

Using Text Analysis to Reduce Information Overload in Pandemic Influenza Planning

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The proliferation of plans can result in debilitating information overload in public health and medical emergencies. In the case of pandemic influenza, the US Department of Health and Human Services (HHS) and its Centers for Disease Control and Prevention (CDC) have pan flu plans for coordinating the 50 states and each of the 50 states has its own pan flu plan. Plans need to be analyzed, compared, and revised so that they are in alignment with one another. Human analysis of plans is time-consuming and difficult, so text analysis software tools are needed that can help humans (a) compare plans to find gaps or discrepancies and (b) locate relevant sections of plans and display links to them. This research-in-progress describes two text analysis tools being developed at the Los Alamos National Laboratory as part of E-SOS (Emergency Situation Overview and Synthesis): the Theme Awareness Tool (THEMAT) and Content Awareness Tool (CAT). Both tools were used to analyze pan flu plans from the White House, the US Department of Health and Human Services, the Centers for Disease Control, and the 50 states.



Using Text Analysis to Reduce Information Overload in Pan Flu Planning and Response

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Problem – Information Overload

- **The proliferation of plans, expert opinion and changing situational status data can result in debilitating information overload in public health and medical emergencies, such as hurricanes or an influenza pandemic.**
- **Pan Flu Example**
 - Florida has a set of state-level Pan Flu response plans. Also, each of its 67 counties has a related set of Pan Flu plans.
 - Similarly the federal Department of Health and Human Services (HHS) and its Centers for Disease Control and Prevention (CDC) have Pan Flu plans intended to coordinate the 50 states' responses – with each state using their own plans.
 - Each one of these hundreds of plans and related implementing materials is often more hundreds of pages long and gets frequently updated.
 - Plans need to be coordinated and subsequently updated.

Solutions – Content Analysis and Document Linking

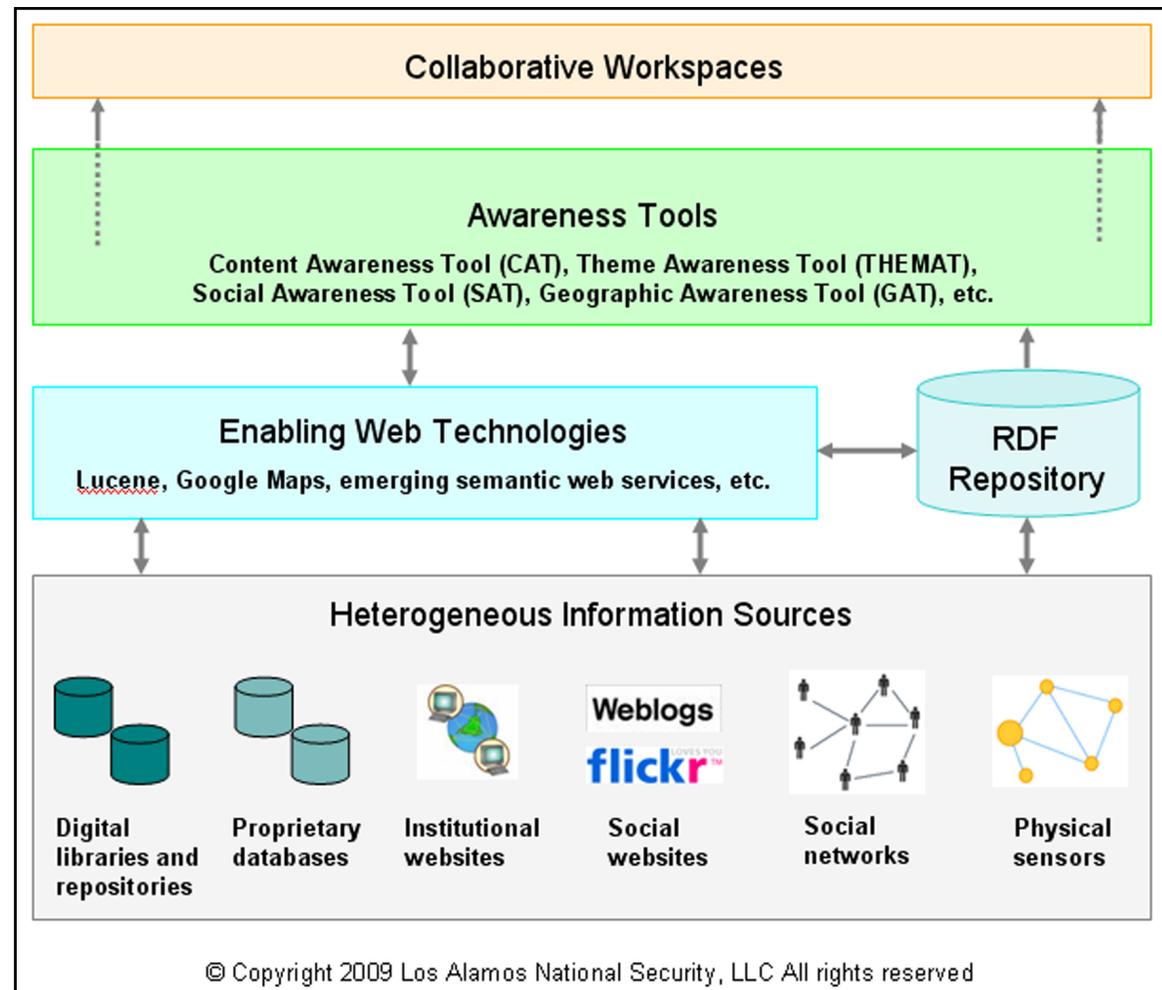
- **Two different tools developed at the Los Alamos National Laboratory are being used to analyze content provided by the Florida Department of Health in order to:**
 - Compare plans to find gaps or discrepancies.
 - It is possible to partially automate this task using content analysis tools that extract key concepts and themes from each plan document.
 - This pattern can then be displayed more intuitively to facilitate comparison.
 - A key question is whether end users can understand the results without the help of an expert analyst and, if not, what additional functionality would make it possible for them to do so.
 - Facilitate locating related information while writing plans, situation reports or public information releases.
 - This capability accesses previously indexed text and displays it to users, based on what they are writing.
 - A key question is how to best organize and index the information for specific writing tasks.

E-SOS Tools

- **The Emergency Situation Overview and Synthesis (E-SOS) suite of tools is being developed at LANL.**
 - The project started in 2007
 - It builds on several years of prior work by team members
- **E-SOS employs a number of tools.**
 - Collaborative workspaces
 - Awareness tools
 - Semantic web technologies
 - Digital library technologies
- **This project is providing feedback on two of the awareness tools:**
 - THEMAT (Theme Awareness Tool)
 - CAT (Content Awareness Tool)

E-SOS System Overview

- Collaborative workspaces where users can report and discuss information
- “Awareness tools” which display information that’s relevant to what users are currently reporting and discussing
- Technologies that synthesize information from heterogeneous sources



Pan Flu Text Analysis Evaluation

- **Florida Department of Health planners, incident command personnel and public information officers are evaluating the usefulness of information generated by THEMAT and CAT in simulations of text-intensive sub-tasks of three key tasks:**
 - Planning – Revising the interrelated set of state-level Pan Flu Plans based on changes to Federal plans and other States' best practices.
 - Public Information and Risk Communication – Tracking the changing content of RSS feeds from media outlets, blogs and other fast moving information sources to enhance the PIO function in a disaster, including managing communication with the media, risk communication with the public and rumor control.
 - Maintaining Situational Awareness – Managing the large number of information sources needed by the Situation Unit at the state Emergency Operations Center's Health and Medical Emergency Support Function (ESF-8).

Content Used in Pilot Project

- **Pan Flu plans for states:**
 - Florida, New York, California, Minnesota, Rhode Island, Arizona
- **Pan flu plans for cities:**
 - Miami, New York
- **Pan Flu plans for federal agencies:**
 - Health and Human Services (HHS) coordination of the all federal agencies
 - HHS's guidance to states
 - The Centers for Disease Control and Prevention (CDC) Operations Plan (OPLAN)
- **The White House's National Strategy for Pandemic Influenza Implementation Plan**

Steps Using THEMAT

- Extract themes from each document. *Called knowledge signatures (kSigs).*
- Create taxonomies for each document or set of documents.
- Compare taxonomies to identify unique, overlapping or missing content.
- Compute the network analytic relationships among themes.
- Generate Theme Network (tNet) visualizations for each document or set of documents.

THEMAT Results

- Sets of knowledge signatures (kSigs) generated for each document
- kSigs indexed and highlighted for all documents (slide 10)
- Similar themes in Pan Flu plans identified (slide 11)
- Unique themes in Pan Flu plans identified (slide 11)
- Theme networks (tNets) of each plan created to help users focus on key concepts and their relationships (slide 12)
- Comparison of gaps and similar and divergent uses of concepts in different documents
- Trends over time for multiple versions of plans identified

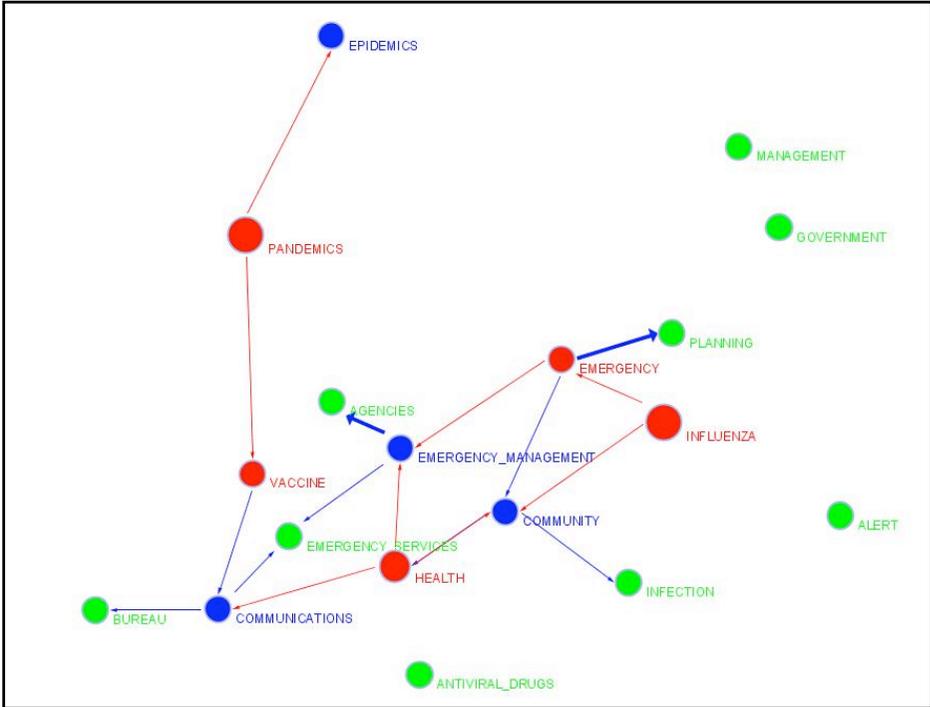
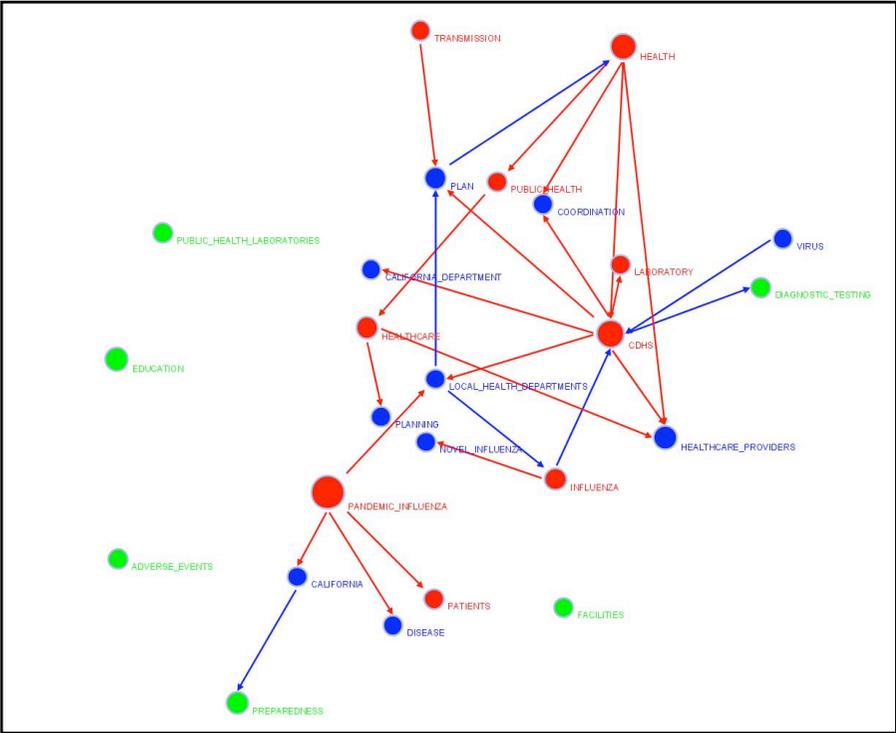
THEMAT Results – Similar and Unique Themes for Florida and California Pan Flu Plans

Intersection of collections	Unique to collection - CA	Unique to collection - FL
ANTIVIRAL DRUGS	ACTIVATING	ACTION PLAN
ANTIVIRALS	ACUTE PATIENTS	AGENCIES
BRIEFINGS	ADENOVIRUS	ALERT
CARE	ADEQUATE	ANTIVIRAL AGENTS
COMMUNICATE	ADMINISTRATION	ANTIVIRAL MEDICATIONS
CONTROL	ADVERSE EVENTS	BUREAU
COORDINATION	ADVISORY COMMITTEE	CARE WORKERS
DELIVERY	AIRBORNE	CHEMOPROPHYLAXIS
DISEASE CONTROL	ALTERNATE CARE SITES	CIRCULATING
DISEASE	ANTIVIRAL DRUG PROGRAM	CLINICAL CARE
DISTRIBUTING	ANTIVIRAL SUPPLIES	COLLABORATION
EMERGENCY MANAGEMENT	ASSESSMENT	CONSISTS
EMERGENCY	AUTHORITIES	COUNTY HEALTH
EPIDEMIOLOGY	AVAILABILITY	COUNTY
HEALTH	AVIAN INFLUENZA	DEATHS
HOSPITALS	AVIAN	DRUGS
INFECTION CONTROL	BEDS	EFFECTIVENESS
INFECTIONS	BUSINESS	EMERGENCY SERVICES
INFLUENZA VACCINE	CALIFORNIA DEPARTMENT	EPIDEMICS
INFLUENZA	CALIFORNIA	FLORIDA ACTION PLAN
LABORATORY	CAPACITY	FLORIDA DEPARTMENT
MANAGEMENT	CDHS ORGANIZATIONAL UNITS	FLORIDA DOH
MEDICATION	CDHS PANDEMIC INFLUENZA	FLORIDA
MONITORING	CDHS	GOVERNMENT
NATIONS	CLINICAL LABORATORIES	HEALTH CARE
NOVEL VIRUS	CLINICIANS	HEALTH EMERGENCY
PANDEMIC INFLUENZA	CLINICS	IMMUNIZATION
PANDEMICS	COHORT	MEDICALLY RELATED EMERGENCY
PATIENT	COMMUNICATION TEAM	MORTALITY
PLAN	COMMUNITY CONTAINMENT	NATION/COUNTRY
PRACTICE	COMMUNITY DISEASE CONTROL	NEWLY RECOGNIZED INFLUENZA
PREPARATION	COMMUNITY DISEASE	RECOGNIZED INFLUENZA VARIANT
PREPAREDNESS	COMMUNITY-BASED ACTIVITY RESTRICTIONS	RESPONSE CAPACITY
PREVENTION	COMMUNITY-BASED ACTIVITY	SEVERITY
PUBLIC HEALTH	COMPLIANCE	STAKEHOLDERS
RECOMMENDATIONS	CONSIDERATIONS	STATE AGENCIES
RECOVERY	CONSULTATION	VACCINE DELIVERY
REPORTING	CONTAINMENT	VIROLOGY
RESOURCES	CONTINGENCY PLANS	WORKERS
RESPONSE	COORDINATED COMMUNITY	
RISK	CRITERIA	
STRAINS	DCDC	
SURVEILLANCE	DESIGNATIONS	
TREATMENT	DETECTION	
VACCINE	DIAGNOSING	
VIRUS	DIAGNOSTIC TESTING	
	DIAGNOSTICS	
	DISASTER POLICY COUNCIL	
	DISEASE SURVEILLANCE SYSTEM	
	DISSEMINATION	
	DROPLET	
	EDUCATE CLINICIANS	
	EDUCATION	
	EFFICACY	
	EMERGENCY MANAGEMENT ORGANIZATION	
	EMERGENCY MEDICAL SERVICES	
	EMERGENCY PREPAREDNESS	
	ENHANCED LABORATORY	
	ENHANCING	
	EPIDEMIOLOGIC INVESTIGATIONS	
	EQUIPMENT	
	EVIDENCE	
	FACILITIES	
	FOOD	
	GLOBAL SURVEILLANCE SYSTEMS	
	GUIDANCE	
	GUIDELINES	
	H5N1	
	HEALTH DEPARTMENTS	
	HEALTHCARE FACILITIES	
	HEALTHCARE PARTNERS	
	HEALTHCARE PLANNING	
	HEALTHCARE PROVIDERS	
	HEALTHCARE SETTING	
	HEALTHCARE WORKERS	
	HEALTHCARE	
	HOTLINE	
	HUMAN INFLUENZA	
	HUMAN-TO-HUMAN TRANSMISSION	
	HUMANS	
	ILLNESS	
	INCUBATION PERIOD	
	INCUBATION	
	INFLUENZA ACTIVITY	
	INFLUENZA SURVEILLANCE	
	INFLUENZA VACCINE PROGRAM	

Unique to collection - CA	Unique to collection - FL
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ACUTE PATIENTS	AGENCIES
ADENOVIRUS	ALERT
ADEQUATE	ANTIVIRAL AGENTS
ADMINISTRATION	ANTIVIRAL MEDICATIONS
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ALTERNATE CARE SITES	CIRCULATING
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ANTIVIRAL SUPPLIES	COLLABORATION
ASSESSMENT	CONSISTS
AUTHORITIES	COUNTY HEALTH
AVAILABILITY	COUNTY
AVIAN INFLUENZA	DEATHS

kSigs for collections of documents (i.e. taxonomies) are displayed side-by-side so that similarities and differences can be readily discerned.

THEMAT Results – Theme Network (tNet) Displays for Florida and California Plans



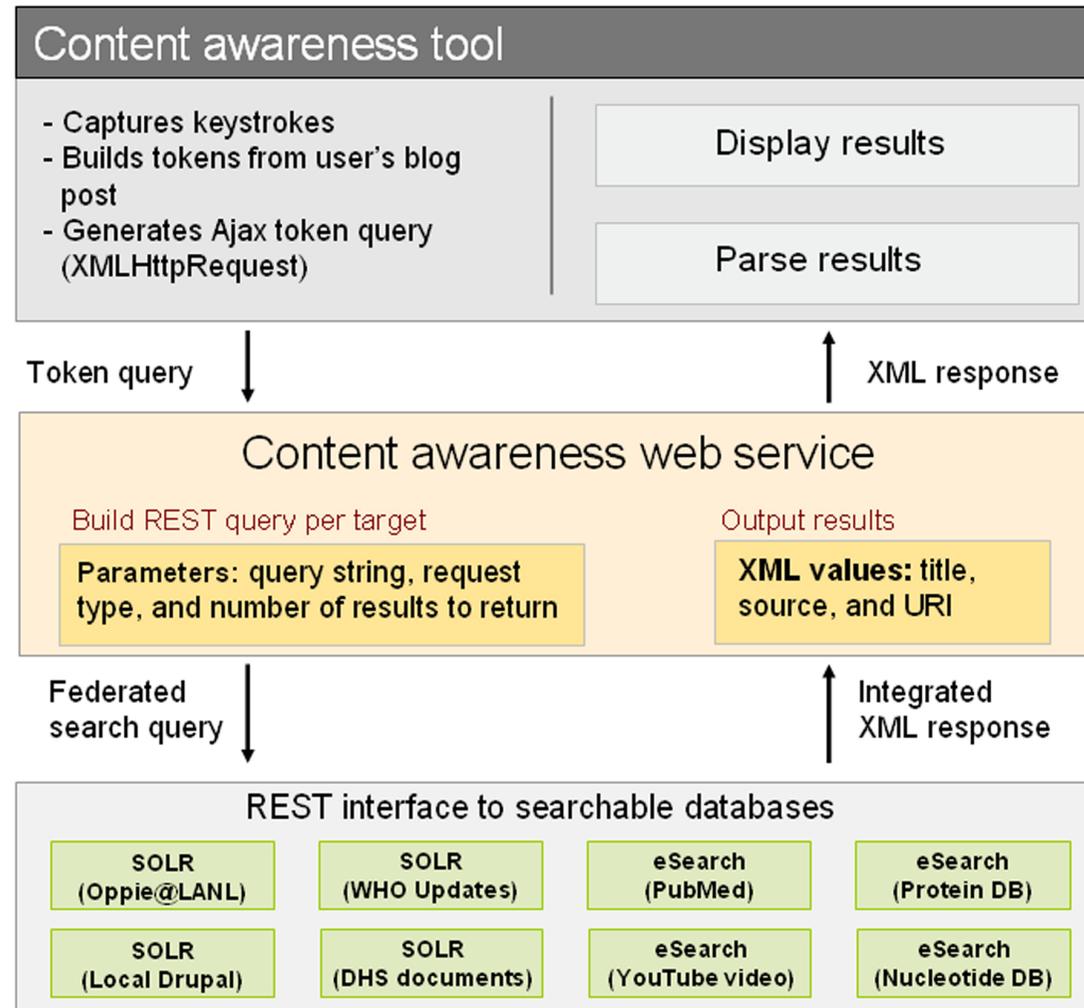
Conclusions about Theme Analysis with THEMAT

- **The THEMAT can be used for some tasks without an expert human-in-the-loop:**
 - Generating and highlighting a set of knowledge signatures (kSigs) for a document helps end users navigate through that document.
 - Displaying a side-by-side comparison of taxonomies for documents helps end users identify unique, overlapping or missing content.
 - Creating theme networks (tNets) allows end users to view and compare the higher-order themes.
- **Fully utilizing the THEMAT's capabilities requires an expert analyst who can use the tool to detect:**
 - Confusion of terminology.
 - Confusion of scale of operations and chain of command needed between federal and state.
 - Lack of actionable instructions such as clear time phased deployment of resources based on measurable trigger events. For example, “Case based treatment of victims with anti-virals will cease when...” “Operations of alternate medical treatment sites will be ‘federalized’ when...”

Content Awareness Tool (CAT) Test Steps

- Step 1: Create a repository of content at LANL.
- Step 2: Configure the CAT to include this repository as one of the targets of the federated search.
- Step 3: See what links to relevant content the CAT retrieves as users compose text such as situation reports required for incident action plans. (slide 15)

CAT Components



CAT Results – E-SOS Screen Shot

E-SOS

Blog post

Enter location name

Enter blog post below
 Pandemic flu plans, effective quarantine during pandemic flu, use of vaccines and antiviral medications during pandemic flu,

Topic awareness tool

- [\[PanFlu\] OPLAN - January 11, 2008](#)
- [\[DOE\] Inspection Report](#)
- [\[FDA\] FDA Announces Rapid Response Team to Combat Pandemic \(Avian\) Flu](#)
- [\[FEMA\] FEMA: 10 Questions with the Centers for Disease Control and ...](#)
- [\[DHS\] DHS | National Strategy for Pandemic Flu](#)
- [\[PanFlu\] Pandemic Flu Plans](#)
- [\[DOE\] US Department of Energy - A Decade of Discovery](#)
- [\[FDA\] What Is the Difference Between Pandemic Flu and Avian \(Bird\) Flu?](#)
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Results of a federated search of (1) one local repository of pandemic flu plans and (2) four websites with pandemic flu content

Conclusions about Decision Making Aided by CAT

- **Creating a repository of content allows the entire repository to become the target of a search.**
- **Creating a collection of smaller, finer-grained repositories is necessary to optimize the federated search capabilities of the CAT.**
- **Under these conditions, the CAT facilitates:**
 - Quickly locating content that is related to the topic the user is writing about.
 - Following links to that content.
 - Creating a list of references for the topic.

Conclusions Based on Text Analysis of Pan Flu Plans

[Conclusions will be updated and reviewed as testing proceeds.]

- **The technology is useful.**
 - It makes it possible to more carefully review all the relevant material by targeting key concepts.
 - It yields a set of changes needed to integrate plans.
 - It will be even more useful for information which is less structured and more fluid, such as situational information and public misinformation – rumors.
- **Some of the results are intuitive and can be understood by untrained end users without the help of an expert analyst.**
- **Other results are not intuitive and cannot be understood by untrained end users without the help of an expert analyst or additional functionality.**

Future Work

- **We want to look at less structured information for the public information officers and situation unit staff to analyze.**
- **Situation Unit Data Sources –**
 - “Planning Unit” email box
 - Situation Reports from federal, state and local response partners
 - EM Constellation centralized mission ordering and tracking system
 - Medical provider organizations’ information
- **Public Information Unit Data Sources –**
 - Last three sources above
 - Media news releases
 - Blogs and other unauthorized information
 - Reports from local PIOs

Future Potential

- **Based on the realization that:**
 - All disasters become primarily health and medical events after the initial impact and
 - No amount of preparation can handle some catastrophic scenarios
- **Discussions and plans of catastrophic incident management have moved from how the response system will support “victims” to how “survivors” will take care of themselves.**
- **So it will be important to:**
 - Use a large number of less structured information sources to understand the emergent organization which is developing
 - Be able to support netcentric management of the response system until the planned for command and control, incident command structure can be re-established.