS on medication errors |</p>
<table>
<thead>
<tr>
<th>References</th>
<th>CDSS focus (study objective)</th>
<th>Effect measures</th>
<th>Main findings</th>
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</thead>
<tbody>
<tr>
<td>(79)</td>
<td>Assessing the effect of different interventions on reduction of medication errors in critical care units</td>
<td>Reduction of medication errors</td>
<td>Clinical decision making (SCCD) support system decreased medication errors by 67%. However, there is not much evidence to suggest that such systems can reduce medication errors.</td>
</tr>
<tr>
<td>(80)</td>
<td>Assessing the effect of different interventions on reduction of medication errors in NICUs</td>
<td>Reduction of medication errors</td>
<td>CPOE with a decision support system, medication errors, and BSs may decrease medication errors</td>
</tr>
<tr>
<td>(22)</td>
<td>Evaluating the effects of Decision Support System (DSS) in the health care</td>
<td>Improving the care quality and patient safety, including elimination/reduction of medication and clinical errors, increasing the economic efficiency, and increasing the knowledge of staffs</td>
<td>Decision-making support system (DSS) increased compliance with standard care and medication guidelines and also helps healthcare professionals to eliminate/reduce medication and clinical errors. It also increased economic efficiency and consequently increased the quality of care.</td>
</tr>
<tr>
<td>(27)</td>
<td>Assessing the effect of different interventions on reduction of medication errors in children's wards</td>
<td>Reduction of medication errors</td>
<td>Medication errors in pediatric wards will be reduced if correct and standard definitions are to be used, and also assessing economic efficiency would also help to achieve desired outcomes.</td>
</tr>
<tr>
<td>(71)</td>
<td>Evaluating the risk of medication error and ADE by CPOE.</td>
<td>Decrease in medicine error and ADE risk</td>
<td>A computerized prescription system is an effective tool that can eliminate/reduce medication errors and ADEs in clinical settings</td>
</tr>
<tr>
<td>(74)</td>
<td>Assessing the advantages and barriers to the implementation of the CPOE system in clinical settings, and also assessing the effects of the system in ADEs and medication errors</td>
<td>Decrease in medical errors and ADEs,</td>
<td>The combination of CPOE and CDSS systems can potentially eliminate/reduce medication errors and ADEs. The unwillingness of healthcare professionals and the high implementation costs are among the barriers</td>
</tr>
<tr>
<td>(84)</td>
<td>Assessing the effect of CPOE on patient safety</td>
<td>CPOE system has a better effect on medication errors and ADEs when is used concurrently with CDSS resulting in increased patient safety</td>
<td>Significant reduction in medication errors and ADEs were not seen when a CPOE system alone was implemented; however, the combination of CPOE and CDSS had a greater impact on medication errors’ reduction and increased patient safety</td>
</tr>
<tr>
<td>(82)</td>
<td>Evaluating the health information technology impacts on quality, efficiency, and cost-effectiveness of care</td>
<td>Information technology increased the adherence to care based on guidelines, improved monitoring and a decrease in medication errors.</td>
<td>The majority of research has been conducted on CDS and electronic health record systems. Several interventions influenced the quality of care, such as increasing adherence to care based on guidelines, improving monitoring/surveillance, and reducing medicine errors.</td>
</tr>
<tr>
<td>(85)</td>
<td>Studying the features of electronic Patient Medication Record (ePMR), including alerts and patient safety measures during the prescribed time at the pharmacy</td>
<td>Patient Medication Record (ePMR) was effective in alerting staffs about clinical risks</td>
<td>The features of the electronic Patient Medication Record (ePMR), including alerts and patient safety measures, were effective in alerting staff about clinical risks during the prescribed time. There were also some problems, including false alerts and performance inconsistencies. More study is needed on this subject in different countries and settings.</td>
</tr>
</tbody>
</table>

http://mjiri.iums.ac.ir
Med J Islam Repub Iran. 2021 (22 Feb); 35:27.
has helped to improve the quality of care by improving disease assessment and compliance with clinical guidelines as well as reducing medication errors (82). DSS models have helped the physicians in selecting collect systems to achieve significant outcomes such as reduction of medical and medication errors (22). However, a study showed that interventions could not exclusively be effective in reducing medication errors (79), as are displayed in Table 3.

**Impact on medication management:** In regard to the effects of DSS on medication management, as presented in Table 4, studies have shown that such systems promote the quality of care and improve medication management (86). The use of DSSs that offer reminders and feedback is beneficial in improving medication use and different behaviors related to medication management (1). However, few studies have been conducted on patient safety threats or monitoring of side effects (20).

**Medication practice:** Almost all studies have shown the effect of DSS on the medication interventions, outcomes improvement, drug safety and reducing medication errors (91), promotion of professional activity, change in the field of alcohol and other drugs (AOD) using of reminders or

### Table 4. The effect of CDSS on medication management

<table>
<thead>
<tr>
<th>References</th>
<th>CDSS focus (study objective)</th>
<th>Effect measures</th>
<th>Main findings</th>
</tr>
</thead>
<tbody>
<tr>
<td>(1)</td>
<td>Evaluating the effects of computerized systems (reminders or feedback) to support medication management of patient safety and medication management</td>
<td>Enhanced patient safety and adherence to medication regimen, enhanced medication management, enhanced generic prescribing of medication</td>
<td>Computerized systems (reminders or feedback) can enhance medication management. Factors that affect implementation should also be considered</td>
</tr>
<tr>
<td>(20)</td>
<td>Exploring the effects of different intervention such as medication management in ambulatory care on patient safety</td>
<td>In general, no risk to patient safety was found</td>
<td>There is no evidence to suggest that, implementation of electronic medication management systems in ambulatory settings can potentially cause risks or harms to patients</td>
</tr>
<tr>
<td>(86)</td>
<td>Exploring the effect of medication management information technology (MMIT) on all medicine management phases</td>
<td>Enhanced prescribing behavior, adherence to medication advice, and reduced costs</td>
<td>MMIT enhanced medication management. The care quality was improved by approximately half of the MMIT interventions; however, little research has evaluated clinical outcomes</td>
</tr>
<tr>
<td>(87)</td>
<td>Exploring the effects of multifaceted interventions in the improvement of depression outcomes in primary care</td>
<td>Promote more active medication management</td>
<td>Factors, including qualified care managers, patient support system, patient education, continuous monitoring, and decision support system is important in medication management</td>
</tr>
<tr>
<td>(88)</td>
<td>Exploring the effects of health information technology on all stages of the medication management process (drug prescribing, ordering, communication, dispensing, administration, and monitoring as well as education and reconciliation).</td>
<td>Moderate to significant improvement in care with the implementation of MMIT</td>
<td>Studies that have been investigating the cost-effectiveness and clinical outcomes of the MMIT system had ambiguous results. However, some qualitative studies have found different perceptions of MMIT effects and outcomes.</td>
</tr>
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</table>

### Table 5. The effect of CDSS on Medication practice

<table>
<thead>
<tr>
<th>References</th>
<th>CDSS focus (study objective)</th>
<th>Effect measures</th>
<th>Main findings</th>
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</thead>
<tbody>
<tr>
<td>(89)</td>
<td>Identifying electronic decision support systems that directly support pharmacists in the hospital or community settings</td>
<td>Enhanced medication therapy</td>
<td>Very little evidence exists in the literature that explores electronic decision support system activities for pharmacy or pharmacists, in comparison to the countless related literature for healthcare.</td>
</tr>
<tr>
<td>(90)</td>
<td>Exploring the implementation of clinical guidelines in pharmacies</td>
<td>CDSS had a significant effect on the outcomes</td>
<td>Currently, very little evidence exists to prove that, implementation of clinical guidelines has a positive impact on outcomes of patients. No evidence exists to suggest the best implementation method</td>
</tr>
<tr>
<td>(91)</td>
<td>Evaluating the health IT impact on the quality, safety, and efficiency of healthcare</td>
<td>Positive effect on patient safety reduced medication errors</td>
<td>Many studies referred to the benefits of using CDSS and CPOE. Many studies that have explored the effect of implementing health IT on patient improving patient safety and reducing medication errors</td>
</tr>
<tr>
<td>(92)</td>
<td>Improved adherence to guidelines, increased overall prescription time, increased in unattended alerts</td>
<td>Improved adherence to guidelines, increased overall prescription time, increased in unattended alerts</td>
<td>Not much evidence exist to demonstrate that CPOE systems improve safety and decrease costs in outpatient situations. Nevertheless, many studies have found evidence in favor of improved adherence to guidelines, increased overall prescription time, increased in unattended alerts. The results suggested the use of d reminders and feedback to improve AOD. More specific studies are required to explore the use of reminders and feedback in AOD-related activities in clinical settings.</td>
</tr>
<tr>
<td>(93)</td>
<td>Identifying the most effective strategies related to alcohol and other drugs (AOD)</td>
<td>The use of reminders had a moderate to significant effect on process outcomes. Improved prescribing and adherence to guidelines. Major improvement in professional practice and client outcomes. Reminders should be used in general medicine clinics to improve alcohol counseling. Feedback indicated 1-16% improvement in professional practice.</td>
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feedback (93), and reduction of the cost (92). These are presented in Table 5.

Impact on medication usage: Table 6 shows that half of the studies have been examining the interventions that facilitate the proper use of polypharmacy in elderly people, which indicated the improvement in reduction of incorrect prescription (94, 98, 99). Furthermore, strategies such as electronic alarms have been proven to be effective in the better use of medications, especially in the short term (95). Studies have shown that the decision-making support system and the use of medication were the most common practice and strategies (56%), (96).

Impact on medication safety: Various studies have been conducted on drug safety and the use of different approaches, which indicated that DSS, in particular when integrated with CPOE, has been associated with the reduced drug errors and improved drug use (30). DSS leads to improvements in care processes and reduction of drug errors and positively effects drug dosing and patient outcomes (29). Also, these interventions have a significant impact on reducing the risks to safety, which consequently leads to a significant reduction in drug errors, especially during the interaction between the doctor and the pharmacist (28) as presented in Table 7.

Impact on monitoring practices: Nieuwlaat et al. concluded that, for therapeutic drug monitoring and dosing (TDMD), CCDSS help to improve the process of care, but there are no clear results about their effect on patient outcomes (25). Fischer et al. showed that, regarding the role of HIT interventions in monitoring laboratory drugs for ambulatory settings, there are not many studies and conclusive evidence; therefore, more research is needed to clarify it (101). This information is presented in Table 8.

Impact on medication adherence and Drug-drug interactions (DDIs): Table 9 indicate that studies on drug adherence and drug interactions, IT-based interventions, especially DSS, have been the most effective interventions to improve drug adherence and drug interactions (13, 102).

Impact on practitioners’ performance and patient outcomes

In Table 10, thirteen studies showed the positive impact of DSS systems on the quality and efficiency of care (21, 26, 103-113). CPOE and DSS have had a positive effect on patient safety outcomes (113), and have played an im-

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Table 7. The effect of CDSS on Medication safety

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<tr>
<td>(28)</td>
<td>Evaluating the effects of CDSS on therapeutic drug monitoring and dosing (TDMD) in randomized controlled trials (RCTs)</td>
<td>Decrease in medicine errors and negative drug measures</td>
<td>In general, IT interventions are believed to decrease medication errors. However, IT interventions are not without safety hazards.</td>
</tr>
<tr>
<td>(29)</td>
<td>The effect of CDSS on drug safety.</td>
<td>Decrease in medication error rates.</td>
<td>CDSS decreased medicine error and enhanced the care process; however, it did not improve outcomes significantly.</td>
</tr>
<tr>
<td>(30)</td>
<td>Improving drug safety by using CPOE and CDSSs.</td>
<td>Improved therapeutic drug monitoring and dosing (TDMD)</td>
<td>CDSSs and CPOE may dramatically decrease medicine error and provide further vital benefits associated with the use of medicine.</td>
</tr>
<tr>
<td>(100)</td>
<td>Exploring different interventions to prevent drug safety in hospitals.</td>
<td>Improvement in safety, mediation administration, and reduction of drug errors.</td>
<td>Evidence suggests the effectiveness of interventions in reducing medicine errors and negative drug measures. However, the results of a number of studies contradict this.</td>
</tr>
</tbody>
</table>

Table 8. The effect of CDSS on medication monitoring

<table>
<thead>
<tr>
<th>References</th>
<th>CDSS focus (study objective)</th>
<th>Effect measures</th>
<th>Main findings</th>
</tr>
</thead>
<tbody>
<tr>
<td>(25)</td>
<td>Exploring different interventions to prevent drug safety in hospitals.</td>
<td>Improved therapeutic drug monitoring and dosing (TDMD)</td>
<td>CDSS can improve TDMD, particularly in the dosing of insulin and vitamin K; however, it needs to be further developed.</td>
</tr>
<tr>
<td>(101)</td>
<td>Identifying studies that have investigated the HIT interventions to enhance laboratory observing of chosen high-risk drugs in the ambulatory situation.</td>
<td>The was not enough evidence to demonstrate the effectiveness of interventions in reducing medicine errors and negative drug measures. However, the was not enough evidence to demonstrate the effect of HIT in improving laboratory observing of particular high-risk drugs for patients in ambulatory settings; thus, more studies are required.</td>
<td></td>
</tr>
</tbody>
</table>

Table 9. The effect of CDSS on medication adherence and Drug-drug interactions (DDIs)

<table>
<thead>
<tr>
<th>References</th>
<th>CDSS focus (study objective)</th>
<th>Effect measures</th>
<th>Main findings</th>
</tr>
</thead>
<tbody>
<tr>
<td>(102)</td>
<td>Assessing the most effective factors that influence patients’ adherence to medication therapy in patients with osteoporosis</td>
<td>Patient adherence to drugs improved</td>
<td>Findings indicated that factors such as making dosage regimen simpler, patient decision making support system, patient education, and electronic prescription system were most effective in patients’ drug adherence in patients with osteoporosis.</td>
</tr>
<tr>
<td>(13)</td>
<td>Evaluating the effects and characteristics of computerized interventions on the outcomes of DDI</td>
<td>Increasing DDI alert adherence and clinical outcomes with computerized interventions</td>
<td>The results showed that DDI alert adherence and clinical outcomes were increased by computerized interventions. The effect of DDI on the medication-related issues such as drug prescription, administration, and dispense at decision making time</td>
</tr>
</tbody>
</table>

Important role in the various aspects of drug management, patient outcomes, and cost-cutting (112). Bright et al. reported that CDSS is less effective in clinical and economic activities, and its success depends on providing the correct information at the right moment to the right person (109). With the integration of DSS with workflow, these systems can help improve professional performance in promoting preventive care, medication order, and adherence to guidelines. Computer reminders can lead to improvements in drug interaction warnings, drug prescriptions, and test orders (105, 108). Also, some studies have shown that DSS can improve the performance of experts by up to 76% using reminders and up to 66% using drug prescription or dosage systems, and also it can improve patient outcomes by up to 13% (107). In almost all of these studies, the impact of DSS on patient outcomes has been less widely considered therefore, we can hardly be conclusive about its impact.

Significant factors affecting CDSS implementation: In this section, we describe the most important factors affecting the implementation of CDSS mentioned in the studies as presented in Table 11.

In general, the findings of this study showed that most studies (about 30%) have considered key employees’ participation in the system development process (42, 117, 118, 123), support of key managers and personnel, training and monitoring of the system in the early stages of implementation (41, 42, 117, 118), and the need for the predictive role of specific systems or organizational features (31, 33, 35, 40) as the most important factors. Approximately 23% of the studies have considered factors such as integration of the system with other systems such as CPOE (3, 43, 114) and organizational workflow (3, 43, 114), and also implementing the system at the right time (34, 35, 44), and about 15% of the studies have considered the infrastructure and adequate resources (42, 123) as effective factors. In other studies, factors such as the provision of advice for practitioners and patients, and providing CDSS by the developers of the system (43), factors of the human, organizational and technology (37), user groups’ perceptions of significant

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<table>
<thead>
<tr>
<th>References</th>
<th>CDSS focus (study objective)</th>
<th>Effect measures</th>
<th>Main findings</th>
</tr>
</thead>
<tbody>
<tr>
<td>(107)</td>
<td>Assessing the effectiveness of CDSSs on practitioner performance and patient outcomes.</td>
<td>Improve practitioner performance, diagnosis, disease prevention and management, and drug dosing and prescribing.</td>
<td>CDSS system improves practitioner performance. However, more studies are required to demonstrate the effects of such systems on patient health.</td>
</tr>
<tr>
<td>(106)</td>
<td>Assessing the CDSS system impact on the performance of clinicians and outcomes of patients.</td>
<td>Improved clinical performance in drug dosing, disease prevention</td>
<td>CDSSs may enhance the care quality</td>
</tr>
<tr>
<td>(105)</td>
<td>Evaluating the effect of a CDSS on the performance of practitioners and outcomes of patients in hospitals.</td>
<td>Positive effect on practitioner performance and patient outcomes when combined with systems in drug prescription and preventive care reminder.</td>
<td>CDSSs can have a positive effect on the performance of practitioners and outcomes of patients when combined with preventive care reminder systems and drug prescribing system. CDSSs is constantly developing and changing, so newer CDSS systems probably have a greater effect on the performance of practitioners and outcomes of patients.</td>
</tr>
<tr>
<td>(104)</td>
<td>Evaluating CDSS impacts on the performance of clinicians and outcomes of patients.</td>
<td>Improved dosing of toxic drugs, quality of preventive care, and patient outcomes</td>
<td>Various CDSSs can improve practitioners’ performance. In order to evaluate their impacts and cost-effectiveness on outcomes of patients, in particular, more research is required.</td>
</tr>
<tr>
<td>(21)</td>
<td>Assessing CDSS impacts on courses of care and outcomes of patients through a cumulative synthesis of related RCTs.</td>
<td>Improved process of care and patient outcomes</td>
<td>CCDSs improved the process of care measures and patient outcomes. There was not enough evidence to support patient benefit, harms, and cost-effectiveness in adopting CDSSs for managing drug treatment.</td>
</tr>
<tr>
<td>(26)</td>
<td>The role of CDSSs in the management of medical issues in acute care situations.</td>
<td>Improved the process of care in medication dosing and management, alerts/reminders, management, adherence to guidelines and diagnosis</td>
<td>CCDSs improved the care course; however, outcomes of patients were not evaluated</td>
</tr>
<tr>
<td>(103)</td>
<td>Evaluating the clinical effectiveness of CDSSs and KMSs, identifying features that influence the success of CDSSs/KMSs, evaluating the impact of CDSSs/KMSs on outcomes, and identifying knowledge that can be integrated into CDSSs/KMSs.</td>
<td>The health care process was enhanced by CDSSs/KMSs</td>
<td>Various types of CDSSs/KMSs systems established locally and commercially are efficient in healthcare process development in different settings. They’re not much evidence on the effectiveness of CDSSs in clinical outcomes and costs.</td>
</tr>
<tr>
<td>(108)</td>
<td>Reviewing the studies conducted on CDSS and the integration of CDSS into the workflow.</td>
<td>Improved disease prevention, adherence to guidelines, and integration into the workflow.</td>
<td>Clinical decision support systems and practitioner performance are important; however, new technologies like them can create new challenges such as data inaccuracies, which may affect the workflow. Therefore, there is a need for further development of such systems to suit the needs of users</td>
</tr>
<tr>
<td>(112)</td>
<td>Identifying ways to promote the use of antibiotics through an electronic prescribing system in a clinical setting.</td>
<td>Enhanced dosing and choosing of antibiotics, enhanced adherence to clinical guidelines, reducing the use of antibiotics to prevent antibiotic resistance, reduced prescription and prescription errors, and reduction in negative medicine measures, duration of hospital stay, and drug hypersensitivity and reaction.</td>
<td>CPOE and CDS were the main interventions, but various aspects of drug management were also included. Clinical assessment such considers various factors, including processes, cost-effectiveness, and outcomes in order to better educate the public</td>
</tr>
<tr>
<td>(109)</td>
<td>Assessing the CDSS impact on clinical outcomes, workload and effectiveness, health care courses, cost, and patient satisfaction.</td>
<td>Positive effect on drug prescribing, preventive care, and clinical outcomes</td>
<td>CDSSs are effective at improving the health care process in diverse settings. However, more evidence is needed for clinical, economic, workload, or efficiency outcomes.</td>
</tr>
<tr>
<td>(110)</td>
<td>Evaluating the care courses and outcomes using decision support system and computer reminders at the care point.</td>
<td>Enhanced prescribing behaviors, minor to modest care enhancements</td>
<td>Computer reminders significantly improved care at the point of care. Insignificant improvements across a range of processes. However, in order to implement clinical information systems, the prospect of offering computerized reminders at the care point signifies a substantial drive. In order to ascertain crucial elements that facilitate or predict care promotion, further research is needed.</td>
</tr>
<tr>
<td>(111)</td>
<td>Exploring the relationship between HIT and medical practices and other health care and providing information for stakeholders to promote and maximize the uptake of HIT.</td>
<td>Considerable increase in physician compliance to drug type and dosage recommendation, reduction in pharmacists’ interventions for incorrect drug doses.</td>
<td>The results of this study may help the adoption of HIT/HIS and increase the uptake of evidence-based practice using HIT/HIS.</td>
</tr>
<tr>
<td>(113)</td>
<td>Investigating the health IT effects on safety outcomes of patients in all clinical areas.</td>
<td>Positive impact on patient safety outcomes.</td>
<td>There is a need for further research in different scenarios to comprehend better how health IT influences patients.</td>
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Factors affecting the implementation, technical and organizational support (119), the structure of healthcare organizations, information and decision processes, people policies, tasks, and incentives (120) have contributed to the success of the system.

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Table 11. Significant factors affecting CDSS implementation

<table>
<thead>
<tr>
<th>References</th>
<th>Result (critical factors in the implementation of CDSS)</th>
</tr>
</thead>
<tbody>
<tr>
<td>(37)</td>
<td>Human, organization, and technology factors</td>
</tr>
<tr>
<td>(123)</td>
<td>External context, the need for supportive laws and regulation, proper standards, policies and incentives, right organization condition, matching innovations with workflows, staffs’ knowledge and beliefs, processes and systems</td>
</tr>
<tr>
<td>(32, 115, 123)</td>
<td>Integrating systems in current organizational workflow</td>
</tr>
<tr>
<td>(119)</td>
<td>Users’ perceptions of significant factors in implementation, and technical and organizational support</td>
</tr>
<tr>
<td>(3, 43, 114)</td>
<td>The systems integration into other systems</td>
</tr>
<tr>
<td>(42, 117, 118, 123)</td>
<td>Engagement of key personnel in the system development and implementation processes</td>
</tr>
<tr>
<td>(41, 42, 117, 118)</td>
<td>Structure of healthcare organizations; information and decision processes; work policies and staffs’ incentives</td>
</tr>
<tr>
<td>(38)</td>
<td>Quality of the system and information, and usability of the system</td>
</tr>
<tr>
<td>(32, 115)</td>
<td>Hardware availability, technical support, and appropriate clinical messages</td>
</tr>
<tr>
<td>(42)</td>
<td>Features of the system itself and a supportive and appropriate environment to improve the quality of patient services</td>
</tr>
<tr>
<td>(31, 33, 35, 40)</td>
<td>The need for the predictive role of specific systems or organizational features</td>
</tr>
<tr>
<td>(45)</td>
<td>Appropriate attitude and skills of user with good leadership, appropriate IT environment and effective communication</td>
</tr>
<tr>
<td>(34, 35, 44)</td>
<td>Implementation of interventions by the system, the lack of user control over output, the retrieval of data from the electronic medical record and CPOE</td>
</tr>
<tr>
<td>(36)</td>
<td>Level of computer interface, provision of advice at the right time for decision making</td>
</tr>
<tr>
<td>(39)</td>
<td>Provision of an automated decision support system</td>
</tr>
<tr>
<td>(42, 123)</td>
<td>Executive support, understanding the business, IT-business relations, and leadership</td>
</tr>
<tr>
<td>(118)</td>
<td>Appropriate and right infrastructure and resources</td>
</tr>
<tr>
<td>(118)</td>
<td>Users’ experience and training</td>
</tr>
</tbody>
</table>

Discussion

Main findings

Previous studies have often measured the effects of CDSS on a particular area of medication, such as a prescription. However, to the best of our knowledge, these systematic reviews have not evaluated a wide range of areas. Therefore, this overview provides a comprehensive picture of the effects of CDSS on more aspects of the medication, such as reducing ADEs, DDIs and drug errors, improving prescription, drug adherence and dosage, drug safety and monitoring rather than focusing on a particular aspect. The present study also evaluated the CDSS impact on the performance of practitioners and outcomes of patients; finally, it identified the most effective factors affecting the implementation of CDSS to help the new developers.

We found evidence that the use of medication-related CDSS improves clinical outcomes. Also, significant results were obtained regarding the reduction of prescription errors and the improvement in quality and medication prescribed. These findings are in line with the results of other studies (33, 124-132). In relation to ADEs, significant improvements have been achieved in the clinical results of ADEs, which has been associated with clinical outcomes in other studies (133-136). Whereas in King et al.’s study, similar effects of ADEs were not found (137). Ranji et al. also showed that the possibility of error occurrence would be reduced if such programs are applied carefully, and the production of safer care systems is more closely followed (138). In regard to the reduction of medication errors, as with other studies, our findings showed that CDSS is one of the most effective strategies to reduce the risks of medication errors (137, 139-145). Our findings showed that CDSS could help physicians to determine the optimal dosage of the drug in proportion to the patient’s need, reduce unwanted side effects of the drug, and increase the benefits of treatment, which are consistent with the existing literature (146-150). Furthermore, when CPOE systems are integrated into a CDSS to alert doctors and other health care providers, the reduction of laboratory or medical errors and improvements in medication safety are significant. This is in accordance with the result of other studies (126, 151, 152). Kausha et al. showed that IT interventions might not be able to fully resolve drug safety issues, but they seem to be an effective approach (142). As seen in studies of Bindoff et al. and McCoy et al. (153, 154), our findings showed that CDSS systems could facilitate and improve medication management.

Drug-drug interactions are one of the most important and preventable issues through these systems. Tilson et al. reported that a process should be used to develop and maintain a standard set of DDIs for CDSS (155). Böttiger et al. concluded that, when paired with a clinical decision support system for DDIs, SFINX can be a useful instrument if employed (156). Saverno et al. showed that a comprehensive system, such as a CDSS, is necessary to improve the identification of potential DDIs (157). In our study, like the studies of Cox et al. (158) and Mahoney et al. (159), there were improvements in medication dosing and monitoring.

In regards to the effectiveness of CDSS in clinical practice and patient outcomes, studies have shown CDSSs are effective in changing the care processes and can improve performance (e.g., right drug dosing, appropriate prescribing of medication). However, few studies have demonstrated that CDSSs can improve patient outcomes (33, 160, 161). The results of some studies about improving patient outcomes are still unclear (162, 163). Moreover, Main et al. study indicated that the implementation of CDSS is time-consuming, complex and costly (164).

This study carefully evaluated critical factors that affect the implementation of CDSS from multiple perspectives. Different studies have also pointed to various factors. Participation and involvement of physicians in the process of CDSS development, from the beginning, play a significant role in accepting the usefulness of that system (165, 166). Our research results, like Varonen’s study, showed that having a positive view about the simple use of CDSS and understanding the benefits of patient outcomes as well as the usefulness of CDSS will cause physicians to use the
One of the most important factors stated by Reisman included the users' attitudes towards the system, and these findings are in line with the results of other studies (45, 190, 191). Other barriers to the implementation of systems that were stated by Reisman included the users' failure to use CDSS or the rejection of system recommendations by experts (191). Issues related to characteristics of system-specific and organizational and personal issues affect the acceptance of new technologies by physicians (192).

Studies showed that systems that perform the task automatically have a better performance than those that the system's users initiate them, and this is consistent with Kawamoto and Lobach's findings (36), but Hemens et al.'s study did not find this result (21). Adaptability and cost were two important factors that Lee et al. pointed out in e-health intervention (177).

Given the importance of preventing medication-related errors and safety issues, the use of CDSS systems is one of the main strategies for improving patient safety, practitioners' performance, and the quality and efficiency of care. There is also a need for the development of decision support tools that are consistent with a clinicians' workflow that is also customized, as they can have a positive effect on efficiency and cost-effectiveness.

**Strengths and limitations of the review**

One of the most important features of this study was that there was no specific language restriction in this study (studies in other languages were omitted due to incompatibility with the aim of this study). We almost tried to examine more aspects of the medication rather than focusing on a particular aspect.

This study has some limitations. One of these limitations was that related studies such as the grey literature and conferences might have been lost and may be relevant papers have been excluded due to the search terms. However, there are valuable conferences that might be even more relevant to the implementation of CDSS than those in grey literature. A variety of internationally-appropriated keywords and MeSH headings were utilized within areas of the search; however, some relevant papers may have been overlooked.

**Implications for further research**

Based on the findings of our review, this study highlights future directions in this area of research. Healthcare organizations would be better to be familiar with the system, its capabilities, and its applications in order to make a valuable and extensive investment in this area. Also, system providers can help improve system performance by providing and
designing user-friendly CDSS systems and knowledge-based tools to make the system use more effective. Educational programs before the implementation of the system for key users are other important factors that health care organizations should pay attention to. System integration into other systems such as CPOE, EHR, e-prescribing, and workflow and interoperability is also one of the key issues in the development of the system, which will be facilitated according to terminology and standards. Healthcare organizations can continue to encourage the use of this system by providing strong and appropriate infrastructure. However, more studies are needed to examine the effectiveness of CDSS on patient safety outcomes, to determine success factors in its implementation and also to investigate the effect of CDSSs on economic in clinical settings especially in the medication-related fields.

**Conclusion**

The results of this study show that, although computer systems such as CDSS may cause errors, in most cases, it has helped to improve prescribing, reduce side effects and drug interactions, and improve patient safety. Although these systems have improved the performance of practitioners and processes, there has not been much research on the impact of these systems on patient outcomes. Moreover, the factors such as the participation of key personnel in the process of development and implementation of the system, training, and monitoring of the system in the early stages of implementation, and the integration of the system with other systems, in particular CPOE, have been the most important factors influencing the success of CDSS implementation.

**Conflict of Interests**

The authors declare that they have no competing interests.

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