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#### TEXT MINING, TERM MINING, AND VISUALIZATION

IMPROVING THE IMPACT OF SCHOLARLY PUBLISHING

#### MONDAY 16 APRIL 2012 NICE, FRANCE

#### What we will cover today

- Term and Text Mining
- The basics of visualization
- Case studies
- Using subject terms as metrics
- Applications
- Visualizing the results

#### Definitions

- Term Mining a systematic comparison processing algorithmic method to find patterns in text
- Text Mining using controlled vocabulary tags in text to find patterns and directions
- Term & text mining
  - Many similarities
  - Can be complimentary; not mutually exclusive

#### Term mining

- Precise
- Meaningful semantic relationships; contextual
- Replicable; repeatable; consistent
- Vetted; controlled
- Based on a controlled vocabulary
- Trends; gaps; relationship analysis; visualizations
- Less data processing load

#### Text mining

- Algorithmic; formulaic
- Neural nets, statistical, latent semantic, co occurrence
- Serendipitous relationships
- Sentiment; hot topics; trends
- False drops; noise;
- Misleading semantic relationships
- Heavy processing load

#### Why take a visual look?

- Humans can process information 17 times faster in visual presentations
- Now data can be analyzed, manipulated and presented as visual displays.
- To see the trends effectively we need to make the data into rich graph-able formats

#### Visualization of data

- Needs
  - Measurement
  - Metrics
  - Numbers
- Shows
  - Adjacency
  - Relationships
  - Trends
  - Co occurrence
  - Conceptual distance

- Is richer with
  - Linking
  - Semantic enrichment
  - Classification
- Supports
  - Forecasting
  - Trend analysis
  - Segmentation
  - Distribution



#### Man's attention to visual display to convey knowledge is ancient

#### The art in maps is a longstanding tradition





Credits: Raremaps

ment • Taxonomies • Access Innovations • Data Harmony

#### Super imposing data is now common A mash up example



#### **Traffic Injury Map**

UK Data Archive US National Highway Safety Administration Google Maps Base Accident categories include children automobile bicycle etc. Data

place type

Figure 1: Traffic Injury Map showing incidents in JISC TechWatch: Data Mash-ups September 2010 the Nottingham area tic Enrichment • Taxonomies • Access Innovations • Data Harmony 10

# Mash up of bird flight migrations and weather patterns

http://www.youtube.com/watch?v=uPff1t4pXil&feature=youtu.be



#### http://www.youtube.com/watch?v=nokQBjk1s 8&feature=player embedded



### How does it work?

- Develop controlled vocabulary
  - » Prefer one with hierarchy
- Apply to full text
  - » Or to the "heads"
- Decide on data points to convey information
- Divide the XML into graphable sections



#### Start with data – like this XML file

File Edit Format 1 k!doctype html><html itemscope itemtype="http://schema.org/WebPage"><head><meta http-equiv="X-UA-Compatible" content="IE=edge"><meta http-equiv="content-type" content="text/html; charset=UTF-8"><meta name="description" content="Search the world&#39;s information, including webpages, images, videos and more. Google has many special features to help you find exactly what you're looking for."><meta name="robots" content="noodp"><meta itemprop="image" content="/images/google favicon 128.png"><title>Google</title>Scoogle</title>Scoogle</title>Scoogle</title>Scoogle= {kEI:"W-9wT9vZBcTptgf62Yn6Aw",getEI:function(a){var b;while(a&&!(a.getAttribute&&(b=a.getAttribute("eid"))))a=a.parentNode;return b||google.kEI},https:function(){return window.location.protocol=="https:"},kEXPI:"17259,31700,36683,36888,36934,37102,37223,37431,37573,37646,37655,37682,37695,37696,37697,37829",kCSI: {e: "17259,31700,36683,36888,36934,37102,37223,37431,37573,37646,37655,37682,37695,37696,37697,37829",ei: "W-9wT9vZBcTptgf62Yn6Aw"},authuser:0, 2 ml:function(){},pageState:"#",kHL:"en",time:function(){return(new Date).getTime()},log:function(a,b,c,e){var d=new Image,h=google,i=h.lc,f=h.li,j="";d.onerror=(d.onload= (d.onabort=function(){delete i[f]}));i[f]=d;if(!c&&b.search("&ei=")==-1)j="&ei="+google.getEI(e);var g=c[|"/gen 204?atyp=i&ct="+a+"&cad="+b+j+"&zx="+google.time(); 3 var k=/^http:/ijif(k.test(g)&&google.https()){google.ml(new Error("GLMM"),false,{src:g});delete i[f];return}d.src=g;h.li=f+1},lc:[],li:0,j:{en:1,l:function(){google.fl=true},e:function() {google.fl=true}. 4 b:location.hash&location.hash!="#",bv:21,cf:"osb",pm:"p",pl:[],mc:0,sc:0.5,u:"c9c918f0"},Toolbelt:{},y:{},x:function(a,b){google.y[a.id]=[a,b];return false}};(function(){var a= 5 google.j;window.onpopstate=function(){a.psc=1};for(var b=0,c;c=["ad","bc","inpr","is","p","pa","ac","pc","pah","ph","sa","sifp","sip","spf","spf","spf","xx","zc","zz"][b++];)(function(e){a[e]} {google.nav.search({g:encodeURIComponent(a), 6 sourceid:"chrome-psyapi1"})}); 7 window.google.sn="webhp";window.google.timers{};window.google.startTick=function(a,b){window.google.timers[a]={t:{start:(new Date).getTime()},bfr:!(!b)}};window.google.tick=function (a,b,c){if(!window.google.timers[a])google.startTick(a);window.google.timers[a].t[b]=c](new Date).getTime()};google.startTick("load",true);try {window.google.pt=window.external&&window.external.pageT;}catch(u){} 8 </script><style>#gb{font:13px/27px Arial,sans-serif;height:102px}#gbz,#gbg{position:absolute;white-space:nowrap;top:0;height:30px;z-index:1000}#gbz{left:0;padding-left:4px}#gbg {right:0:padding-right:5px}#gbs{background:transparent:position:absolute:top:-999px;visibility:hidden:z-index:998}.gbto #gbs{background #fff}#gbx3.#gbx4{background-color:# 2d2d2d;background-image:none; background-image:none;background-position:0 -138px;background-repeat:repeat-x;border-bottom:1px solid #000;font-size:24px;height:29px; height: 30px;opacity:1;filter:alpha(opacity=100);position:absolute;top:0;width:100%;z-index:990}#gbx3{left:0}#gbx4{right:0}#gbb{position:relative}#gbbw {right:0;left:0;position:absolute;top:102px;width:100%}.gbtcb{position:absolute;visibility:hidden}#gbz .gbtcb{right:0}#gbg .gbtcb{left:0}.gbxx{display:none !important}.gbm {position:absolute;z-index:999;top:-999px;visibility:hidden;text-align:left;border:1px solid #bebebe;background:#fff;-moz-box-shadow:-1px 1px 1px 1px rgba(0,0,0,.2);-webkit-box-shadow:0 2px 4px rgba(0,0,0,.2);box-shadow:0 2px 4px rgba(0,0,0,.2)}.gbrtl .gbm{-moz-box-shadow:1px 1px rgba(0,0,0,.2)}.gbto .gbm,.gbto #gbs{top:51px;visibility:visible}#gbz .gbm,#gbz #gbs {left:0}#gbg .gbm,#gbg #gbs{right:0}.gbxms{background-color:#ccc;display:block;position:absolute;z-index:1;top:-1px;left:-2px;right:-2px;bottom:-2px;opacity:.4;-moz-borderradius: 3px; filter: progid: DXImageTransform. Microsoft. Blur(pixelradius=5); \*opacity:1; \*top:-2px; \*left:-5px; \*right: 5px; \*bottom: 4px; -ms-filter: "progid:DXImageTransform. Microsoft. Blur (pixelradius=5)";opacity:1\0/;top:-4px\0/;left:-6px\0/;right:5px\0/;bottom:4px\0/].gbma{position:relative;top:-1px;border-style:solid dashed dashed dashed;border-color:transparent;border-topcolor:#c0c0c0;display:moz-inline-box;display:inline-block;font-size:0;height:0;line-height:0;width:0;border-width:3px 3px 0;padding-top:1px;left:4px}#gbitms1,#gbi4m1,#gbi4s,#gbi4t {zoom:1}.gbtc,.gbmc,.gbmcc{display:block;list-style:none;margin:0;padding:0}.gbmc{background:#fff;padding:10px 0;position:relative;z-index:2;zoom:1}.gbt{position:relative;display:-mozinline-box;display:inline-block;line-height:27px;padding:0;vertical-align:top}.gbt{\*display:inline}.gbto{box-shadow:0 2px 4px rgba(0,0,0,.2);-moz-box-shadow:0 2px 4px rgba(0,0,0,.2);webkit-box-shadow:0 2px 4px rgba(0,0,0,2)}.gbzt,.gbgt{cursor:pointer;display:block;text-decoration:none !important}.gbts{border-left:1px solid transparent;border-right:1px solid transparent;display:block;\*display:inline-block;padding:0 5px;position:relative;z-index:1000}.gbts{\*display:inline}.gbto .gbts{background:#ff;border-color:#bebebe;color:#36c;paddingbottom:1px;padding-top:2px}.gbz01 .gbts{color:#fff;font-weight:bold}.gbtsa{padding-right:9px}#gbz .gbzt,#gbz .gbzt,#gbg .gbgt{color:#ccc!important}.gbtb2{display:block;border-top:2px solid transparent}.gbto .gbzt .gbtb2,.gbto .gbgt .gbtb2{border-top-width:0}.gbtb .gbts{background:url(//ssl.gstatic.com/gb/images/b 8d5afc09.png); background:url (//ssl.gstatic.com/gb/images/b8 3615d64d.png);background-position:-27px -22px;border:0;font-size:0;padding:29px 0 0;\*padding:27px 0 0;width:1px}.gbzt-hvr,.gbzt:focus,.gbgthvr,.gbgt:focus{background-color:transparent;background-image:none; background-image:none;background-position:0 -102px;background-repeat:repeat-x;outline:none;text-decoration:none ! important}.gbpdjs .gbto .gbm{min-width:99%}.gbz01 .gbtb2{border-top-color:transparent!important}#gbi4s,#gbi4s1{font-weight:bold}#gbg6.gbgt-hvr,#gbg6.gbgt:focus{backgroundcolor:transparent;background-image:none}.gbg4a{font-size:0;line-height:0}.gbg4a .gbts{padding:27px 5px 0;\*padding:25px 5px 0}.gbto .gbg4a .gbts{padding:29px 5px 1px;\*padding:27px 5px 1px;\*padding:27px 5px 0;\*padding:25px 0;\*pa 1px}#gbi4i,#gbi4id{left:5px;border:0;height:24px;position:absolute;top:1px;width:24px}.gbto #gbi4i,.gbto #gbi4id{top:3px}.gbi4p{display:block;width:24px}#gbi4id,#gbmpid{background:url (//ssl.gstatic.com/gb/images/b 8d5afc09.png); background:url(//ssl.gstatic.com/gb/images/b8 3615d64d.png)}#gbi4id{background-position:-29px -54px}#gbmpid{background-position:-58px 0px} #gbmpi,#gbmpid{border:none:display:inline-block;margin-top:10px;height:48px;width:48px}.gbmpiw{display:inline-block;line-height:9px;margin-left:20px}#gbmpid.#gbmpid {\*display:inline}#gbg5{font-size:0}#gbg55{padding:5px !important}.gbto #gbgs5{padding:7px 5px 6px !important}#gbi5{background:url(//ssl.gstatic.com/gb/images/b 8d5afc09.png); background:url(//ssl.gstatic.com/gb/images/b8 3615d64d.png);background-position:0 0;display:block;font-size:0;height:17px;width:16px},gbto #gbi5{background-position:-6px -22px},gbn .gbmt,.gbn .gbmt:visited,.gbnd .gbmt,.gbnd .gbmt:visited{color:#dd8e27 !important}.gbf .gbmt,.gbf .gbmt:visited{color:#900 ! .ehm]1..ehm[h..ehmt;visited.ehml1:visited.ehmlh:visited(color:#36c\_limportant:text-decoration:none\_limportant).ehmt:visited nontantl about 5:50 AN



# Index or tag using subject terms from thesaurus or taxonomy

•	date,	category,	taxonomy	term, frequency
765	SunMon2012_#18	Molecular and Cellular Bio	ology 1 Histone deacet	tylase 9
766	SunMon2012_#2	Molecular and Cellular Bio	ology 1 Mutation	9
767	SunMon2012_#24	Molecular and Cellular Bio	ology 1 Neoplasm inva	siveness 9
768	SunMon2012_#17	Molecular and Cellular Bio	ology 1 Pyruvates	9
769	SunMon2012_#27	Molecular and Cellular Bio	ology 1 Chemotherapy	10
770	SunMon2012_#4	Molecular and Cellular Bio	ology 1 Epidermal grov	vth factor re 10
771	SunMon2012_#8	Molecular and Cellular Bio	ology 1 erbB-2 recepto	rs 10
772	SunMon2012_#14	Molecular and Cellular Bio	ology 1 Neoplasm inva	siveness 10
773	SunMon2012_#1	Molecular and Cellular Bio	ology 1 Phosphorylatic	on 10
774	SunMon2012_#23	Molecular and Cellular Bio	ology 1 Non-small cell	lung carcine 11
775	SunMon2012_#11	Molecular and Cellular Bio	ology 1 Phosphorylatic	on 12
776	SunMon2012_#14	Molecular and Cellular Bio	ology 1 Epithelial mes	enchymal tr 13
777	SunMon2012_#3	Molecular and Cellular Bio	ology 1 erbB-2 recepto	rs 14
778	SunMon2012_#17	Molecular and Cellular Bio	ology 1 Renal cell carci	noma 14
779	SunMon2012_#23	Molecular and Cellular Bio	ology 1 Exons	15
780	SunMon2012_#26	Molecular and Cellular Bio	ology 1 Mice	17
781	SunMon2012_#22	Molecular and Cellular Bio	ology 1 Prolactin	17
782	SunMon2012_#9	Molecular and Cellular Bio	ology 1 Epidermal grov	vth factor re 18
783	SunMon2012_#14	Molecular and Cellular Bio	ology 1 Intercellular si	gnaling pep 18
784	SunMon2012_#23	Molecular and Cellular Bio	ology 1 Mutation	19
785	SunMon2012_#10	Molecular and Cellular Bio	ology 1 Epidermal grov	vth factor re 20
786	SunMon2012_#18	Molecular and Cellular Bio	ology 1 Mammary glan	ds 20
787	SunMon2012_#7	Molecular and Cellular Bio	ology 1 Epidermal grov	vth factor re 23
788	SunMon2012_#26	Molecular and Cellular Bio	ology 1 Colon cancer	24
789	SunMon2012_#23	Molecular and Cellular Bio	ology 1 Epidermal grov	vth factor re 25
_				





#### Load to a visualization program Like Prefuse



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# Or Pajek



#### Networks / Pajek

Package for Large Network Analysis

#### How to

In construction

 First steps to visualization of networks with Pajek (May 2002); Data to play with (ZIP) 2. Tutorial and course material at Faculty of Social Sciences, Ljubljana Printing pictures created with Pajek 4. Converting Excel datasets into Pajek format Converting text file datasets into Pajek format 6. Run Pajek from command line or other programs 7. Analysis of networks and vectors sent from Pajek to program R 8. Analysis and visualization of genealogies with Pajek; see also Toolkit and Notes 9. Kinship macros 10. Generating random genealogies 11. Some hints on working with extremely large networks in **Pajek** 12. Runing Pajek from read only location 13. Runing Pajek on Linux 14. Combining SVG with Background Picture Pajek; Vlado/Networks

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# National Information Center for Educational Media

Albuquerque's own

- » Sandia developed VxInsight
- » Access Innovations = NICEM
- Same data several views
- Primary and Secondary Education in US
- Shows the US Valley of Science
- Little Science taught in elementary years





🕴 VxInsight: 2.163		
File Options Tools Plugins Help		
Term		
Broader_Terms		
Narrower_Terms		
Related_Terms		
Rank UsedFor_Terms	History	Status
Landscape Mouse Mode Mous	Education/Wars (History) (28/28 Cities and towns/U S States (53/51/656) Cimes/U S Government agencie ***10/97 Media	Major sports/Music styles (25/24/555) Native Americans of the U/O Mechanics (Physics)/Physics (21/21/375
Database Query		Legend
Show objects where broader_terms IS_LIKE musid	Send C broader_terms IS_LIKE %music% 87	
Advanced Query Send to Excel Clear Legend	Clear Selected	
Slide 6 of 8	Default Design	
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### Using visualization to show

- From a society / publisher perspective
  - » Identify Core, Boundary and Cross Border
  - » Provides Indicators
    - Activity
    - Growth
    - Relatedness
    - Centrality
  - » Locates Journal domains
- From a thesaurus perspective
  - » Identifies terms that are too broadly defined
  - Potential Improvements in thesaurus structure using topic structures



#### Case Study: Mapping IEEE thesaurus space

- We are interested in an expanded map that includes adjacencies to the IEEE data
  - » Expanded term set shows adjacent white space; opportunities for expansion
- Overlaps and edges of the science
  - » We need comparison data
- Learn the directions in the field
  - » Low occurrence rate in IEEE documents?
  - » Linkage to terms in IEEE documents?
- Where do we find these terms? How can we add them?



### The process

- Built a rule base to auto index IEEE content
  - » "90 % accuracy out of the box on journal data"\*
  - » "80% out of the box on proceedings data"\*
- The overlapping data sets
  - » Auto indexed 1.2 million Xplore records
  - » Auto indexed 10 years of US Patent data
  - » Auto indexed 10 years of Medline
- Term sets used
  - » IEEE thesaurus terms rule base
  - » Medical Subject Headings (MeSH) (and simple rule base)
  - » Defense Technical Information Center (DTIC) Thesaurus ( and simple rule base)
  - » Similar level of detail to current IEEE thesaurus terms



#### 1. The data - Select related corpus





2. Identify related terms

Use the IEEE Thesaurus to index the three collections





2. Identify related terms Use MESH and DTIC to also index the three collections



#### 3. Resulting term set The co-indexed items from the three collections





4. Term:Term Matrix Where do the articles and their indexing intersect?





#### **Visualization Strategies**





#### All data up-posted to the top level



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#### Many map options



#### **IEEE Experience**





#### **IEEE Portfolio**



#### **Radial Visualization**





## **Publication Strategy**



JASIST reference



## **Conference Strategy**





#### **Use a Thesaurus to Label Maps**



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#### **Questions Answered**

- Is there a way, using our own information, to forecast our direction?
- Where is the industry headed? What about by technology sector?
- Does our coverage match our mission and vision?
- Can we become smarter about our data and potential markets using our collection in new ways?
  Are the societies publishing and talking about what their charter indicates they cover?
- What are the trends are topics emerging/cooling?
- Can we use technology and our own data to explore these questions while enhancing our data?



#### The research team

- Access Innovations / Data Harmony
  - » Founded in 1978
  - » Data enrichment and normalization
  - » Suite of Semantic Enrichment tools
- SciTechStrategies
  - » Understanding data through visualization
- IEEE Indexing & Abstracting Group



# We looked at visualization of data

- Finding the Metrics
  - » Measurement
  - » Numbers
  - » Terms as indicators
- Ways to show
  - » Adjacency
  - » Relationships
  - » Trends
  - » Co occurrence
  - » Conceptual distance

- How to enrich with
  - » Linking
  - » Semantic enrichment
  - » Classification
- Maps supporting
  - » Forecasting
  - » Trend analysis
  - » Segmentation
  - » Distribution



### **Effective maps require**

- Contextual data
- Detailed data
- Classification methods
- At least two directions in the matrix
- A little art for fun



# It just takes a little imagination

Thank you

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