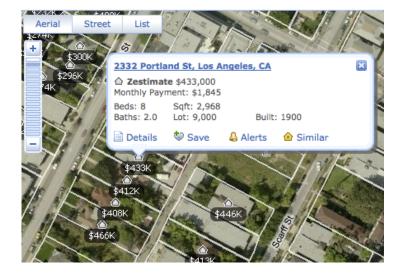
Building Geospatial Mashups to Visualize Information for Crisis Management

Shubham Gupta and Craig A. Knoblock

University of Southern California

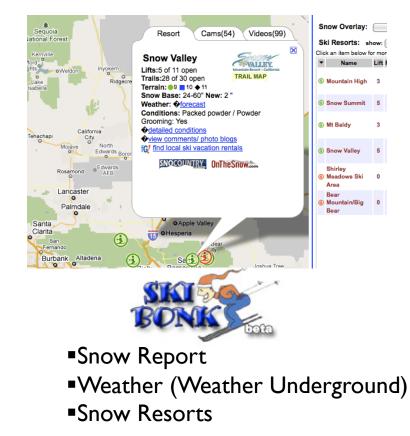
WHAT IS A GEOSPATIAL MASHUP?

Integrated View of data combined from diverse data sources on a Map





Real Estate ListingProperty Tax



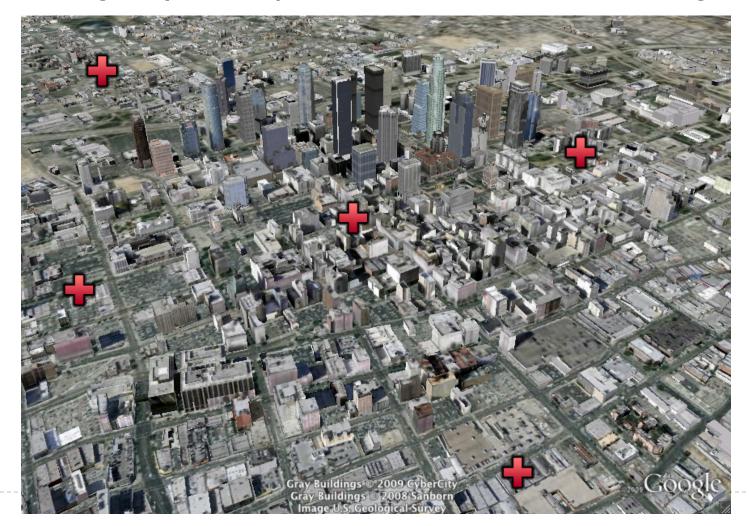
MOTIVATION: CRISIS MANAGEMENT

Characteristics of decision-making in such scenarios:

- Employs multiple data sources with heterogeneous data access and data representation types
- Takes place in time-sensitive environment: Every decision has to be taken promptly
- Various data visualization techniques are used such as graphs, timeline charts, etc. to understand the data better

MOTIVATION: CRISIS MANAGEMENT

An imaginary earthquake relief scenario in Los Angeles.



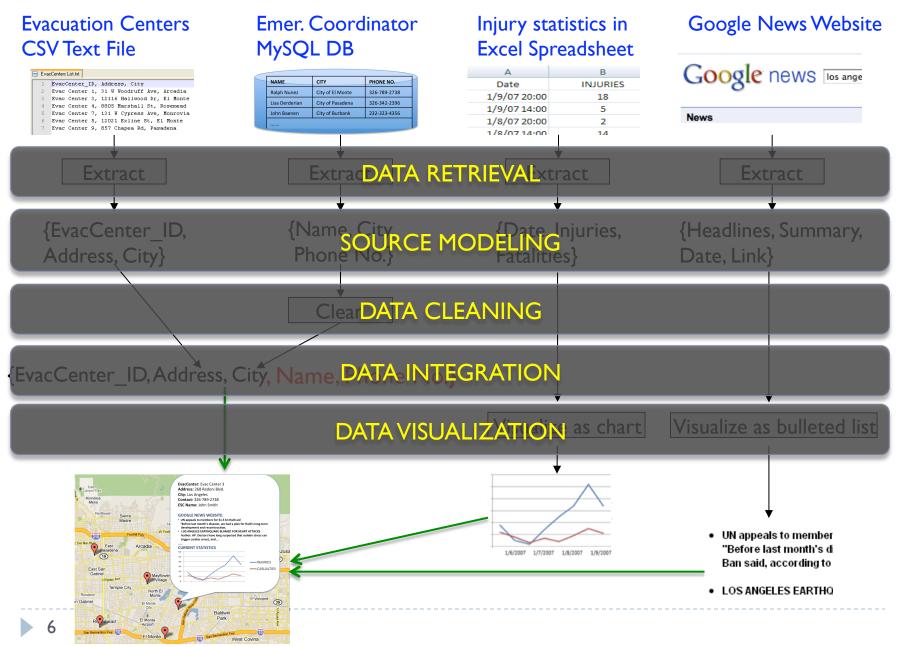
MOTIVATION: CRISIS MANAGEMENT

Analyst employs multiple data sources for decision-making



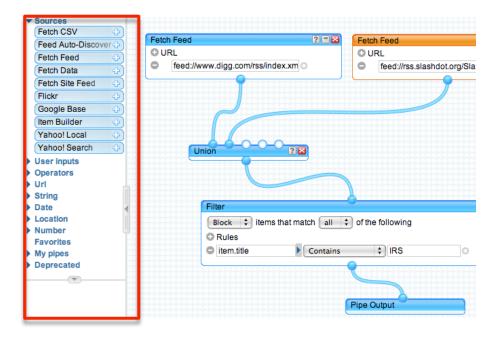
5

MASHUP BUILDING ISSUES



EXISTING APPROACHES

Existing solutions require some prior programming knowledge



- I. Mostly based on Widget Paradigm
 - Widgets (i.e., 43 for Pipes, 300+ for MS) represents an operation on the data
 - Locating and learning to customize widget can be time consuming
- 2. None of the current tools support customized data visualization!

Can we come up with a framework that addresses all of the issues while still making the Mashup building process easy?

OUR APPROACH

- In our earlier work, we introduced Programming-by-Demonstration approach to Mashup building.
 - Does not require any programming or widget knowledge.
 - Enables user to create a mashup by simply demonstrating the system on one or more concrete example.
- We present a Programming by Demonstration approach to support customized Data Visualization.

KARMA USER INTERFACE

able				(-	
Source1 Source2					Data ⁻	Table –	- Spreadsł	iee1
R-TimeDuration	PR-Number	Data Type		Data Ty			•	
ate	StockValue	Column Name		Column		Type Ir	nterface	
009-07-31 00:00:00	446.04							
009-07-24 00:00:00	429.88							
009-07-17 00:00:00	416.17							
009-07-10 00:00:00	406.5							
009-07-02 00:00:00	426.0							
009-06-26 00:00:00	416.95	Various Information	on					
009-06-19 00:00:00	421.5							
009-06-12 00:00:00	439.5	Integration						
009-06-05 00:00:00	418.73							
009-05-29 00:00:00	391.95	Operations						
009-05-22 00:00:00	394.73							
009-05-15 00:00:00	402.8							
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9

DATA RETRIEVAL

- Karma facilitates retrieval of data from structured data-sources, such as Excel spreadsheets, MySQL databases and CSV files.
- Karma also facilitates the extraction of data from semi-structured data sources such as web pages.

[😑 Evac	Centers List.txt	
	1	EvacCenter_ID,	Address, City
	2	Evac Center 1,	31 W Woodruff Ave, Arcadia
	3	Evac Center 3,	12116 Hallwood Dr, El Monte
	4	Evac Center 4,	8805 Marshall St, Rosemead
	5	Evac Center 7,	131 W Cypress Ave, Monrovia
	6	Evac Center 5,	12021 Exline St, El Monte
	7	Evac Center 9,	857 Chapea Rd, Pasadena

CSV Text File

А	В	С
Date	INJURIES	FATALITIES
1/9/07 20:00	18	12
1/9/07 14:00	5	8
1/8/07 20:00	2	3
1/8/07 14:00	14	7
1/7/07 20:00	25	4
1/7/07 14:00	34	9
1/6/07 20:00	52	15
1/6/07 14:00	34	11

Excel Spreadsheet

10

CITY PHONE NO. NAME Ralph Nunez City of El Monte 326-789-2738 Lisa Derderian **City of Pasadena** 326-342-2396 John Baenen City of Burbank 232-323-4356

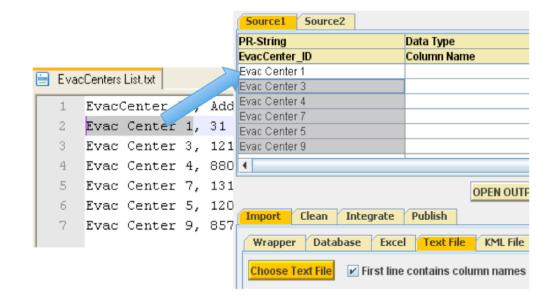
MySQL Database

 Google news
 Ios angeles earthquake
 Search

 News
 Images
 Image
 <

DATA RETRIEVAL

- The retrieval of data from structured data-sources, such as Excel sheets and CSV files is done through a drag and drop mechanism.
- The user is only required to select a sample data-element and drop it into Karma's data table.



DATA RETRIEVAL

• Extraction of data from HTML web-pages is done using software wrappers.

<u> </u>	Datetime 9 9 hours ago 1 hour ago 17 hours ago	Source Monsters and Critics.com Los Angeles Times 9&10 News	Data T 🔺 Colum	
tp://news.google.com/ tp://news.google.com/ tp://news.google.com/ tp://news.google.com/	9 hours ago 1 hour ago 17 hours ago	Monsters and Critics.com Los Angeles Times 9&10 News	<u>Colum</u>	
p://news.google.com/ p://news.google.com/ p://news.google.com/	1 hour ago 17 hours ago	Los Angeles Times 9&10 News		
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		Gather.com		
tp://news.google.com/	Feb 8, 2010	Los Angeles Times		
p://news.google.com/	17 hours ago	OurSports Central (pres		
p://news.google.com/	1 hour ago	WTW		
p://news.google.com/	15 hours ago	Ney		
p://news.google.com/	Feb 1, 2010	7		
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				•
		all the av	/alla	ble wrappers on
L File		the	loc	al machine.
		And		
CompanyName,Addres	S			
Headline,Summary,Url	I Los Angeles Earthqua			
		Execute		
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	p://news.google.com/ p://news.google.com/ p://news.google.com/ !!! III III File Output Parameter Nar CompanyName,Addree	p://news.google.com/ 1 hour ago p://news.google.com/ 15 hours ago p://news.google.com/ 15 hours ago p://news.google.com/ Feb 1, 2010	p://news.google.com/ 1 hour ago WTW p://news.google.com/ 15 hours ago New WTW p://news.google.com/ 15 hours ago New WTW WE Wrapper all the average of the second	p://news.google.com/ 1 hour ago p://news.google.com/ 15 hours ago p://news.google.com/ Feb 1, 2010 Wrw Wrapper Lib all the availal the loca Output Parameter Names CompanyName,Addres Execute Execute

Table

SOURCE MODELING

- Karma automatically generates the semantic types of each attribute to learn the underlying model of the data source.
- Supervised machine learning techniques are used to generate a set of patterns for each semantic type from training data.

-String	PR-String	PR-Address
etAddress	City	StreetAddress
3 Portland St.	Los Angeles	2353 Portland St.
rchard Ave.	Burbank	
' Glenmoor Cir.	Milpitas	543 Orchard Ave.
2 Hawthorne Blvd	Pasadena	417 Glenmoor Cir.
25 Abbot Ave.	Santa Clara	6472 Hawthorne Blvd
	Canta chara	325 Abbot Ave.

Initial Semantic Type

Manually label the data with the correct semantic type for training

PR-String City

Los Angeles Burbank Milpitas Pasadena Santa Clara

	Source1 Source2	Source3	Source4
C	PR-Address	P	R-String
	Audress	E	vacCenter_ID
	31 W Woodruff Ave	E	vac Center 1
	12116 Hallwood Dr	E	vac Center 3
	8805 Marshall St	E	vac Center 4
	131 W Cypress Ave	E	vac Center 7
	12021 Exline St	E	vac Center 5
	857 Chapea Rd	E	vac Center 9

When the new data is imported of same type, Karma automatically labels it correctly

DATA CLEANING

- Karma performs the data cleaning by learning and applying the transformation rules that are learnt from the user specified example.
- Example:

PR-String	PR-String	PR-String
City	Coordinator_Name	City
City of Agoura Hills	Carol Tubelis	City of Agoura Hills
City of Alhambra	Bat. Chief Ray Mosack	City of Alhambra
City of Arcadia	Chief Dave Odell	City of Arcadia
City of Artesia	Madalena Galindo	City of Artesia
City of Duarte	Brian Villalobos	•
City of El Monte	Ralph Nunez	City of Duarte
Initial data	a source	User provide

Source1 Source	2 Source3		
PR-String	P	R-String	
City	C	oordinator_Name	
Agoura Hills	C	arol Tubelis	
Alhambra	В	at. Chief Ray Mosack	
Arcadia	C	hief Dave Odell	
Artesia	N	ladalena Galindo	
Duarte	B	rian Villalobos	
El Monte	F	Ralph Nunez	

Data source after cleaning

i k Sening	Data Type
City	User Defined Values
City of Agoura Hills	Adoura Hills
City of Alhambra	
City of Arcadia	
City of Artesia	
City of Duarte	
Source1 Source2 Cleaning Table	
Source1 Source2 Cleaning Table PR-String	Data Type
	Data Type User Defined Values
PR-String	
PR-String City	User Defined Values
PR-String City City of Agoura Hills	User Defined Values
PR-String City City of Agoura Hills City of Alhambra	User Defined Values Agoura Hills Alhambra
PR-String City City of Agoura Hills City of Alhambra City of Arcadia	User Defined Values Adoura Hills Alhambra Arcadia
PR-String City City of Agoura Hills City of Alhambra City of Arcadia City of Arcadia	User Defined Values Agoura Hills Alhambra Arcadia Artesia

Data Type

Karma applies the learned transformation rules over remaining data

DATA INTEGRATION

- Karma detects and ranks its potential integration with other sources based on the common attribute names and matching semantic types.
- Karma suggests potential joins between the current data sources in the form of column completions.

Source1 Source2			
PR-String	PR-Address	PR-String	Data Type
EvacCenter_ID	Address	City	Column Name
Evac Center 1	31 W Woodruff Ave	Arcadia	
Evac Center 3	12116 Hallwood Dr	El Monte	
Evac Center 4	8805 Marshall St	Rosemead	
Evac Center 7	131 W Cypress Ave	Monrovia	
Evac Center 5	12021 Exline St	El Monte	
Evac Center 9	857 Chapea Rd	Pasadena	

Column completion

DATA INTEGRATION

Source1	Source2	Source:	3						
R-String			PR-Address	PR-String	Data Type		[
vacCenter_I	D		Address	City	Select Column Name				
vac Center 1		:	31 W Woodruff Ave	Arcadia	Select Column Name				
vac Center 3	}		12116 Hallwood Dr	El Monte	Name 👝				
vac Center 4	ļ		8805 Marshall St	Rosemead	Phone No.				
vac Center 7	,		131 W Cypress Ave	Monrovia					
vac Center 5	i		12021 Exline St	El Monte					
vac Center 9)		857 Chapea Rd	Pasadena					
						N	AME	CITY	PHONE NO.
•							- Jule Niverse	City of El Monto	226 700 2720
Import	Clean In	tegrate	Publish			R	alph Nunez	City of El Monte	326-789-2738
		regrate	Tublish			Li	sa Derderian	City of Pasadena	326-342-2396
Join						Jo	ohn Baenen	City of Burbank	232-323-4356

Karma suggests the possible column completions in a drop down list

PR-String	PR-Address	PR-String	PR-String	
EvacCenter_ID	Address	City	Name	
Evac Center 1	31 W Woodruff Ave	Arcadia	Chief Dave Odell	
Evac Center 3	12116 Hallwood Dr	El Monte	Ralph Nunez	
Evac Center 4	8805 Marshall St	Rosemead	Donna Wagner	
Evac Center 7	131 W Cypress Ave	Monrovia	Dave Dennis	
Evac Center 5	12021 Exline St	El Monte	Ralph Nunez	
Evac Center 9	857 Chapea Rd	Pasadena	Lisa Derderian	

MySQL Database loaded as a another source in Karma

.....

Karma executes the join query once the user selects an option and displays the result

DATA VISUALIZATION

- Definition: Representation of data in a visual form to amplify cognition.
- Example: Timeline charts, Graphs, Tables, etc.
- Application:
 - Summarization of large data
 - Providing qualitative overview
 - > Detecting patterns, anomalies and relationships in data
 - Identify regions of interest in large and complex datasets

CRITICAL TOOL FOR EFFICIENT DATA ANALYSIS!



DATA VISUALIZATION

• Example:

Which evacuation center is handling more casualties than its capacity?

10 9 53 60 11 10 87 60 12 11 26 60 13 12 21 60 14 13 73 90 15 14 56 90	\diamond	A	B	C		
3 2 13 40 4 3 12 40 5 4 9 40 6 5 35 40 7 6 44 60 8 7 39 60 9 8 42 60 10 9 53 60 11 10 87 60 12 11 26 60 13 12 21 60 14 13 73 90 15 14 56 90	1	Evacuation Center ID	Casualties	Capacity		
4 3 12 40 5 4 9 40 6 5 35 40 7 6 44 60 8 7 39 60 9 8 42 60 10 9 53 60 11 10 87 60 12 11 26 60 13 12 21 60 14 13 73 90 1 2 3 4 5 6 7 8 9 10 11 12 13		1	23	40	90	_
5 4 9 40 6 5 35 40 7 6 44 60 8 7 39 60 9 8 42 60 10 9 53 60 11 10 87 60 12 11 26 60 13 12 21 60 14 13 73 90 15 14 56 90				40	80	
5 4 9 40 6 5 35 40 7 6 44 60 8 7 39 60 9 8 42 60 10 9 53 60 11 10 87 60 12 11 26 60 13 12 21 60 14 13 73 90 15 14 56 90		3	12	40	70	
0 33 340 7 6 44 60 8 7 39 60 9 8 42 60 10 9 53 60 11 10 87 60 12 11 26 60 13 12 21 60 14 13 73 90 15 14 56 90		4	9	40		
8 7 39 60 9 8 42 60 10 9 53 60 11 10 87 60 12 11 26 60 13 12 21 60 14 13 73 90 15 14 56 90		5	35	40	60	
9 8 42 60 10 9 53 60 11 10 87 60 12 11 26 60 13 12 21 60 14 13 73 90 15 14 56 90					50	
10 9 53 60 11 10 87 60 12 11 26 60 13 12 21 60 14 13 73 90 15 14 56 90					40	_
10 9 53 60 11 10 87 60 12 11 26 60 13 12 21 60 14 13 73 90 15 14 56 90					30	
11 10 87 60 12 11 26 60 13 12 21 60 14 13 73 90 15 14 56 90		9	53	60		
13 12 21 60 0 1 <td></td> <td>10</td> <td>87</td> <td>60</td> <th>20</th> <td></td>		10	87	60	20	
14 13 73 90 1 2 3 4 5 6 7 8 9 10 11 12 13 15 14 56 90 90 1		11	26	60	10 +	
15 14 56 90		12	21	60		
		13	73	90	1 2 3 4 5 6 7 8 9 10 11	12 13
16 15 42 90 Casualties		14	56	90		
	16	15	42	90	Casualties	

BETTER VISUALIZATION!

The user demonstrates the desired data visualization by specifying some examples using a drag and drop mechanism. E.g. Visualize News data as bulleted lists in final mashup:

R-String	PR-Date	PR-String	PR-URL	Data Type 🔺	
	Date	Summary	Link		 KILLER QUAKE: AFTERSHOCKS
	1/9/2007	The anniversary Tuesday of		Generated 🛛 💙	OF CHAOS FEAR WORLD AWAY
OS ANGELES EARTHQU	1/9/2007	Author: AP. Doctors have lo	http:///www.sec.		BUT
an Indicted in Earthquake		This is considered the larg.			The anniversary Tuesday of the
9 Earthquake Rattles Muc		A series of aftershocks fro			
INOR EARTHQUAKE SHA	1/9/2007	A moderate earthquake jolt	http://www.reuters.com/arti.		terrible Los Angeles earthquake was
					supposed to be a day of celebration
					o time to look back proudly on the
			Output Prev	view	
		(•		
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					TABLE FORMAT
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					TABLE FORMAT
					TABLE FORMAT
					(Drag data to this section for Table form

Karma currently supports four types of visualization formats:

I. Chart Format:

- Useful for visualizing:
 - Numerical Statistics
 - Time Based Events
- Karma uses Google Charts API to dynamically generate charts in final mashup.
- Karma attempts to find the best suitable chart for data using its semantic types.

wbd_CM_4.xls Source	2				1 / С. аз
PR-DateTime	PF	String		nber	
Date	Ev	ent			dwn split 1
1999-12-14 00:00:00	Pι	mp Failure			I/L 6t
2000-08-31 00:00:00	TL	86 dwn split replace	e 40 class		ump Failu
2001-01-05 00:00:00	T/I	did not find leak Re	place tbg		
2003-07-21 00:00:00	T/I	. 6th Jt Split in Poly T	bg, Hydro		19
2004-11-04 00:00:00	P8	A well see WBD			
2009-07-29 00:00:00	52.0		15.0		

Time	ine Chart					
I /L did not find le	I /L did not find leak Replace tbg. w/ SS jts					
	P&A well see WBI					
dwn split replace 40 cl						
I /L 6th Jt Split in	Poly Ibg, Hydro Iest Ibg OK (
ump Failure						
19 20	20 20 20					
1	1					
ттет	FORMAT					

Karma currently supports four types of visualization formats:

2. Paragraph Format:

- Useful for visualizing descriptive text data such as Wikipedia definitions.

Source1 Source2 PR-String PR String Paragraph1 agrap Los Angeles (pronounced /lbs . Los Ange	'ændʒələs/ los-AN-jə-ləs; Spanish: [los 'aŋxeles], Spanish for "the angels") is the largest city in the state of California and the second largest in the United States [1]. Often	
--	---	--

3. List Format:

 Useful for visualizing information in a bulleted list such as list of summarized news articles

QUAKE: AFTERSHOCKS
OS, FEAR WORLD AWAY
versary ruesday or me os Angeles earthquake was I to be a day of celebration,
look back proudly on the
ł

Karma currently supports four types of visualization formats:

4. Table Format:

 Useful for visualizing information that is best presented in a row-and-column format such as numerical values etc.

Source1 Source2		Evacuation	<i>a b b</i>	<i>a</i>
PR-Number	PR-Number	Center ID	Casualties	Capacity
Evacuation Center ID	Casualties	1.0	23.0	40.0
1.0	22.0	1.0	23.0	40.0
2.0	10.0	2.0	13.0	40.0
3.0	12.0	3.0	12.0	40.0
4.0	9.0	5.0	12.0	40.0
5.0	35.0	4.0	9.0	40.0
6.0	44.0			
		_		

RESULTS CAN BE PUBLISHED IN MULTIPLE FORMATS

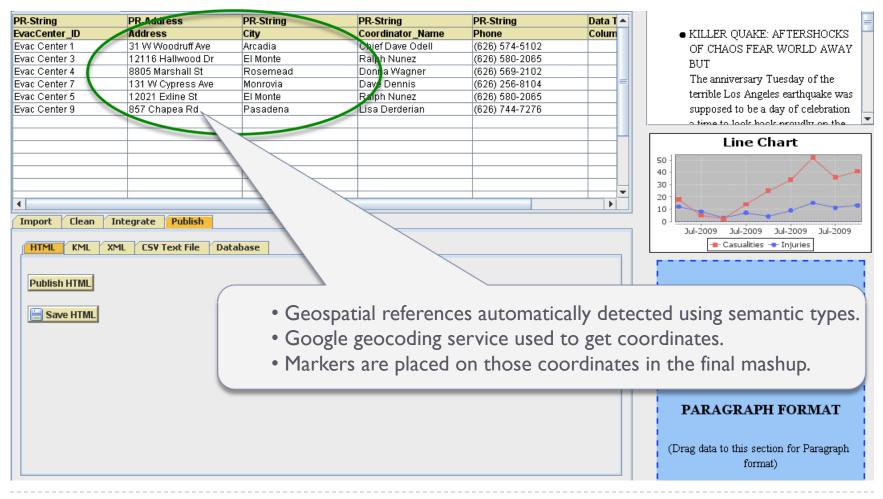
Karma lets you export your final mashup in variety of formats:

- HTML Page

- Datab	ase table	e1 Source2	Source3 Source4					
	PR-Str	ng	PR-Address	PR-String	PR-String	PR-String		
- KML	Layer EvacCo	nter_ID	Address	City	Coordinator_Name	Phone		
	Evac C	enter 1	31 W Woodruff Ave	Arcadia	Chief Dave Odell	(626) 574-5102		
- XML	Eilo Evac C	enter 3	12116 Hallwood Dr	El Monte	Ralph Nunez	(626) 580-2065		
	Evac C	enter 4	8805 Marshall St	Rosemead	Donna Wagner	(626) 569-2102		
	Evac C	enter 7	131 W Cypress Ave	Monrovia	Dave Dennis	(626) 256-8104		
- CSVT	ext File	enter 5	12021 Exline St	El Monte	Ralph Nunez	(626) 580-2065		
	Evac C	enter 9	857 Chapea Rd	Pasadena	Lisa Derderian	(626) 744-7276		
	1 Impo	't Clean Int	egrate Publish					
	HTML KML XML CSV Text File Database Publish XML							
Different n publishing o		Save XML						

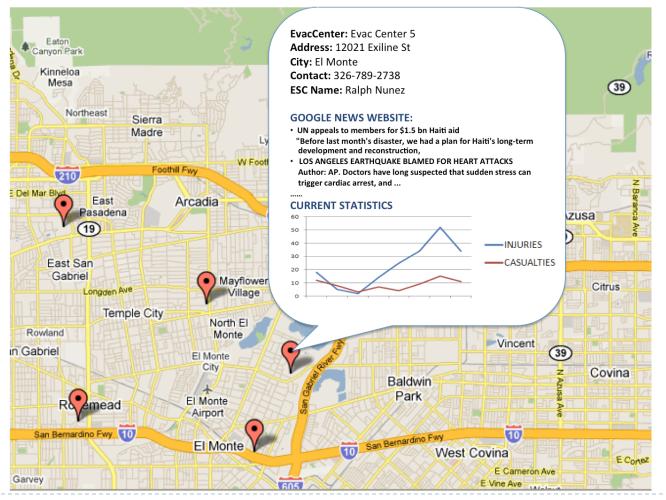
AUTOMATICALLY FINDS GEOSPATIAL REFERENCES

Final mashup output in HTML web page format:



CONSTRUCTS A MAP WITH USER-DEFINED LAYOUT

Final mashup output in HTML web page format:



25

RELATED WORK

• Existing and Past mashup building tools:

YAHOO! Pipes



- Lot of research has been done on data visualization, esp. within data mining and knowledge discovery communities.
 - Improved Sammon algorithm for visualizing sparse data [Martin et al. 2004].
 - Interactive High dimensional data visualization [Buja et al. 1996]
- None of the current (or past) mashup building tools support customized data visualization in the final mashup output.

CONCLUSION

 Geospatial Mashups can be instrumental for efficient and judicious decision-making in crisis management.

 Visualization By Demonstration approach lets the user customize the mashup output without any programming.

 Users can now construct a mashup in one seamless integrated process including data visualization.

FUTURE WORK

- Integrate more visualization formats such as scatter plots, 2D/3D isosurfaces, etc.
- Provide the ability to save the plans for extracting and integrating the data so that they can be applied to the new data.
- Provide the ability to support dynamic view of data (to reflect the changes made to data in the mashup).
- Support the integration of geospatial data in mashups (i.e., vector layers, raster layers).

THANK YOU!

Any Questions? Comments?