



# Visual Analysis of Textual and non-Textual Documents

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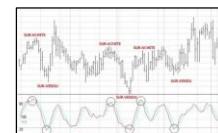
UX Day Graz 2015, 14.11.2015



## Large, Complex Data

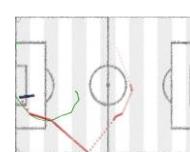
### Technological progress

- Acquisition, production, storage
- Data integration, data mining
- Large and increasing amounts of data



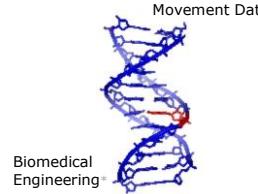
### Data-intensive application domains

- Business, Research
- Biomedical Engineering
- Social Media



### User Tasks

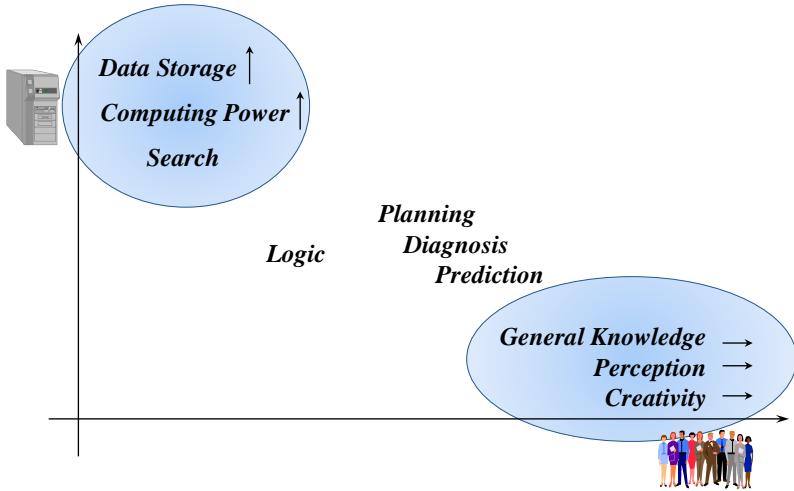
- Search for data items
- Explore for patterns of interest
- Communicate



(\* ) Wikimedia Commons



## Abilities of Humans and Computers



Slide courtesy of Daniel Keim



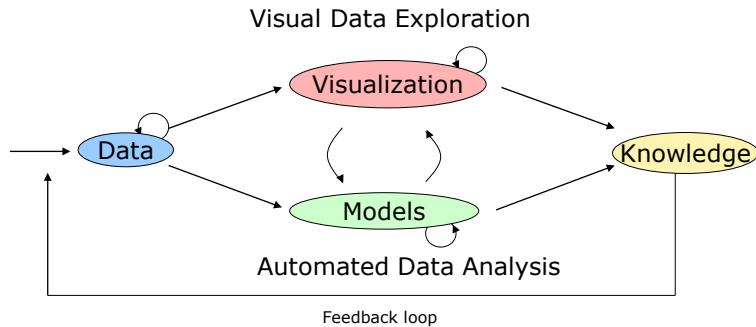
## Why Interactive Visualization ?

- Automated techniques not sufficient
  - Data ambiguous and incomplete
  - Complex relationship
  - Semantic gaps
  - Limited Accuracy
- Visual-interactive access central for
  - Exploration of Data
  - Generation of Hypotheses
  - Interpretation of Results
  - Steering of the Analysis



# Visual Analytics Process

Tight Integration of Visual and Automatic Data Analysis  
Methods for Information Exploration and Scalable Decision Support

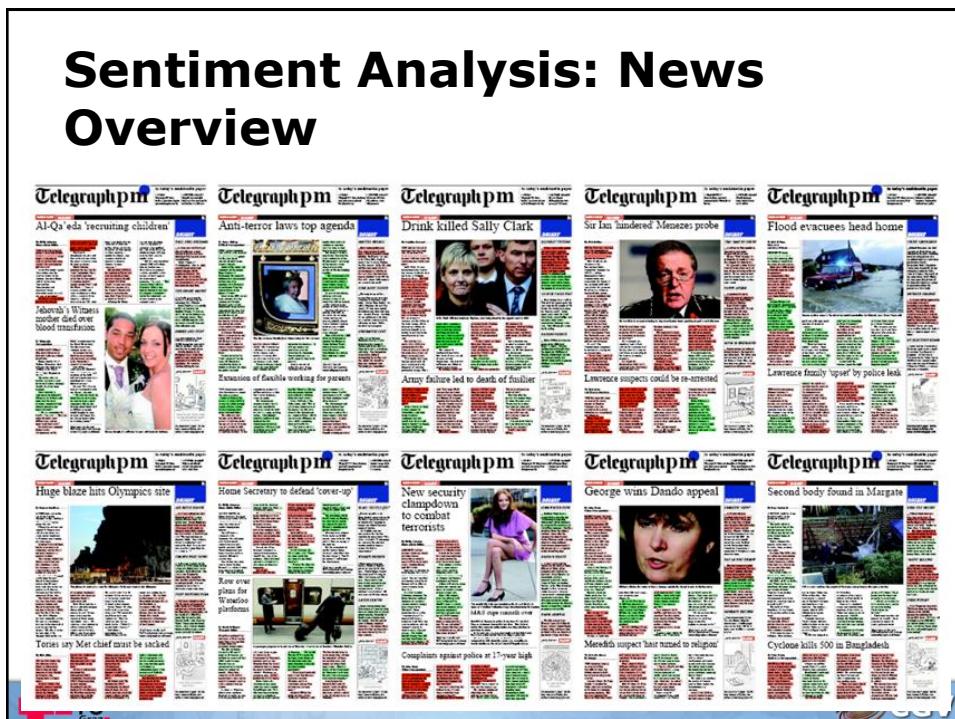


Keim, D., Kohlhammer, J., Ellis, G., Mansmann, F. (eds.): **Mastering the information age: solving problems with visual analytics**. Eurographics Association (2011)



- Introduction
- Visual Analysis of Textual Data
- Social Media Data
- Visual Data Retrieval
- Conclusions





# Readability Features

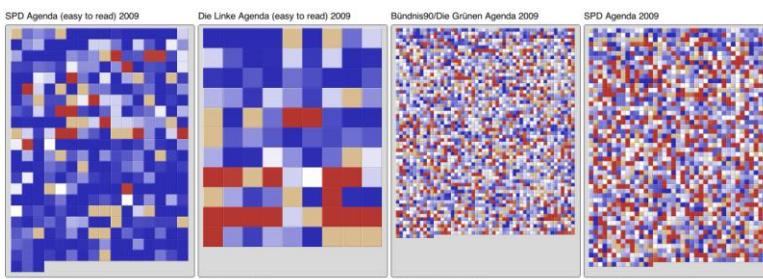
	Voc. Difficulty	Word Length	Nominal Forms	Sent. Length	Comp. Sent. Struc.
Analysis of word frequencies: Large document collections such as the Project Gutenberg ( <a href="http://www.gutenberg.org/">http://www.gutenberg.org/</a> ) or Wikipedia ( <a href="http://www.wikipedia.com">http://www.wikipedia.com</a> ) allow to calculate the average usage frequency of a word 1 We exploited those resources to determine how common the words of a text sample on average are.					
This measure is related to the one already proposed in [16], following the assumption that parts of the sentence that are interrupted by subordinate sentences or parenthesis have to be stored in a temporary memory which increases the mental complexity of processing the sentence.					
The implementation of 141 different simple text features allows us an unbiased search for text features with high expressiveness with respect to readability.					
Die Literaturangabe in der BibTex Datei muss noch vervollständigt werden!					
Among the most popular ones are the Flesch-Kincaid Readability Test [12], Flesch Reading Ease [7], SMOG [13], the Coleman-Liau-Index [4], and Gunning Fog [8].					



D. Oelke, D. Spretke, A. Stoffel and D. A. Keim. **Visual Readability Analysis: How to make your writings easier to read**. Proceedings of IEEE Conference on Visual Analytics Science and Technology (VAST '10), pages 123 - 130, 2010.



## Vocabulary Difficulty (2009 German Election Programs)

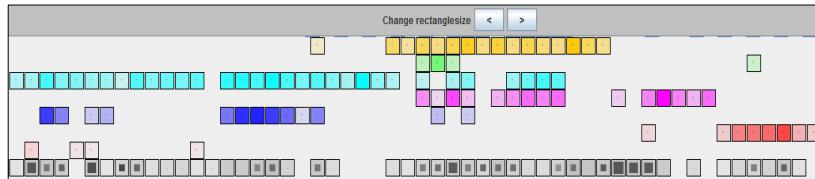


Die Linke

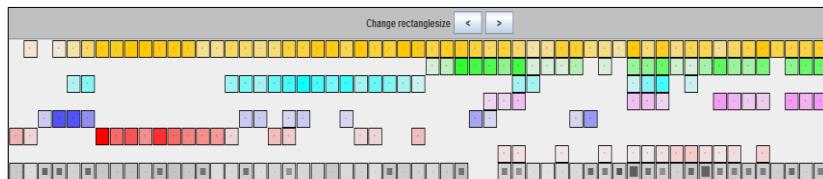
Piraten



# Attribute-based: Story, Character Complexity



King's IT



Rowling's Harry Potter



F. Wanner, J. Fuchs, D. Oelke and D. A. Keim. **Are my Children Old Enough to Read these Books? Age Suitability Analysis.** POLIBITS - Research journal on Computer science and computer engineering with applications. 2011.



# Attribute-based: Visual Review Analysis

- User opinions abundantly available
  - Forums, Blogs
  - E-commerce
  - ...
- Many application possibilities
  - Product reviews for customers
  - Market analysis
  - Customer relationship management

**Amazon customer reviews**  
(amazon.com)



# Attribute-based: Visual Review Analysis

- Basic method
  - Identify product attributes
  - Identify positive/negative opinions
  - Calculate weighted attribute vector
- Visual comparison of sets of reviews
  - Glyph matrix approach
  - Cluster analysis
- Applied to printer product reviews

I feel obligated to counter the **bad** reviews.

This **printer** is just **fine**.

I don't know what people are **complaining** about regarding the **software** but it installed **seamlessly** and is **intuitive** in its operation.

Even though the **paper tray** **jams** sometimes altogether I am **happy** that I bought this **wonderful** **printer**.



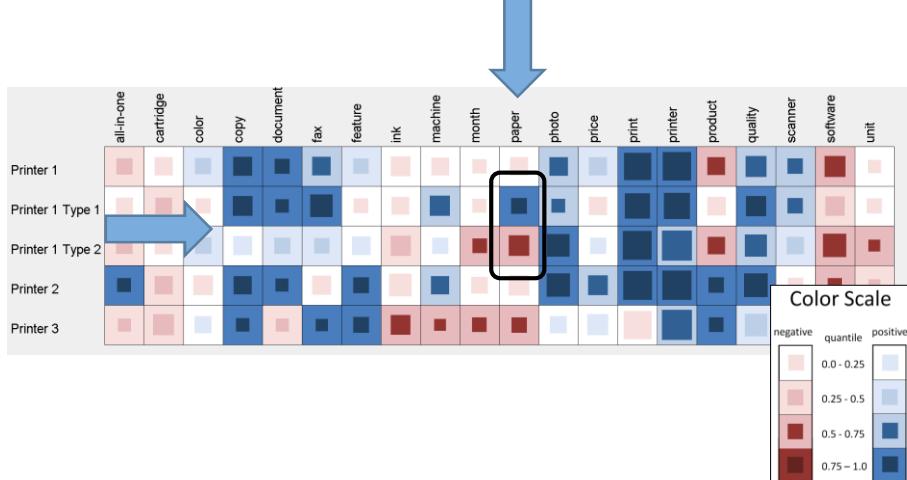
cartridge	paper tray	price	printer	scanner	software
0	-1	0	+1	0	+1



D. Oelke, M. C. Hao, C. Rohrdantz, D. A. Keim, U. Dayal, L.-E. Haug and H. Janetzko. **Visual Opinion Analysis of Customer Feedback Data**. Proceedings of the 2009 IEEE Symposium on Visual Analytics Science and Technology (VAST '09), pages 187-194, 2009.

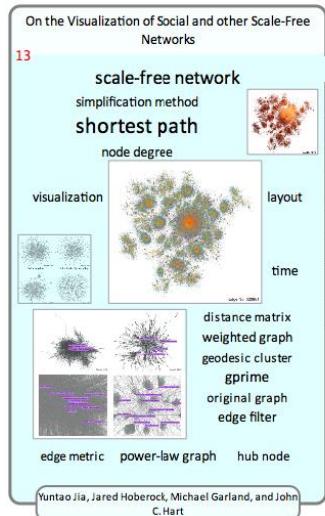


# Attribute-based: Visual Review Analysis



# Visual Content Overviewing

- Visual abstract for scientific articles
  - Extraction of important figures and keyword
  - Layout of elements in generalized word cloud
- Overviewing
- Navigation
- Comparison



 H. Strobelt, D. Oelke, C. Rohrdantz, A. Stoffel, D. A. Keim and O. Deussen. **Document Cards: A Top Trumps Visualization for Documents**. IEEE Transactions on Visualization and Computer Graphics, 15(6):1145-1152, 2009. 

# Visual Content Overviews



 CGV

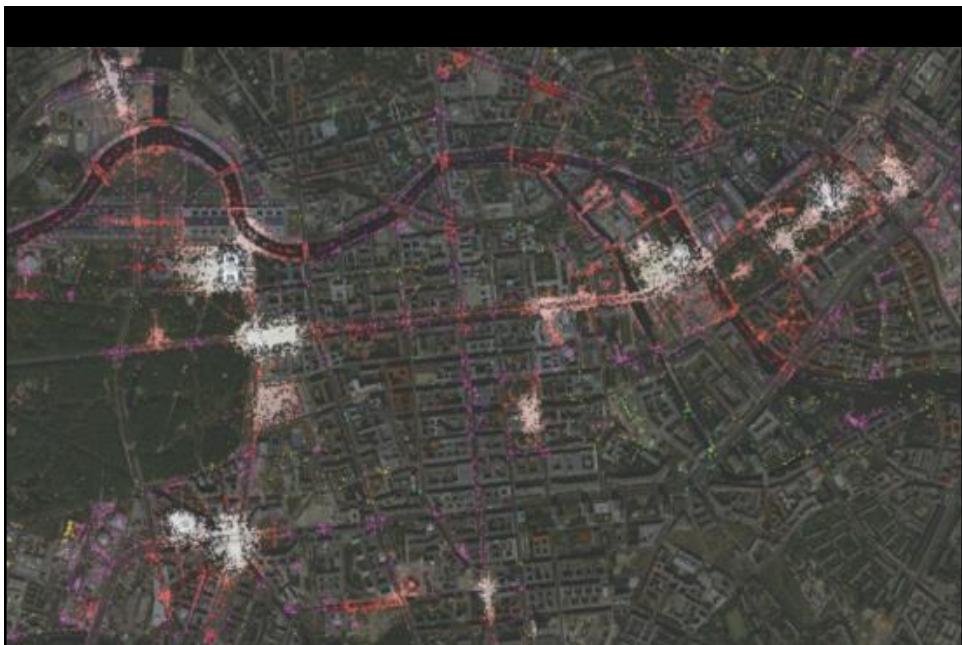
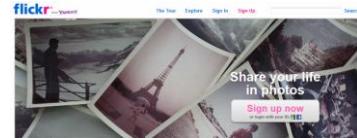
# Visual Content Overviews

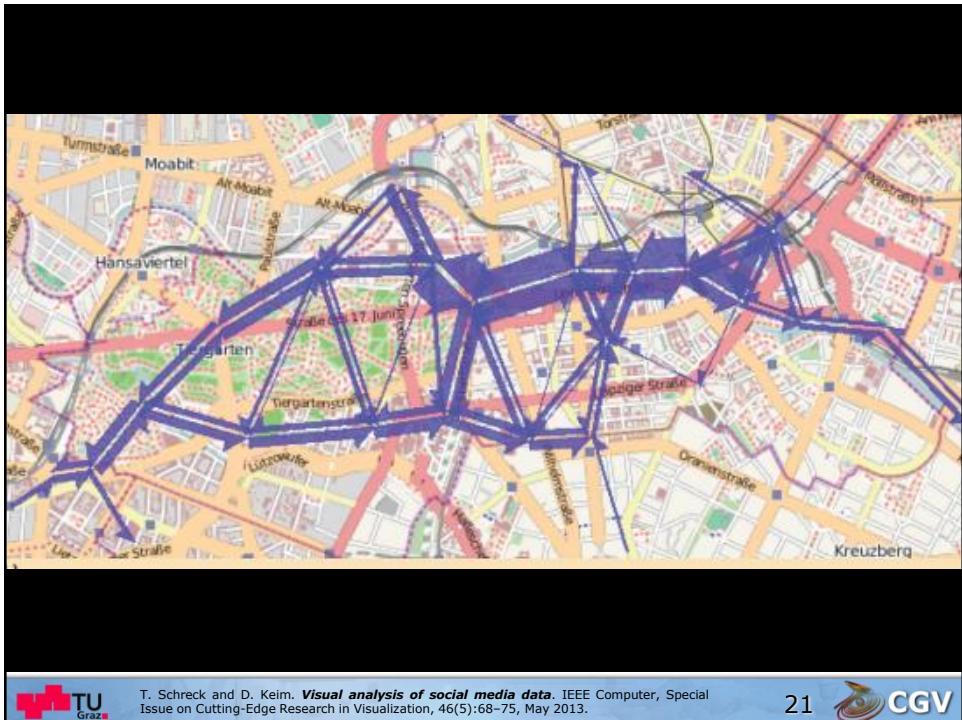


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# Visual Analysis of Social Media Data

- Social media important data
  - Content (text, visual, geospatial, ...)
  - Metadata (location, time, user, ...)
- Cases for analysis
  - Marketing
  - Sentiment mining
  - Disaster response, security



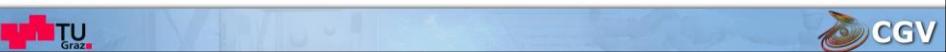
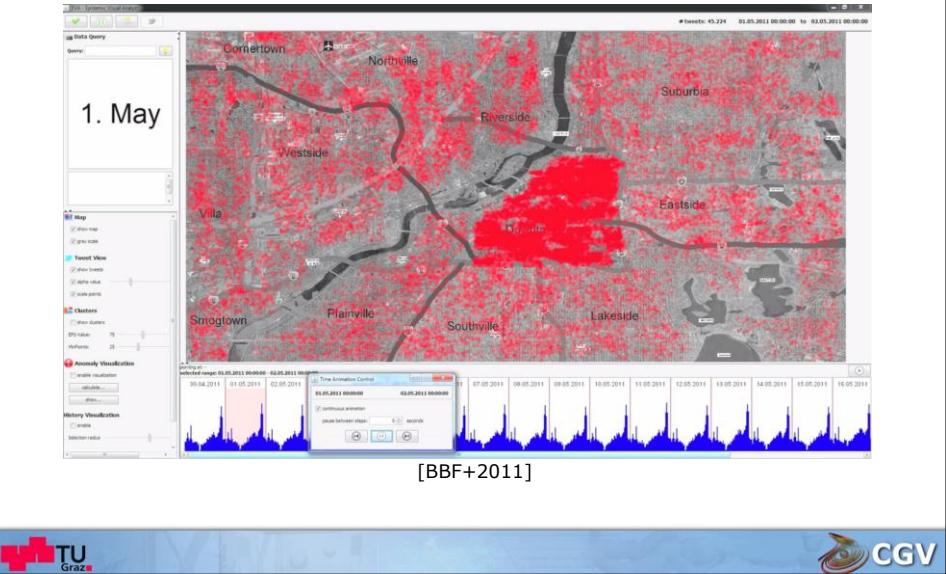


## VAST Challenge 2011: Epidemic Spread

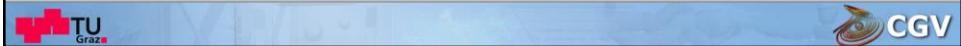
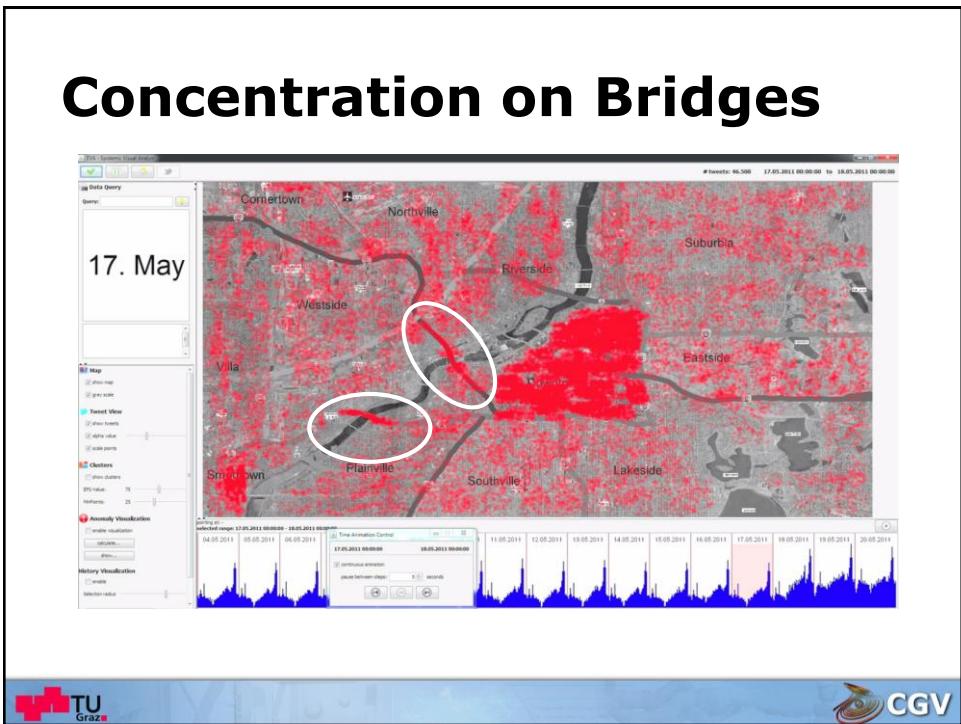
- **Scenario**
  - Metropolitan city with street network and POIs
  - 1M geo-located microblog messages
  - Fictitious hidden epidemic scenario
  
- **Task**
  - Find possible epidemic spread and its characteristics

22 CGV

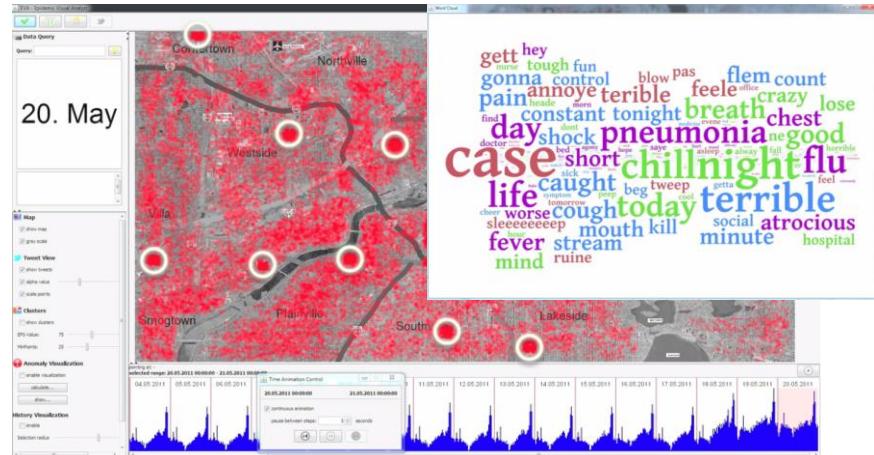
# VAST Micro Blogging Challenge



# Concentration on Bridges



# Concentration in Hospitals



# VAST Challenge 2011: Epidemic Spread

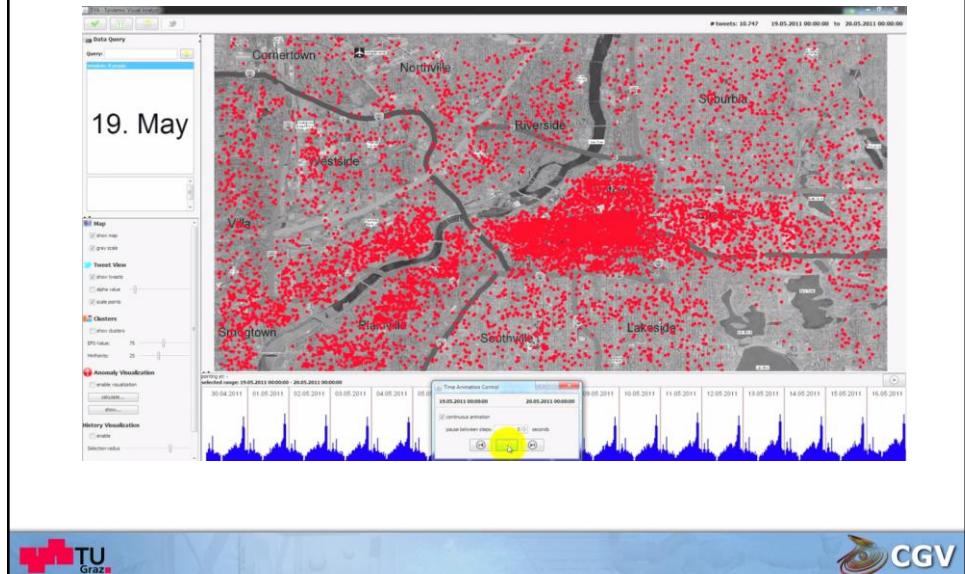
## Tweets Over Time

April 30<sup>th</sup> – May 20<sup>th</sup>

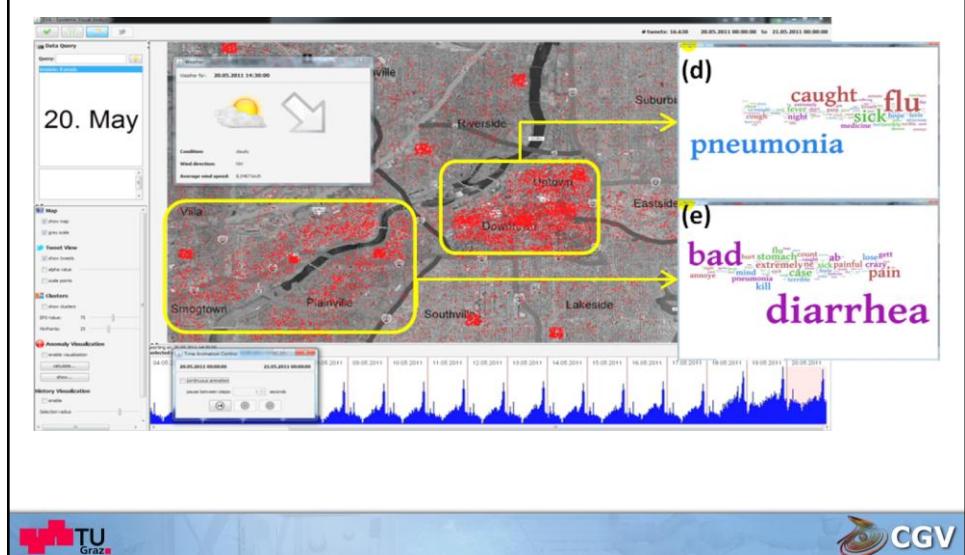
E. Bertini, J. Buchmüller, F. Fischer, S. Huber, T. Lindemeier, F. Maaß, F. Mansmann, T. Ramm, M. Regenscheit, C. Rohrdantz, C. Scheible, T. Schreck, S. Sellien, F. Stoffel, M. Tautzenberger, M. Zieker, and D. Keim. **Visual analytics of terrorist activities related to epidemics (VAST 2011 Grand Challenge Award)**. In Proc. IEEE Symposium on Visual Analytics Science and Technology, pages 329–330, 2011. Contest report paper.



## Message Distribution (19.05.) – Filtered for Symptom Keywords



## VAST Micro Blogging Challenge



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## Visual Search and Analysis in Research Data

- Data generation in scientific process
- Data libraries
  - Serve and preserve
  - Transparency and reproducibility
  - 4th Paradigm [Gray]
- User access
  - Mostly, meta-data based
  - Meta data expensive to curate
  - Lack of content-based search



Sloan Digital Sky Survey Repository



Oakridge DAAC data archive

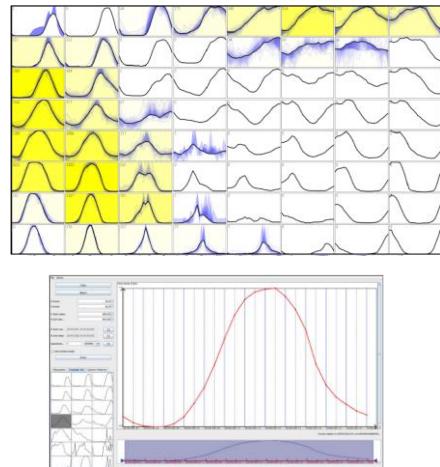


AWI PANGAEA web data repository

# Visual Search in Research Data



- **Visual Exploration and Search in Time Series**
  - Feature-based similarity function
  - Overviews using Self-Organizing Map algorithm
  - Retrieval using example data or query editor
  - Prototype operated by TIB Hannover for Pangaea data

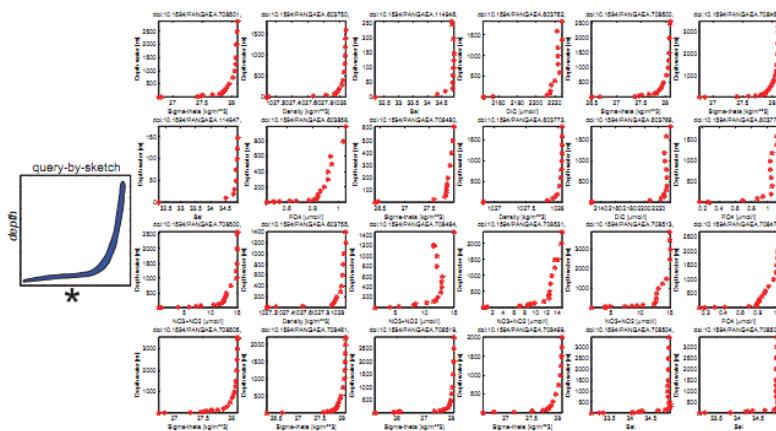


J. Bernard, D. Daberkow, D. Fellner, K. Fischer, O. Koeppler, J. Kohlhammer, M. Runneweh, T. Ruppert, T. Schreck, and I. Sens. Visinfo: a digital library system for time series research data based on exploratory search - a user-centered design approach. Springer International Journal on Digital Libraries, 2014.

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## Example Query-by-Sketch



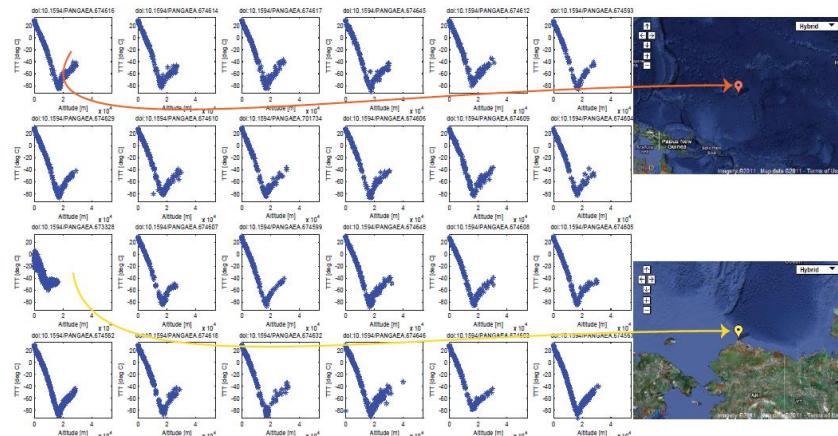
M. Scherer, J. Bernard and T. Schreck. Retrieval and exploratory search in multivariate research data repositories using regressional features. ACM/IEEE Joint Conference on Digital Libraries, 2011.

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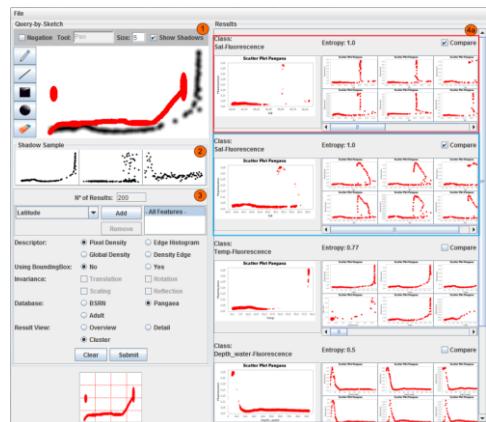
# Explorative Search Interface

## Adding geospatial reference

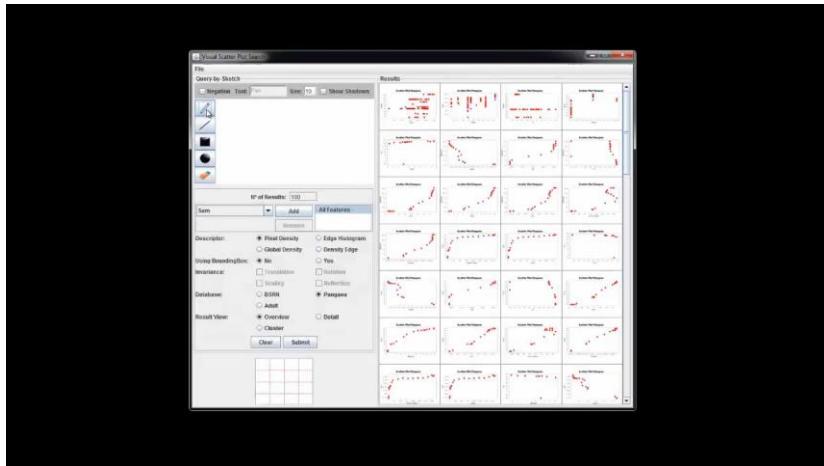


# Support for Query-as-you-Sketch

- Visual retrieval in scatter plot spaces**
  - Sketch interface to query for patterns of interest
  - Online matching searches candidates after each stroke
  - Shape suggestions on the fly



# Support for Query-as-you-Sketch



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# Conclusions

## Summary

- Large and complex data arising
  - Social media, web
  - Open data
  - Etc. etc.
- Explore, retrieve, make sense, communicate
- Visual data analysis
  - Data mining/analysis
  - Visualization
  - Interaction

## Challenges

- Widening the user base
  - Expert systems vs. visualization for the masses
- Visual literacy
- (Visual/online) journalism
- User experience and data visualization



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# Acknowledgments



+ all collaborators and students



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