# Linking Public Health and Healthcare Data for Syndromic Surveillance Z. Mnatsakanyan, PhD<sup>1</sup>, P. Cutchis, MD, MS<sup>1</sup>, S. Babin, MD, PhD<sup>1</sup>, L. Hung, MPH<sup>1</sup>, D. Mollura, MD<sup>2</sup>, \*J. Lombardo, MS<sup>1</sup>

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## INTRODUCTION

A number of syndromic surveillance systems include tools that quickly identify potentially large disease outbreak events [1-4]. However, the high falsepositive rate continues to be a problem [4-6] in all of these systems. Our earlier work has showed that multi-source information fusion can improve specificity of the syndromic surveillance systems[7]. However, an anomalous health event that presents as only a few cases may remain undetected because the chief complaint data does not contain enough details. New linked data sources need to be used to enhance detection capabilities. The focus of this project the incorporation of laboratory. examining prescription medications and radiology data linked to the patient encounter within syndromic surveillance systems. These data source linkings may enhance the sensitivity of syndromic surveillance.

### METHOD

Selected linked data sources, such as laboratory requests and results, radiology requests, and prescription medications were associated with the individual patient encounter number. Our approach included multi-step information processing. First linked data was processed on the individual patient level and then a severity score was assigned for each patient encounter. The Bayesian Network (BN) technique was chosen to estimate severity scores. Severity scores should be calculated daily. Second, temporal anomaly detection algorithms detected anomalies within scored patients counts for each of the age groups such as infants (0-4 years), children (5-17), adults (18-64), and elderly (65+). Third, detected anomalies fused with the population level BN to detect outbreak.

## RESULTS

Analysis of the data showed correlations among different data sources. Females and adults in the 45-54 year age group showed the highest frequency among the prescription and the patient encounter data source. In the laboratory dataset, the 65+ year age group showed the highest frequency. A consistent seasonal trend, as well as a day-of-week effect, were also observed in the prescription, encounter, and laboratory data sources. Laboratory-confirmed flu data and influenza-like illnesses (ILI) were obtained from the CDC Influenza website http://www.cdc.gov/flu/

(accessed on 12/18/06), to make comparisons with prescription and patient encounter data. Results from the prescription data source showed that penicillin and cold/cough medication corresponded well with the flu epidemic curve. Similarly in the patient encounter dataset, same day office visits corresponded well with the flu epidemic curve.

# CONCLUSION

Preliminary analysis showed that syndromic groups can be made more specific for diseases of interest by utilizing the information available in links. Monitoring only cases that have such linkings or that have an increased severity index should remove much noisy data that are not related to the health events of the user's interest. In this study, we showed that use of linked data improves detection of events with small numbers of cases and may provide earlier detection of large outbreaks while the numbers are still small.

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