전산 데이타를 활용한 약물이상반응검토 및 시그널

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Adverse Drug Event Surveillance System using Electronic Data and the Signals

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약물요법에 있어 약물이상반응은 환자의 사망률과 이환율에 영향을 미치는 중요한 요인이다. 약물이상반응 발생시 이 를 신속히 보고하는 것과 함께 약물치료과정에서 일어날 수 있는 약물 관련부작용을 조기에 인지하고 능동적으로 조 치함으로써 환자에게 가해지는 위해를 최소화하는 것 또한 실제 환자치료의 질적인 관리에서 중요한 부분이다. 본 연구에서는 의료기록의 전산화에 따른 전산데이터들을 활용한 약물이상반응감시방법 중 하나로 평가 받고 있는 Computerized surveillance system (CSS)에 대한 사례 연구들의 방법들을 비교해 보고, 제시된 관련 시그널들 중 약물이상반응을 능동적인 방법 즉 실시간 혹은 예방적으로 적용 가능한 시그널들을 찾아 정리해 보고자 하였다. 이 를 위해 가장 대표적인 연구가 진행되었던 연구사례들을 분석하였고 약 20여 개의 시그널들을 선정하여 분야별로 제 시하였다.

□ Key words - Computerized surveillance system , Adverse drug events (ADEs), Adverse drug reactions (ADRs)

INTRODUCTION

Adverse drug events (ADEs) are common and responsible for significant morbidity and mortality in hospitalized patients.^{1,2)} Adverse drug events have been reported to occur during 1 % to 30 % of hospital admissions, depending on the definition of ADE and the rigor with which they are sought.³⁻⁹⁾ Several studies in the U.S. showed ADEs have contributed to the additional length of hospital stay (1.7~2.2 days longer) and the

#Correspondence to : Kwang-il Kwon College of Pharmacy, Chungnam National University, Daejeon, South Korea Tel: +82-42-821-5937, Fax: +82-42-821-6566 E-mail: kwon@cnu.ac.kr Wonku Kang College of Pharmacy, Yeungnam University, Gyeongsan, South Korea Tel: +82-10-9588-8846, Fax: +82-53-850-4654 E-mail: wonkuk@yu.ac.kr increase in medical cost (\$ 2,000~\$ 3,200 more).^{4,6)} Many attempts to identify and reduce the incidence rates and severity of these ADEs have been carried out for decades. There are three categories of ADE surveillance models, including voluntary reporting, chart review, and computerized screening.^{10,11)} Voluntary reporting is the traditional ADE detecting method, but it has low detection rates. Chart review produces high detection rates of ADEs, but its expense makes it impractical for ongoing quality monitoring in hospitals.^{7,12)} However, computer based ADE monitoring has been proven to be cost-effective and practical, as it yields high detection rates at low costs. So there is a growing trend towards its routine application.¹³⁻¹⁵⁾

The Computerized surveillance system (CSS)

The Computerized surveillance system, is a method that generally uses computerized data to identify a sig-

nal that suggests the possible presence of an adverse event, which can then be investigated by human intervention. A computer-based screening method, generates alerts by matching signals such as abnormal laboratory data, drug levels, and use of emergency medicine within electronic medical records (EMRs) or paper charts. Based on these signals, ADEs would be verified by trained personnel such as a physician, a nurse and/or a pharmacist.^{16,17)} Although this approach still typically involves going to the paper chart, electronic medical record or electronic chart to verify the event, it is much less costly than the review of unscreened charts, because only a small proportion of charts need to be reviewed and the review can be highly focused.¹²⁾

Developing a Computerized ADE surveillance system

Developing and maintaining a CSS generally involves several steps. The first and most challenging step is to collect patient data in electronic form. The second step is to apply screening algorithms for trigger signals to the collected data to identify patient cases with data that are consistent with an adverse drug event. Examples of these signals include laboratory test results, such as a doubling in serum-creatinine, high serum drug levels or the use of drugs, often used to treat the symptoms associated with ADEs and use of antidotes. The third step is to determine the predictive value of the automated queries, which is usually done by chart review. The data source most often applied to patient safety work is the administrative coding of diagnoses and procedures, usually in the form of ICD-9-CM and CPT (Current Procedural Terminology) codes. The codes provide direct and indirect evidence of the clinical state of the patient, comorbid conditions and the progress of the patient during the hospitalization or between visits. Because administrative coding is generated for reimbursement and legal documentation rather than for clinical care, its accuracy and appropriateness for clinical studies are variable at best. The coding suffers from errors, lack of temporal information and a lack of clinical content.¹⁸⁾ A further drawback is the fact that Coding is usually done after discharge or completion of the visit; thus its use in

a real-time intervention is limited.

Pharmacy or clinical laboratory data represent two other common sources of coded data. These sources supply direct evidence for medication and laboratory adverse events (e.g. overdosing, clinical values out of range). In addition, these sources supply information about the patient's clinical state, corroborating or even superseding the administrative coding. Unlike administrative coding, pharmacy and laboratory data are available in real time, making it possible to intervene in the care of the patient.

If providers use the systems in real time, it becomes possible to intervene and prevent or ameliorate patient harm. The detailed clinical history, the evolution of the clinical plan and the rationale for the diagnosis are critical to identifying adverse events and to sorting out their causes. Visit notes, admission notes, progress notes, consultation notes and nursing notes contain important information and are increasingly available in electronic form. However, they are usually available in uncontrolled, free-text narratives. If the clinical information contained in these narrative documents can be turned into a standardized format, then automated systems will have a much greater chance of identifying adverse events and even classifying them by cause.¹⁹

Purpose

The purpose of this paper is to review the use of electronic tools in CSS to detect adverse drug events based on the type of data, including ICD-9 codes, drug and laboratory data and to discuss the evidence regarding the use of these tools to identify adverse drug events in both the inpatient and outpatient setting. The focus of this discussion is to detect the events after they occurred. So it is discussed that if in the future such tools can also be used to prevent or ameliorate many events.

EVALUATION OF STUDIES

Computerized ADEs surveillance system

Computerized techniques for identifying adverse drug events (ADEs) are sufficiently developed for broad use.

Table 1. Studies	S Evaluating Computerized	ADEs and Resul	ts and Barriers to	o Implementation of	f Studies Evaluating	an ADEs
Monitor Using	a Gold Standard					

Study	Honigman et al. ²¹	Levy et al. ²²	Jha et al. ¹²
Patients	All outpatient visits to a primary care clinic for 1 year ($n = 15,665$)	c Consecutive patients admitted to a 34-bed ward of an autocare hospital over a 2- month period (n = 199)	All medical and surgical inpatients admit- ted to a tertiary care hospital over an 8- month period ($n = 36,653$)
Outcome measured	ADE rate =injury resulting from the administration of a drug	ADR rate = adverse reactions related to the use of a drug	e ADE rate = injury resulting from adminis- tration of a drug
Signal Used for detection	Laboratory, pharmacy, and administrative data, as well as free-text searches	Laboratory data	Laboratory and pharmacy data
Gold Standard	Yes	Yes	Yes
Level of Automation	High end (preexisting integrated computer system with electronically stored notes and an event monitor)	Low end (system monitored for approxi- l mately 25 laboratory abnormalities and generated paper lists of possible ADRs used for review by clinical pharmacists)	High end (preexisting integrated computer system with POE and an event monitor)
Description of Monitoring	A computerized tool that reviewed elec- tronically stored records using four search strategies:ICD-9-CM codes, allergy rules, a computer event monitor, and automated chart review using free text searches. After the search was performed the data were narrowed and queried to identify incidents	A data-driven monitor where automated laboratory signals (alerts) were generated when a specific laboratory value reached a predefined criteria. A list of alerts was gen reated on a daily basis and presented to staff physicians.	A computerized event monitor detecting events using individual signals and boolean combinations of signals involving medica- tion orders and laboratory results. The computer generates a list of alerts that are reviewed to determine if further evaluation is needed.
Study Results	The monitor detected an estimated 864 (95% CI, 750–978) ADEs in 15,655 patients. For the composite tool the sensitivity was 58% (95% CI, 18–98), specificity 88% (95% CI, 87–88), PPV 7.5 % (95% CI, 85– 8.5), and NPV 99.2% (95% CI, 95.5– 99.98).	 32% (64/199) patients had an ADR. There were 295 alerts generated involving 69% of all admissions. Of all ADRs, 61% (43/571) were detected by the automated signals. The sensitivity of the system was 62% with a specificity of 42%. 18% (52/295) of alerts represented an ADR 	e 617 ADEs were identified during the study period. The computer monitor identified 2,620 alerts of which 10% (275) were ADEs. The PPV of the event monitor was 16 % over the first 8 weeks of the study but) increased to 23% over the second 8 weeks after some rule modification.
False positives and/ or False negatives	For the composite tool the false-positive rate was 42% (637/1501) and the false-negative rate was 12% (10,619/87,013).	Overall 82% (243/295) of the alerts were false positives.	The false-positive rate over the entire study period was 83%.
Barriers to Implementation	The monitor requires a highly integrated HIS to implement. ICD-9-E codes were not used frequently at the study institution Only a small lexicon had been developed for free text searches. The study did not mention the amount of time that would be necessary to maintain the monitor.	Authors mention an "easy implementa- tion" but implementation is not described; however, the high false-positive rate would add to the overall work required to main- tain the system. The time necessary to maintain the system is not described.	In hospitals without this sophisticated a IS, it might be challenging to implement the monitor. The monitor was unable to access microbiology results. To maintain the sys- tem required 1–2 hours of programming time a month and 11 person-hours a week to evaluate alerts.

They are much more accurate than spontaneous reporting and more time- and cost-effective than manual chart review. These studies are summarized in Table 1. Hospital information systems can be used to identify ADEs by looking for signals that an ADE may have occurred and then directing them to someone (i.e. Clinical pharmacists) who can investigate.²⁰⁾ The signals used in these evaluation studies are summarized in detail in Table 2.

Honigman *et al.*²¹⁾ used four categories: ICD-9 codes, allergy records, computer event monitoring, and freetext searching of patient notes for drug–symptom pairs (e.g. ACE inhibitor and cough) to detect ADEs. In an evaluation including one year's data of electronic medical records for 23,064 patients, including 15,665

patients that came in for care, 864 ADEs were identified. 91% of the ADEs were identified using text detection, 6% with allergy records, 3% with the computerized event monitor and only 0.3% with ICD-9 coding. The dominance of text searching was a surprise and emphasizes the importance of having clinical information in the EMRs, even if it is not coded.

Levy *et al.*²²⁾ targeted consecutive patients admitted to a 34-bed ward of an acute-care hospital over a 2-month period (n = 199). They used drug laboratory data as signals.

They systematically monitored for approximately 25 laboratory abnormalities and generated paper lists of possible ADEs used for review by clinical pharmacists.

Therapeutic drug monitoring	Specific Lab results
 Serum carbamazepine > 12.0 mg/mL Serum digoxin > 1.7 ng/mL Serum amikacin results > 25 mg/L Serum cyclosporine > 500 mg/L Serum potassium > 6.5 mmol/L Serum lidocaine > 5.0 mg/mL Serum n-acetyl procainamide > 20 mg/mL 	 Serum aspartate amino transferase > 150 U/L and no prior result > 150 U/L in last 7 days Serum alanine aminotransferase > 150 U/L and no result >150 U/L in last 7 days Serum bilirubin > 10 mg/dL Blood alkaline phosphatase > 350 U/L Blood eosinophils > 6%
- Serum phenytoin results within last 1 day > 20 mg/mL - Serum phenobarbital results within last 1 day > 45 mg/mL	Specific drug order
- Serum procainamide > 10 mg/mL - Serum theophylline > 20 mg/ML - Serum tobramycin > 10 mg/L - Serum valproate > 120 mg/mL - Serum quinidine > 5 mg/mL - Serum gentamicin > 10 mg/L - Serum vancomycin > 50 mg/L	Atropine sulfate, charcoal (activated), dextrose 50% in water, racemic epinephrine HCl, protamine sulfate, calamine lotion Digibind, flumazenil, glucagon naloxone fluocinolone acetonide kaopectate, loperamide, opium tincture deodorized, sodium polystyrene sulfonate Diprolene 0.05 %, betamethasone dipropionate 0.05 %, oral metronidazole, oral vancomycin, Diprolene 0.05 %

Others

- Receiving diphenhydramine and no diphenhydramine within last 7 days and patient not on paclitaxel and no blood transfusion in last 1 day, Receiving benzodiazepine and receiving anti-epileptic

- Receiving "nephrotoxin" and blood creatinine has risen > 0.5 mg/dL in last 1 day - Receiving phytonadione (vitamin K) and order for warfarin within last 14 days

- Receiving ranitidine and platelet count has fallen to less than 50% of previous value - Receiving diphenoxylate with atropine, Receiving opium and belladonna

Receiving hydrocortisone and no hydrocortisone within last 7 days
Receiving triamcinalone and a beta-blocker, Receiving prednisone and receiving epinephrine

- Receiving prednisone and diphenhydramine

- Receiving prednisone and no prednisone and no solumedrol within last 7 days

	Allergy, ICD-9, Text searches ("swelling," "rash," "irritation")					
	Therapeutic drug monitoring	Specific drug and related laboratory signals				
HonIgman et al. ²¹	 Serum digoxin > 1.7 ng/mL Serum carbamazepine > 12.0 mcg/mL Serum n-acetyl procainamide > 20 mcg/mL Serum procainamide > 10 mcg/mL Serum phenytoin > 20 mcg/mL Serum theophylline > 20 mcg/mL Serum valproate > 120 mcg/mL Serum quinidine > 5 mcg/mL Serum phenobarbital > 45 mcg/mL Serum cyclosporine > 500 mcg/L Others New order (no orders within last 2 weeks) of dipheter and phytonate and on warfarin Prednisone and diphenhydramine ordered on the sate On topical steroids and no history of psoriasis 	enhydramine nide, sodium ame visit	 On cyclospo On digoxin a On drugs tha mmol/L On HMG Co On HMG Co On diuretic c On diuretic c On diuretic c On drugs tha alkaline phosp Warfarin and Ranitidine ar Carbamazep Related labora Blood eosing 	rine and serum bilirubin > 10 mg/dL and serum potassium < 3.5 mmol/L t increase potassium and serum potassium > 6.5 A reductive inhibitors and serum AST > 150 U/L A reductive inhibitors and serum ALT > 150 U/L e and white blood count < $3,500$ /mm ³ class A and serum potassium < 3.0 mmol/L e and serum potassium > 5.5 mmol/L and serum potassium > 5.5 mmol/L t increase LFTs (AST/ALT/bilirubin) and blood shate > 350 U/L l international normalized ratio (INR) > 5 and 100,000 <platelet 250,000="" count<="" mm<sup="">3 ine and WBC < 3,500/mm³ tory signals ophils > 6 %</platelet>		
Levy et al. ²²	Hematotoxicity	Nephrotoxicity		Therapeutic drug monitoring		
			% from initial nol/L	Increased plasma levels (digoxin, quinidine, theophylline, cyclosporine, tacrolimus, aminoglycosides, paracetamol, anticonvulsants,)		
	Hepatotoxicity Metabolic			Electrolyte disturbances		
	Alkaline phosphatase >350 i.u./L, LDH >800 i.u./L Blood glucos GGTP >120 i.u./L, AST and/or ALT >200 i.u./L < 3.5 mmol/L		e >8.0 mmol/L,	K <3.0 mmol/L >6 mmol/L Ca <1.9 mmol/L		

A data-driven monitor where automated laboratory signals (alerts) were generated when a specific laboratory value reached a predefined criteria was done. A list of alerts was generated on a daily basis and presented to staff physicians. 32% (64/199) patients had an ADE. There were 295 alerts generated involving 69% of all admissions. Of all ADEs, 61% (43/71) were detected by the automated signals. The sensitivity of the system was 62% with a specificity of 42%. 18% (52/295) of the alerts represented an ADE. Overall 82% (243/295) of the alerts were false positives. Authors mention an "easy implementation" but implementation is not described; however, the high false-positive rate would add to the overall work required to maintain the system. The time necessary to maintain the system is not described.

Table 3.	Suggested	Signals	at	the	concurrent	CSS
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Jha et al.¹²⁾ used the LDS rule base as a starting point, assessed the use of 52 rules for identifying ADEs and compared the performance of the ADE monitor with chart review and voluntary reporting. LDS Hospital had only ten ADEs reported annually from approximately 25,000 discharged patients, before developing its computerized ADE surveillance program. The CSS identified 373 verified ADEs in the first year and 560 in the second year.⁸⁾ In 21,964 patient-days, the ADE monitor found 275 ADEs (rate: 9.6 per 1000 patientdays), compared with 398 (rate: 13.3 per 1000 patientdays) using chart review. Voluntary reporting identified only 23 ADEs. Surprisingly, only 67 ADEs were detected by both the computer monitor and chart review. The computer monitor performed better than chart review for events that were associated with a

Objects	Laboratory data	Condition			
	WBC count, blood $< 3 \times 10^3 / \mu l$	Exclude diseases which decrease WBC and taking WBC decreas- ing drug			
Hematology	Platelet count, blood < 50×10 ³ /µl Eosinophil, blood > 500/µl	Without relating disease and with causing drug			
	INR > 3.5	Without relating disease			
Coagulation	INR > 3.5	Wafarin + drugs interacts with warfarin			
	$APTT > 6 \times upper limits$	Without relating disease			
	Bilirubin, total > upper normal range	Without relating disease			
	Bilirubin, total > previous mean range	With relating disease but previously controlled below 3			
Hepatotoxicity	ALT, AST > upper normal range	Without relating disease			
	ALT, AST > previous mean range	With relating disease but previously controlled well WNL			
	ALP > upper normal range	Without relating disease			
	Scr rise >30 % from initial value	No hemodialysis			
Nephrotoxicity	Estimated GFR down \ge 30% from from initial value	With nephrotoxic drugs			
	Estimated GFR down \ge 30% from from initial value	Without relating disease			
	Serum potassium > upper normal range	Without relating disease			
Electrorites	Serum potassium > upper normal range	With causing drugs (ex. KCl,)			
	Na < 125 mmol/L	With diuretics			
	digoxin, theophylline, tacrolimus, cyclosporine, anticonversant, voriconazole, etc	Increased plasma levels			
Drug level	Digoxin	Within the rapeutic range but ${\rm K}^+\!<\!3.2$ & ${\rm Mg}^{2+}\!<\!0.75$			
	Phenytoin	Within the therapeutic range (>10 mg/L) But serum albumin \leq 3 mg/dL			
		Contrast combination (screening)			
Specific drug	Metformin	Lactate > 0.22 mmol/L & Creatinine (≥ 1.5 mg/dL for male, 1.4 mg/dL for female)			

change in a specific parameter (such as a change in serum creatinine), whereas chart review did better for events associated with symptom changes, such as altered mental status. If more clinical data, such as nursing and physician notes, had been available in machine readable form, the sensitivity of the computer monitor could have been improved. The time required for the computerized monitoring was approximately

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one-sixth of what was required for chart review.

From these studies, although the signals used in CSS vary, it is clear that CSSs for identifying ADEs are sufficiently developed for broad use. Computerized screening has been proven to have high detection rates and low costs. There is a growing trend towards routine application.^{8,23,24)} These systems are much more accurate than spontaneous reporting and more time- and cost-effective than manual chart review.19) Research will probably also allow for the development of techniques that use tools in real time detecting ADEs. The availability and use of large computerized clinical databases linked to electronic medical records could provide a tool for the early detection of ADEs and thus help clinicians to react appropriately in time,¹³ if then these CSS can identify potential ADEs before they cause serious damage to the patient (Table 3).

SUMMARY

CSS for identifying ADEs are sufficiently developed for broad use and they are much more accurate than spontaneous reporting and more time- and cost-effective than manual chart review. Also computer alert systems can be used to identify opportunities to prevent or reduce patient injury associated with a broad range of ADEs. This CSS can be used to identify opportunities to prevent or reduce patient injury associated with preventable ADEs and increase patient safety, increase quality of drug therapy and decrease the extra-cost of the treatment for ADEs. In the future, increasing utilization of this concurrent CSS should have an enormous beneficial impact on the quality of medical care.

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