

## Electronic Surveillance of Healthcare-Associated Infections with MONI-ICU—A Clinical Breakthrough Compared to Conventional Surveillance Systems

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### Abstract

Surveillance of clinical entities such as healthcare-associated infections (HCAI) by conventional techniques is a time-consuming task for highly trained experts. Such are neither available nor affordable in sufficient numbers on a permanent basis. Nevertheless, expert surveillance is a key parameter for good clinical practice, especially in intensive care medicine. MONI-ICU (monitoring of nosocomial infections in intensive care units) has been developed methodically and practically in a stepwise manner over the last 20 years and is now a reliable tool for clinical experts. It provides an almost real-time view of clinical indicators for HCAI—at the cost of almost no additional time on the part of surveillance staff or clinicians. We describe the use of this system in clinical routine and compare the results generated automatically by MONI-ICU with those generated in parallel by trained surveillance staff using patient chart reviews and other available information (“gold standard”). A total of 99 ICU patient admissions representing 1007 patient days were analyzed. MONI-ICU identified correctly the presence of an HCAI condition in 28/31 cases (sensitivity, 90.3%) and their absence in 68/68 of the non-HCAI cases (specificity, 100%), the latter meaning that MONI-ICU produced no “false alarms”. The time taken for conventional surveillance at the 52 ward visits was 82.5 hours. MONI-ICU analysis of the same patient cases, including careful review of the generated results required only 12.5 hours (15.2%).

### Keywords:

Electronic surveillance, Accuracy, Time expenditure, Healthcare-associated infections, Intensive care unit, MONI-ICU.

### Introduction

Surveillance of clinical entities such as healthcare-associated infections (HCAI) by conventional techniques is a time-consuming task for highly trained experts who, in clinical settings, neither are available nor affordable in sufficient numbers on a permanent basis. Many published surveillance studies have been performed with either additionally budgeted (scientific) staff or with information technology (IT) tools specifi-

cally developed for the studies and not used later. Nevertheless, continuous expert surveillance is a key parameter for good clinical practice (GCP), especially in intensive care medicine [1,2]. Furthermore, healthcare authorities increasingly demand the installation and regular use of HCAI surveillance by healthcare institutions [3] as a part of quality management (QM). However, this sound demand is often overruled by financial constraints or simply by the unavailability of a suitable workforce at the local or regional level.

For a long time now, we have been attempting to bridge these gaps by establishing a fully automated computer-based system for early recognition and continuous monitoring of HCAs [4–6]. The foremost challenge was to obtain reliable surveillance data from intensive care units (ICUs) without the need to employ additional documentation staff and statisticians.

When developing MONI-ICU, our main clinical concerns were the following:

- Its reliability and accuracy in clinical terms and its acceptance and adoption by clinical experts; possibly lowering infection rates and costs through (almost) real-time monitoring.
- Compliance with international standards and HCAI case definitions such as those issued by the Centers for Disease Control and Prevention (CDC) in Atlanta, USA [7], the European HELICS criteria [8], or the German KISS definitions [9].
- Timeliness of the obtained results for early identification of infection: both in the individual patient and in the patient population of the healthcare institution.
- Full technical and organizational feasibility with no need for additional staff for documentation or analysis.

Technically, MONI-ICU possesses the following components and characteristics to enable its fully automated mode of operation and wide acceptance by clinical users:

- Data import interfaces to the intensive care medical information or patient data management systems (PDMSs), the laboratory information system of the mi-

crobiology department and, last but not least, to the respective hospital information system.

- “Raw” measured and observed medical data coming from these information systems are entered into a stepwise pipeline of aggregation and interpretation, eventually to draw conclusions with regard to the presence or absence of HCAI conditions according to their definitions (cf., [6,10]).
- Extensive adoption of fuzzy set theory and fuzzy logic methodologies to allow for graded intermediate and final results [10]; this permits immediate identification of borderline cases and trends.
- Deployment of MONI-ICU as modern web-based, Java-programmed system with routine operation within the intranet of the healthcare institution [11]; it is based on a service-oriented architecture.
- Representation of the necessary medical knowledge and processing steps in Arden Syntax [11–13], a standard programming language fostered by Health Level Seven (HL7) and adopted as an American National Standards Institute (ANSI) standard.
- Presentation of explanations that describe how and why the intermediate and final results were calculated.

## Technical Background

MONI-ICU relies on the following three components in terms of both method and practice: (1) Data sources that provide the respective structured medical data; (2) a medical knowledge base with computerized knowledge about all relevant clinical entities in the system; and (3) a processing algorithm that evaluates, aggregates, and interprets medical data in a stepwise manner until they can be mapped into the given HCAI definitions.

Additionally, graphical user interfaces display the daily results while reporting tools summarize the patient-oriented outcome.

Specifically, MONI-ICU’s systems consist of the following:

**Data sources:** MONI-ICU is connected to 12 ICUs at the Vienna General Hospital where adult intensive care patients are treated. These ICUs are all equipped with Philips Care Vue PDM systems that collect clinical, laboratory, and nursing data over time. The patients’ administrative data is transferred from the hospital’s information system into the PDMSs and is thus available for MONI-ICU. However, a separate data interface was established between the laboratory information system (LIS) of the microbiology department (the LIS there was developed by the municipal authorities of Vienna) and MONI-ICU.

Furthermore, all PDMS data are restored daily and made available for further software systems, such as MONI-ICU, in a so-called information support mart (ISM). ISM is a relational data base containing a number of MONI-ICU specific tables, and is filled at night. In the morning about 5–6,000 data items are waiting to be processed by MONI-ICU.

**Medical knowledge base.** MONI-ICU contains an extended number of algorithm- and rule-based knowledge to recognize and interpret relevant data constellations that finally contribute to the decision as to whether a certain HCAI is present or not. By the use of fuzzy set theory and fuzzy logic, presence of HCAI is tagged with its calculated certainty. The required medical knowledge was defined by a small team consisting of an infection control specialist and a knowledge engineer. It was a difficult task, which was facilitated by the availability of standards [7–9]. For more details the reader is referred to [6,10].

**Processing algorithm.** The inference process is started daily at 5 am. For each patient (a maximum of 96 in the 12 ICUs), the entire knowledge base is applied. Processing is done in a stepwise manner: first, medical data are checked for plausibility and algorithms are applied to calculate intermediate numerical values such as means and scores; second, the patients’ measured, observed, and calculated data are interpreted and classified into normal or the respective pathological classes (increased, decreased, ...). Then, the abstracted and intermediate results are aggregated by the use of clinically meaningful rules. Finally, all included HCAI definitions are evaluated. As a result the (definitions of) HCAs are fulfilled, not fulfilled, or fulfilled to a certain degree by the respective patient data. Quite often, patient data from the last few days are also taken into account.

A surveillance screen allows the infection control user to obtain an overview about all 12 ICUs, the patients, and the HCAI results. Moreover, detailed explanations containing the intermediate clinical results, and—if requested—the “raw” measured and observed patient data can be demanded by simple mouse clicks.

The results of MONI-ICU on the surveillance screen (we call it cockpit surveillance) are accessed from the rooms of the infection control unit at the Vienna General Hospital. Clinicians at the ICUs are directly contacted by the infection control staff when necessary.

## Aims of the Clinical Evaluation

The objective of the clinical evaluation presented here is to perform the following two comparisons:

- Surveillance results generated automatically by MONI-ICU and those generated in parallel by trained surveillance staff and attending clinical experts using patient chart reviews and other available information. The data collected by human staff were taken as a clinical “gold standard” and then compared with the Moni-ICU results.
- Objective comparison of the time period taken to manually analyze patient charts on the one hand, and applying MONI-ICU as well as reviewing the results presented on screen on the other.

## Methods

### The clinical “gold standard”

From November 2006 to February 2007, trained surveillance staff together with attending clinical experts reviewed patient charts and other available information twice weekly, thus collecting data from 1007 patient days (two ICUs with together 16 beds, for adult patients, 99 admissions of > 48 h duration; refer to Table 1). All data were collected at the Vienna General Hospital, a 2,200-bed teaching and tertiary-care hospital.

The European HELICS [8] definitions for HCAs (which are to a large extent identical with US-based CDC [7] definitions) were applied for the identification of HCAI episodes. The top-level main episodes are (with onset > 48 h after admission):

- septicemia (blood stream infection, BSI),
- central venous catheter-related infection (CRI),
- central venous catheter contamination (CCO – no infection!),
- pneumonia (PN), and
- urinary tract infection (UTI).

For more details on these entities and several variants of them, we refer the reader to [8].

Table 1 – Patient Data

	ICU 1	ICU 2	total
# Admissions > 48 h	56	43	99
Patient days	471	536	1007
Average duration of stay (days)	8.4	12.5	10.2

In addition, the time taken by the surveillance staff to review patient charts was recorded and summed up. The recording was performed in 6-minute units.

### MONI-ICU surveillance

The above selection of patient data was again analyzed. This time the analysis was performed by automatically accessing the respective PDMS data, the data from the microbiology laboratory, and data from the admission department of the Vienna General Hospital. The complete analysis of the selected cases was done with MONI-ICU [actually, a programmed prototype of the present system].

Again, the time taken to load the results on the screen, select patient data and review the results, including the backward-chained inference and calculation path to the “raw” patient data, was measured and recorded for comparison.

Both, the results of infection surveillance and the time taken for two independent cycles were then compared.

## Results

The following results were obtained:

MONI-ICU correctly identified the presence of one of the above-listed HCAI conditions in 28/31 cases (sensitivity 90.3%) and their absence in 68/68 of the non-HCAI cases (specificity 100%). Thus, an overall accuracy of 97% was achieved (cf., Table 2). Of the three undetected cases, two were due to missing microbiological data in the MONI-ICU database (a transfer error in data input) while one was due to a missing parameter in one rule definition.

Table 2 – HCAI Conditions Correctly / Falsely Identified or Missed by MONI-ICU

	Condition present “gold standard”	Condition absent “gold standard”
Condition present “MONI-ICU”	28/31 (90.3%)	0/68 (0%)
Condition absent “MONI-ICU”	3/31 (9.7%)	68/68 (100%)

The time taken for conventional surveillance was 52 ward visits comprising 82.5 hours (incl. 7.2 hours of walking) for human data collection and analysis. MONI-ICU analysis of the same 99 admissions took 12.5 hours at the MONI cockpit, which was roughly 15% of the time taken for conventional surveillance (cf., Table 3).

Table 3 – Time Expenditure for Conventional (Human) and MONI-ICU Surveillance

	Conventional surveillance	MONI-ICU surveillance
Time spent	82.5 h (100%)	12.5 h (15.2%)

## Discussion

Automated surveillance by MONI-ICU is much faster and less dependent on human factors than conventional (manually operated) surveillance. High specificity of the results of surveillance is of paramount importance, as false alarms would rapidly and strongly discourage clinicians from accepting such a tool.

As the missing cases in MONI-ICU surveillance were due to rectifiable technical errors, a sensitivity of 100% can be achieved.

Investing resources in the development and programming of MONI-ICU is meaningful, as it provides reliable surveillance data rapidly. In general and also for the future, time and know-how must be invested so that MONI-ICU can keep pace with

advancing clinical expertise and adapted to the users' specific needs. The users, in turn, benefit from this time investment because their daily surveillance becomes rapid and precise.

Requirements for MONI-ICU and challenges:

- Availability of a suitable electronic PDMS; any additional manual data entries is counterproductive!
- Sufficient data of adequate quality must be stored and be accessible in PDMS. Its functionality is hindered or blocked by improper use or changes in interfaces to other clinical and institutional data systems. Similarly, sudden software and/or hardware changes in remote components of the healthcare institution's IT network may cause unexpected breakdowns. MONI-ICU requires a smoothly functioning IT environment.
- Clinical experts must be available and willing to cooperate in tuning and updating the system. Continuous cooperation between the MONI-ICU provider, the local IT management, the surveillance team, and clinical experts is indispensable.
- Funding the development and installation as well as continuing support of the system to keep in pace with advancing clinical expertise and case definitions are also necessary.
- Being understood and accepted by intended users. The reluctance of medical and other experts to entrust knowledge to an electronic system, the fear of being replaced by it in the long run and similar prejudices may prevent potential users from getting acquainted with its qualities.

## Conclusions and Perspectives

MONI-ICU generated no "false alarms", thus demonstrating high specificity. Its sensitivity was reasonable even with the applied MONI-ICU prototype, the data of which are shown here. After having modified the rule definition and corrected the data input, its sensitivity has now been optimized, and re-evaluation of the presented data is under way. Regular updating is a basic feature of MONI-ICU in order to keep pace with advancing clinical expertise. In fact, MONI-ICU may be used as a tool for challenging current definitions for HCAs and for investigating their validity.

With MONI-ICU as an add-on to PDMSs, regular and continuous surveillance of HCAs is feasible even with a small workforce. This opens great possibilities for GCP, QM, and benchmarking routines in healthcare institutions. Likewise, MONI-ICU may be used as a tool for clinical science. Although it was primarily developed for continuous surveillance, its features offer clinical decision support directly at the ICUs in the form of alerts and reminders.

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