







#### Automatic Generation Of Metadata And Preliminary Evaluation Of Its Utility In Information Seeking

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# MetaTest Overview





# **Testing of Assumptions**

- Do we need metadata?
  - -Why?
- How much metadata do we need?

-For what purposes?

- Which elements do we need?
  - -For which digital library tasks?
- How do information-seekers utilize the metadata?

-When browsing / searching / previewing?

 Can automatically generated metadata perform as well as manually assigned metadata?

#### **GOAL:** Measure Quality & Usefulness of Metadata



# **Evaluation Methodology**

- Automatically metatag a Digital Library collection that has already been manually meta-tagged
- ✓ Solicit range of appropriate Digital Library users
- ✓ Have users qualitatively evaluate metadata tags
- Conduct searching & browsing user studies with eye-tracking protocols
- Conduct information retrieval experiments
- Develop metrics of relative utility of each metadata element (manual & automatic) for searching and browsing
  - ✓ Completed
  - Underway
  - □ Future

### **Desired Achievements**

- Provide experimental results to guide Digital Library development
- Develop metrics of metadata quality & utility
- Inform HCI design
- Reduce the metadata generation bottleneck
  - Refine metadata standards to include only useful elements
  - Determine if automatic metadata generation can perform comparably to manually generated metadata

### **Target Metadata Schema**

#### Dublin Core Metadata Elements

- Contributor
- Coverage
- Creator
- Date
- Description
- Format
- Identifier
- Language
- Publisher
- Relation
- Rights
- Source
- Subject
- Title
- Туре

#### **GEM Metadata Elements**

- Audience
- Cataloging
- Duration
- Essential Resources
- Grade
- Pedagogy
- Quality
- Standards





# Qualitative Study Comparing the Quality of Manual & Automatic Metadata







- 1. Read the question in the Questionnaire
- 2. Skim the Lesson Plan in the left bottom frame
- 3. Compare the Summary on the right to the Lesson Plan on the left to answer each question
- 4. The final question for each Summary will give you space to write comments that you think are important but are not



🐔 Lesson Plan Survey - Microsoft Internet Explorer					
Eile Edit View Favorites Tools Help					
🕞 Back 🔹 💿 🕤 📓 🐔 🔎 Search 🧙 Favorites 🔇 Media 🥝 😥 🛬 📓 🕤 📴 🍰					
Address 🕘 http://katzer.syr.edu/~tina/lesson-plan-bkup/evalFrameset.php	Go Links »				
How well does the <b>GRADE</b> on the right match the grade level of the lesson plan?					
○ Very Poorly ○ Poorly ○ Well ○ Very Well ○ Unsure					
If Unsure/Poorly/Very Poorly: What is wrong with the GRADE on the right?					
How well does the <b>SUBJECT</b> on the right represent the content of the lesson plan?					
○ Very Poorly ○ Poorly ○ Well ○ Very Well ○ Unsure					
If Unsure/Poorly/Very Poorly: What is wrong with the <b>SUBJECT</b> on the right?					
How well do the <b>KEYWORDS</b> on the right represent the content of the lesson plan?					
○ Very Poorly ○ Poorly ○ Well ○ Very Well ○ Unsure					
If Unsure/Poorly/Very Poorly: What is wrong with the KEYWORDS on the right?					
How well does the <b>DURATION</b> on the right represent the content of the lesson plan?					
○ Very Poorly ○ Poorly ○ Well ○ Very Well ○ Unsure					
If Unsure/Poorly/Very Poorly: What is wrong with the <b>DURATION</b> on the right?					
Any final comments about the summary on the right?					
By submitting my responses I know that I am agreeing to participate in this research project. My participation is voluntary and any personal identifying information will be held in confidence. For questions, contact <u>Tina Finneran</u> or call 315-443-5484.					
Al Done					

#### Who Were the Respondents?

	Туре	of	Educ	ator
--	------	----	------	------

Elementary Teacher	6%
Middle School Teacher	6%
High School Teacher	66%
Higher Education Teacher	6%
Instructional Designer	3%
School Media	3%
Other	11%

Subject Taught					
Science	69%				
Math	6%				
Engineering	3%				
Combination	11%				
Other	11%				

Experience with I	esson Plans
<1 Year	6%
1-3 Years	29%
3-9 Years	29%
10+ Years	37%

### **Statistical Analysis**

- Ordinal data used to measure metadata quality
  - Unsure, Very Poorly, Poorly, Well, Very Well
- Used the Mann-Whitney Test on Independent Pairs (Non-parametric test)
  - Accepts Ordinal data
  - Does not require normal distribution, homogeneity of variance, or same sample size
  - Ranks the scores from each group and

### Medians of Metadata Element Quality

Median Score

Inter-Quartile Range

Mean Rank

	Title*	Description	Grade	Keyword*	Duration	Material	Pedagogy Method	Pedagogy Process	Pedagogy Assessment	Pedagogy Group
Manual	3	3	3	3	3	3.5	3			3
Quality	2-4	3-4	2-4	3-4	2.75-4	3-4	0.5-3			1.5-3
	132	122	73	127	29	49	30			14
Automatic	3	3	3	3	3	3	3	3	3	3
Quality	1-4	2-4	3-4	2-4	2-3.25	2-4	2-4	1-3	2-3.5	2.5-4
	105	113	80	99	25	39	33	53	9	18

\* Indicates statistically significantly difference in the medians

Of the metadata elements above which had data to compare, we conducted a Mann-Whitney U-Test to test if the quality scores for each metadata element were different between the manually and automatically generated methods. The only statistically significant findings were:

•The manually generated Title element was shown to have significantly higher scores than those that were automatically generated (U = 5238, p < .001).

•The manually generated Keyword element was shown to have significantly higher scores than those that were automatically generated (U = 4756, p < .001).

# Teachers' Judgments on Title

Some respondents appeared to be judging the actual title, not automatic extraction of the title

- "Title should indicate it is a student/ home survey based lesson"
  - Scored Poorly on Automatic
- "It is actually a good match, but it would be much better if it also had the unit title"
  - Scored Poorly on Automatic
  - Scored Well/Very Well on Manual which was enhanced Title
- "It matches, but doesn't address what the lesson is about"
  - Scored Poorly on Automatic
  - Scored Well/Very Well on Manual which was enhanced Title

#### **Comparison of Elements with Values**

Of the 35 systematically selected lesson plans and activities from the GEM Gateway the following graph shows the presence of the metadata elements for automatically and manually generated metadata.



### Quality v. Quantity

Consider quality versus amount of effort to generate manually

- Manually generated values for the Materials element were always rated well or very well, however only 2 of the 35 lesson plans had values for this element.
- Of the 20 lesson plans which had automatically generated Material elements, their scores were more dispersed.







### IR Experiment Comparing Information Retrieval with Manual Metadata Automatic Metadata Free-text of Document





### **IR Experiment Design**

# We will run three distinct trials as well as combinations of Trials I & II with Trial III.







# User Studies Pilot Study with Eye-Tracking





# What the Eyes Can Tell Us

- Indices of ocular behavior are used to infer cognitive processing, e.g.,
  - Attention
  - Decision making
  - Knowledge organization
  - Encoding and access
- For example, the longer an individual fixates on an area, the more difficult or complex that information is to process. Similarly, the first few fixations indicate areas of particular importance or informativeness.



# **User Study: Data Collection**



User wears an eye-tracking device while browsing or searching Science, Technology, Engineering or Math educational resources

The eye fixations (stops) and saccades (gaze paths) are recorded.

Fixations, typically 150-300 milliseconds, enable a person to gather information. No information can be acquired during saccades.

The colors represent different intervals of time (from green through red).



# Eye Tracking in Digital Libraries

- How users of Digital Libraries use metadata and process metadata?
  - Test on three conditions
    - Records with descriptions
    - Records with Metadata
    - Records with both descriptions and metadata



### Method

- Pre-exposure search attempt
  - 3 trials to enter search terms using free text, modifiers, boolean expressions etc.
- Exposure to test stimuli Information in 1 of 3 formats. Eye track during exposure.
  - Metadata only
  - Description only
  - Metadata and Description
- Post- exposure search attempt and follow-up interview

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**E** 

	Title	Why is the planet Mars red?				
Motodata Dicplay	Subject:	Oxidation	Creator:	Steven W. Squyres		
Metadata Display			Publisher:	Cornell University		
			Format:	text/html		
				3802 bytes		
<b>&gt;</b>			Type:	Text		
			Date:	1999-07-16		
			Language:	en		
	Identifier:	http://www.comr.cornell.edu/education/				
	Title	Gold				
	Subject	Mineralogy or petrology	Creator	Kirkemo, Harold		
		Geology		Newman, William		
			Contributor	USGS Information Services		
			Туре	Image		
				Text		
			Format:	text/html		
			Language:	en		
	Identifier	http://pubs.usgs.gov/gip/gold/index.ht				
When is the internet Managardo	Rights	Information presented on this website		· · · · · · · · · · · · · · · · · · ·		
Why is the planet Mars red?		distributed or copied. Use of appropria	e byline/photo/image credit is requested.			
Because it's rusty! Pictures from the Mars Pathfinder mission showed of Mars. Pathfinder's Sojourner rover examined these rocks, and found						
have been found here on Earth - they fell from the sky as meteorites.						
pure iron, like you`d find in an old nail or a cannonball, but iron that`s	<b></b> ;+1	The origin of Faithers at order				
why have things turned a rusty red color on Mars? After all, iron was f	Title	The Origin of Epithermal Gold	L Overstan	Olardya Dava Sand		
Moon isn`t red.	Subject	Geochemistry	Creator	Clarke, Beresford		
		Geology	Contributor	· · · · · · · · · · · · · · · · · · ·		
Gold			Format	text/html		
This United States Geological Survey (USGS) publication highlights the			Туре	InteractiveResource		
value, how it forms, and gold `terms` (such as Karat) are covered. Pro			vcDate	1998-07		
prospecting for gold are also explained.	Televetifier	letter (Annual Incolucione en el (en electro)	Language	en (		
The Origin of Epithermal Gold	Identifier	http://www.brookes.ac.uk/geology/8361/1998/berry/gold1.html Many of the photographs are copyright of the South African Chamber of Mines				
This is an illustrated account of the formation and exploitation of epith	Rights	Many of the photographs are copyrigi	nt of the South	African Chamber of Mines		
subaerial volcanic activity. Topics include: Mineralization, Age Range,						
and Genesis of Epithermal Gold Deposits. Information on exploration an	Title	Weathering and Erosion		]		
may influence the exploitation of these deposits, is offered. A glossary	Subject	Physical geography	Contributor	Field, Maurice		
external websites.		Physical geography	Publisher	University of Tennessee at Martin,		
			Fublisher	Center for Environmental and		
Weathering and Erosion				Conservation Education		
This Classroom Connectors lesson plan discusses weather conditions a erosion. Students learn to explain the process of physical and chemica			Format	text/html		
and contrast erosion resulting from wind, ice and water. The site provi-			Typo	Interactive Recourse		
required, materials, activities, and closure ideas for the lesson. The Class	ssroom Connec	tors address content with an				
activity approach while incorporating themes necessary to raise the act				• ,•		
motivation is to employ instructional strategies that bring the students			ΙΠος	crintion		
science they are studying.						
				_		
A Colden Opportunity for Science This site uses activities about gold to teach science, centering on the following information: how the pursuit of activity approach while incorporating themes necessary to raise the activity to a higher cognition level. The major motivation is to employ instructional strategies that bring the students physically and mentally into touch with the science they are studying. A Golden Opportunity for Science This site uses activities about gold to teach science, centering on the following information: how the pursuit of and science decision, methods about gold to teach science, centering on the following information: how the pursuit of and science decision, methods about gold to teach science.						
This site uses activities about gold to teach science, centering on the t			ופושן	piay		
gold shaped society; metaphors, myths, lores and legends about gold; types of origins of gold (lode deposits and placer deposits); mining and						
heap leaching. There is also a debate between different interest groups						
students to consider, mention of a few historic mining sites and ghost t						

students to that have produced gold, and a poster to illustrate the gold mining process, such as exploration, extraction,

#### Scanpath of Metadata Only Condition



#### Scanpath of Description Only Condition



#### Scanpath of Metadata & Description Condition



# Graphically Understanding the Data



Above image: The contour map shows the aggregate of eye fixations (stops). Peak fixation areas are on the Description element, with some interest in the identifier (URL )and subject elements. Note the dominance of the left side. Below image: The LookZone shows the amount of time spent in each zone (paragraphs in this case). The user spent 27 seconds or 54% of her time looking at the description metadata element. Very little time was spent with the other elements.



### Preliminary Findings: Eye Tracking

- Descriptions are viewed in a linear order, but metadata is not
- Titles and sources are the mostly viewed metadata
- The first few sentences in the description are read more carefully; the rest of them are skimmed
- Before selection, a re-visit of the records for confirmation
- Subjects focus on descriptions when both descriptions and metadata are on the same page.

# **Preliminary Findings: Interview Data**

- 100% indicated they would continue to search for more information beyond the document they retrieved.
- 65% changed their initial search terms after exposure to test stimuli; proportionately more so in the combined condition.
- 20% indicated that they would use their chosen document for the intended purpose; all of these were women.
- 60% said they learned something from the retrieved document that helped them restructure their next search. Proportionately more of these were woman than men.
- 100% indicated that they use Google when searching for lecture/lesson information.
- Less than half of the participants knew what metadata was.

### Preliminary Findings: Search Attempts

- On post-exposure search attempts the mean number of search terms increased by 25% for those in the combined condition. The number of search terms decreased for both of the other conditions.
- Men used more search terms on their first 3 query attempts, while women used more on their 2<sup>nd</sup> (postexposure) query attempts. Men were also more likely to use modifiers and full text queries. Women tended to use more Boolean expressions.

# Next Steps for User Study

- Finer grain analysis of eye tracking metrics
  - What metadata elements do searchers fixate?
  - What kinds of words are attended to in descriptive information?
  - What do the scan paths of efficient searchers look like?
  - How does ocular behavior map onto actual search behavior and decision making?

