



## A Clinical Information System Research Landscape

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**A clinical information system is a collection of various information technology applications that provides a centralized repository of information related to patient care across distributed locations.**

### Summary

Clinical information systems (CIS) could drive progress in health care in the 21st century. We must examine the organizational and social issues surrounding these systems to truly understand their potential use, benefit, and impact on health care delivery overall. After extensive review of the literature on CIS research, we produced a "CIS research landscape." This landscape enabled us to examine and potentially improve delivery of health care services from the perspective of its major constituents (ie, patients and their families, clinicians, processes for delivering care, organizations, patient populations) by using the information captured in CIS. We then identified aspects of the care delivery system which need to be addressed to improve the quality of care delivered: the care must be safe, effective, patient-centered, timely, efficient, and equitable. In addition to the static picture of this research landscape, we needed to portray the research process and how it relates to operational aspects of health care delivery. The CIS research landscape that we describe should help researchers and research funders alike focus their time, effort, and money on important questions. The answers to these questions should in turn greatly improve the overall health care delivery process. In a subsequent article, we will describe how we used this research landscape in conjunction with the known operational, financial, technical, governmental, and social constraints of Kaiser Permanente (KP) to develop a specific CIS research agenda.

### Background

Information technology could drive progress in health care in the 21st century.<sup>1</sup> Although people have studied how to use technology to improve health care for over 50 years,<sup>2</sup> there remains much to learn if we are to take full advantage of this potential.<sup>3</sup>

A recent *Institute of Medicine* report, *Crossing the Quality Chasm: A New Health System for the 21st Century*, identified the development and application of more sophisticated clinical information systems (CIS) as essential for health care.<sup>4</sup> Vigorous research is needed on all aspects of CIS for health care for full leverage of state-of-the-art technology to deliver the highest-quality, lowest-cost patient care.

A clinical information system is

a collection of various information technology applications that provides a centralized repository of information related to patient care across distributed locations. This repository represents the patient's history of illnesses and interactions with providers by encoding knowledge capable of helping clinicians decide about the patient's condition, treatment options, and wellness activities. The repository also encodes the status of decisions, actions underway for those decisions, and relevant information that can help in performing those actions. The database could also hold other information about the patient, including genetic, environmental, and social contexts.

We will define such a CIS as a

computer-based system that is dedicated to the collection, storage, manipulation,<sup>4</sup> and presentation of all the clinical information important to delivery of patient care.<sup>5</sup> We must examine the organizational and social issues surrounding these systems to truly understand their potential use, benefit, and impact on health care delivery overall.<sup>6</sup>

To capture key aspects of the field and to establish priorities for developing leading-edge clinical applications, we have defined a comprehensive research landscape. This landscape encompasses a broad range of research questions to help us better understand the design, development, implementation, and evaluation of CIS as well as how such systems affect health care delivery. Without a map of the landscape, CIS research and development tends to focus on short-term projects designed to meet the immediate goals of the individuals or groups involved in a specific project. Although these goals are clearly correct at a micro level, such decisions may be both short-sighted and counter to long-term goals of the CIS in particular and the organization in general. At the request of KP's National Research Council, the authors of this article have developed—and describe here—this CIS research landscape, which includes current CIS research activities and highlights potential new areas for research. (The succeeding article in this series describes specific research questions and potential projects that would fit within the CIS research agenda.)

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## Aspects of CIS Research Evaluating Functional Aspects of a CIS

Friedman and Wyatt<sup>7</sup> identified five main aspects of interest in the study of CIS. They noted that, to be comprehensive, each system would be evaluated on each of the following aspects:

- Need for the system (ie, nature of the problems to be addressed and how frequently these problems occur);
- Development process (ie, the development team and its methodology);
- Intrinsic structure (ie, parts and functions of the system that can be observed or inspected without actually running the system, such as flow charts or mockups of the graphical user interface);
- Functionality (ie, system response time, accuracy, reliability, or ease of use);
- Impact (ie, how the system affects the health care providers, patients, processes, and organizations who use the system).

### Results of Using a CIS: Identifying Progress

In the last 50 years, numerous research efforts have been designed to help investigators learn more about CIS and their effect on the health care delivery process. The following sections highlight several of the most important dependent variables that have been examined.<sup>8</sup> Within each study area, research can span all functional aspects of a CIS. For example, researchers might be evaluating a new CIS feature to detect adverse drug events<sup>9</sup> and thus improve quality of care in an intensive care

unit, but they may illustrate in the process the need for a system to help clinicians order the appropriate antibiotic.<sup>10</sup>

Clinical information systems are often touted for their potential ability to improve quality of health care. One way they improve care is by supporting clinicians in the decision-making process.<sup>11</sup> The most widely used CIS function for this support is presenting patient-specific information in a legible, organized, and timely manner.<sup>12</sup> Other CIS interventions that have been examined include allowing clinicians to:

- access the medical literature,<sup>13</sup>
- ask clinical<sup>14</sup> or administrative questions of aggregates of patient data,
- receive automatic warnings or suggestions when the patient's data satisfy certain logical rules,<sup>15</sup>
- receive critiques when proposing therapies<sup>16</sup> or ordering diagnostic tests,
- access guidelines for standards of care,<sup>17</sup>
- analyze tradeoffs and the likelihood of alternative outcomes (decision analysis),<sup>18</sup> and
- receive lists of differential diagnoses.<sup>19</sup>

Related to quality of health care, safety of the systems and their underlying software has recently become an important topic.<sup>20,21</sup> Studies<sup>22</sup> have examined patient safety, especially as it relates to errors of omission and commission made by clinicians or the entire health care system. In a seminal study, McDonald<sup>23</sup> found that physicians prompted by computer were more likely to respond to various clinical events

for common conditions routinely managed or caused by medications. He concluded that these oversights were due more to "man's limitations as a data processor rather than to correctable human deficiencies."<sup>23:abstract</sup>

In cost-related evaluations, many investigators have examined whether a CIS can affect health care resource utilization. For example, Tierney et al<sup>24</sup> looked at how a physician's direct entering of patient orders affects the charges assessed the patient during an inpatient stay. Evans et al<sup>10</sup> showed that a complex clinical decision support system integrated with a comprehensive electronic patient record could both improve quality of care and reduce its costs. Time efficiency of clinical computers has been investigated from the standpoint of the effect of a CIS on the time required to perform certain clinical tasks.<sup>25</sup> Investigators have also examined whether a CIS can improve various patient-focused, time-related measures, including: outpatient clinic waiting time, time to receive appropriate treatment,<sup>15</sup> and hospital length of stay.

Research has also examined various issues surrounding clinicians and providers. Satisfaction of patients with their clinicians and the care they receive as well as satisfaction of clinicians with their work environment is a major concern.<sup>26</sup> Adoption of CIS as a routine component of the process of delivering patient care has received considerable attention. The historical patterns of technology implemented in health care have been investigated to try to understand the technologic and sociologic factors that create barriers or facilitate the pro-

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cess.<sup>27,28</sup> By providing direct access to relevant clinical information at the time and place it is needed,<sup>29</sup> a CIS can have a positive effect on both patient and provider education.<sup>30</sup> Various electronic-information-technology-based communication systems have been examined for their ability to improve continuity of care for patients by improving access and coordinating the activities of clinicians.<sup>31,32</sup>

The article<sup>33</sup> most often credited with starting the entire field of computer applications in medicine focused on a statistical method of reasoning about medical conditions. Investigators then began experimenting with different ways to implement algorithmic reasoning techniques that exploit the variety of relationships that exist in different medical domains. These include associations, probabilities, causality, functional relationships, temporal relations, locality, similarity, and routine clinical practice.<sup>34</sup> The process of representing, maintaining, querying, and reasoning about time-oriented clinical data is another major theoretical and practical research area in CIS.<sup>35</sup>

#### **The CIS Research Process: Asking Specific Questions**

Given this CIS research background, a CIS clearly is much more than simple installation of a computer system within a health care institution. CIS represents a major change in the way health care is delivered. Although the list of potential research questions related to CIS design, development, and implementation is lengthy, reviewing a small group of examples is useful. The next 13 generic research questions are followed by a specific sample question that could be asked and

answered with appropriate CIS functionality by a group of experienced CIS researchers.<sup>36</sup>

1. Does the system work as designed?

Are the alerts and reminders generated for a specific patient correct and "of use" to the clinician?

2. What is the impact of various system enhancements or modifications?

Does the new patient summary display screen help clinicians quickly understand the patient's past medical conditions and treatment and allow more meaningful discussion of the current reason for the visit?

3. Is the system used as anticipated?

After implementation of a physician order entry (POE) system, the percentage of orders entered by physicians could be examined.

4. Does the system produce the desired results?

Does the new POE system actually reduce occurrence of adverse drug events?

5. Does the system work better than the procedures it replaced?

Does the new clinical laboratory alerting system reduce the time patients spend in a critically abnormal physiologic state compared with the previous telephone notification system?

6. Is the system cost-effective?

Does the increased time clinicians spend entering data during the patient visit lead to efficiency or improvement in quality within the overall health care system and thus justify its continued use of this practice?

7. How well have individuals

been trained to use the system?

What percentage of clinicians can successfully perform a series of tasks required to manage a simulated patient encounter?

8. What is the anticipated long-term impact on how departments interact?

When routine drug/drug-interaction checking is moved out of the pharmacy and onto the clinician's desktop machine, what is the impact on the pharmacy department's morale and productivity?

9. What are the long-term effects on the delivery of medical care?

Does provision of regular health maintenance reminders to clinicians at the point of care improve the long-term health outcomes of chronically ill patients?

10. Will the system have an impact on management of the organization?

Does incorporation of real-time reminders about the current drug formulary decrease variability in prescribing behavior and thus reduce costs of managing the organization?

11. To what extent does impact depend on the practice setting?

Can the same data entry and review screens be used by both primary care and specialty care clinicians?

12. Can we establish a performance baseline against which future CIS enhancement can be compared? Can such regularly collected clinical or administrative data be used to measure impact of future CIS enhancement? And are there additional data items that, if recorded, would present a different picture?



13. Does the increasing complexity of modern medicine and the CIS required to implement it help or hinder clinicians and their patients? And how does use of the CIS affect the patient-provider relationship?

### The CIS Landscape

Our goal was to map the CIS research landscape so that organizational and science goals could be realized through the funding and conduct of actual CIS research. This landscape would, in theory, encompass all relevant projects. To visualize this landscape, we needed to describe the relevant research by classifying projects along important dimensions of the landscape.

A CIS potentially touches and af-

fects all aspects of the health care delivery system. Therefore, a research agenda should address the key components of any potential system and the way that these components interact in the course of care delivery. We thus began by considering an abstract model of health care delivery that made explicit these key components and the interaction among them.

### Key Participants in the Health Care Delivery System

The most important participants in the health care delivery system are the patients and their families who receive the care and the clinicians (physicians, nurses, and members of the allied health professions) who provide the

care. In addition, we identified the interaction between these two sets of participants, which we termed the “processes” of delivering the care. These processes describe or control the way care is delivered. We also recognized that the organizations (hospitals, integrated delivery networks, health maintenance organizations, insurance companies, and government agencies) supporting the providers are key participants in the overall system. Considering entire populations of patients as a single participant is also often valuable. Finally, we identified the data, information, and knowledge that the CIS must record, store, and display for all of the other participants.

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Table 1. Grid of potential relationships and sample research questions						
	Patients and families	Process of health care	Health care providers	Health care organizations	Patient populations	Clinical knowledge
Safe	Can we develop systems to promote a safe and healthy lifestyle?			Can we develop systems to improve safety of the care we deliver?		
Effective		Can CIS enhance delivery of preventive services?				How can we best represent data and knowledge?
Patient-centered	Will patients benefit from Internet access to their health record?					
Timely					Can we develop systems to warn providers about life-threatening events?	
Efficient			How should on-line decision support fit provider workflow?			
Equitable		Can we measure patient health to help decide on spending?				

The table column headings name participants in the health care delivery system, and the row headings name potential areas for improvement in the health care delivery system.



**Good research operates on the basis of carefully building knowledge across time and eventually enters the everyday operations of a health care system.**

### Key Need for Improvement in Health Care

Once we had identified the key participants involved in the health care delivery system, we began to identify key aspects of the care delivery system that require improvement. We decided to use the six areas targeted for improvement from the *Institute of Medicine's* recent report on improving quality of the health care delivery system, ie, that it be safe, effective, patient-centered, timely, efficient, and equitable. Table 1 combines these six areas for improvement with the key participants involved in the health care delivery system to create the CIS research landscape. Sample research questions that could be pursued within each of the intersecting boxes are shown. (The succeeding article in this series will explore each of these research areas in detail.)

Good research operates on the basis of carefully building knowledge across time and eventually enters the everyday operations of a health care system. Therefore, we wanted to portray the actual research process—an iterative cycle of knowledge acquisition and application building (Figure 1)—and its relation to operational aspects of health care delivery. In most instances, this relation is slow and iterative. Moreover, good research can take place anywhere in the research cycle, and a specific researcher may choose to enter the CIS research process at any point in the cycle; thus, the focus of particular research questions in a specific research area can change depending on the research stage within the research process. Good research can take the form of basic research—which

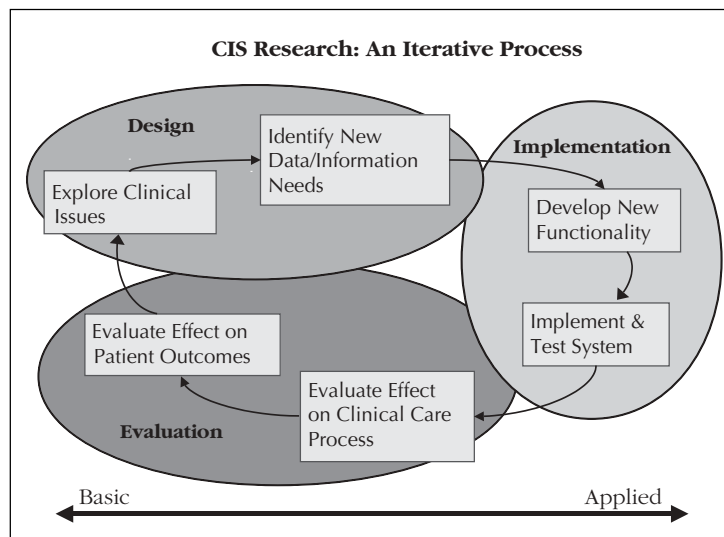


Figure 1. Diagram illustrates some stages in the iterative process of conducting CIS research, including basic research (shown at left) and applied research (shown at right).

focuses on how processes work—or applied research—which focuses on using these processes to implement change (Figure 1).

### Summary

The scientific fields associated with design, development, implementation, and evaluation of CIS have made tremendous progress to date. Although various aspects of these systems have been successfully incorporated into the routine health care delivery processes, much remains to be discovered, implemented, and tested. The CIS research landscape we have described should help researchers and research funders alike focus their time, effort, and money on important research questions. The answers to these questions should, in turn, significantly improve the overall health care delivery process. In the succeeding article, we will describe how we used this research landscape in conjunction with the known operational, fi-

nancial, technical, governmental, and social constraints present within KP to develop a specific CIS research agenda. ♦

<sup>a</sup> Manipulation implies existence of information management tools to provide clinical reminders and alerts, linkages with knowledge sources for health-care decision support, and analysis of aggregate data.

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## Vague Forms of Speech

Vague forms of speech have so long passed for mysteries of science;  
and hard words mistaken for deep learning,  
that it will not be easy to persuade either those who speak or those who hear them,  
that they are but a hindrance to knowledge.

*John Locke, 1632-1704, 17th century Oxford scholar,  
philosopher, medical researcher and physician*