LavaCon 2023

The Content Strategy Conference lavacon.org

Leveraging Semantics to Provide Targeted Training Content: A Case Study

Heather Hedden, Knowledge Manager, Semantic Web Company Esther Yoon, Senior Data Architect, Google







Heather Hedden, Semantic Web Company (vendor of PoolParty): Part 1: Introduction to Taxonomies and Semantics for Targeted Training Content

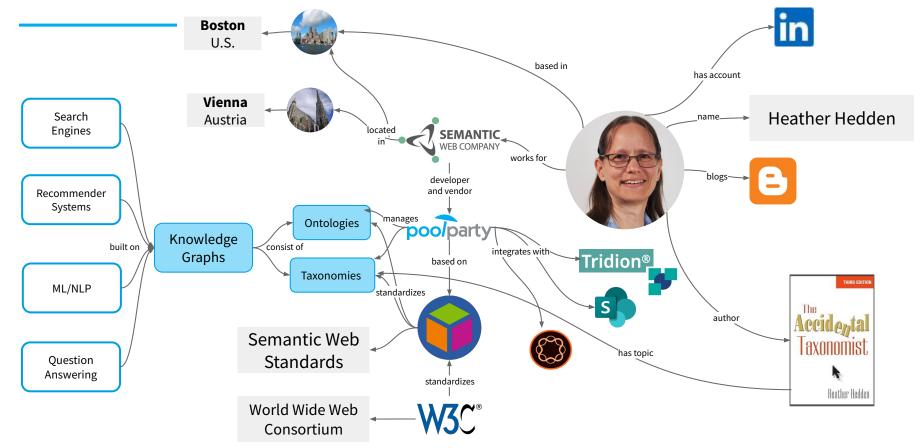


Esther Yoon, Google:

Part 2: Case Study: Leveraging Semantics to Improve Discovery of Training Content

Click the Graph—get in contact with us!





Semantic Web Company (SWC) and PoolParty



SWC is developer/vendor of **PoolParty Semantic Suite** Most complete **Semantic** AI platform on the market

W3C standards compliant



ISO 27001:2013 certified (since 2019)

PoolParty stands out in the



market with a **user**friendly interface.



Over **180** customers

Integrations:



Microsoft 365, Tridion Docs & Sites, AEM, and many more



Gartner named SWC a Visionary in their Magic Quadrant for Metadata Management Systems 2019 and 2020



Semantic Web Company has been recognized by **KMWorld** as one of the AI Top 100 companies 2023



Forrester listed SWC as sample vendor in their **report** on *The* Document-Oriented Text Analytics Platforms Landscape 2022

Part 1 Outline



Introduction to Taxonomies and Semantics for Targeted Training Content

- Search issues in finding training content
- Faceted taxonomies for training content
- Customizing facets
- Semantic relations and recommendation
- Metadata and tagging

Training Content Scenario

Organizations with large number of employees have large volumes of varied training content:

- For onboarding
- For upskilling
- For compliance
- For achieving efficiency
- For better customer relations
- For personal improvement

Managers and employees can only take advantage of the training if they know it's there and how to find it.

Is search effective?





Issues in Searching for Training Content

- Too many results on some searches:
 such as "communication"
- Training course titles may be vague:
 - *"Bringing out Your Voice"* Does that mean in speaking or writing?
 - "The Painstorm Model"

The instructor's invention of brainstorming "pains" in order to resolve them.

- Training course titles might omit the key word:
 - "Use Plain Language" omits the word "writing"

Solution: Have a **taxonomy** of topics to tag the training content by topic.

- It brings together synonyms/alternative labels for the same concept.
- It arranges concepts in a hierarchy, so narrower concepts can be identified.
 - ▷ E.g., specific types of communication are narrower concepts to Communication.







T PROJECT CORPORA TOOLS ADVANCED	en 🔹 Search Thesaurus Concepts 🛛 🔍	II ? 🔒
 Skills (4) Business skills (9) Administrative skills (0) Business development (16) 	Communication skills https://elysium.poolparty.biz/TrainingContent/1014 Image: Content/1014 Image: Content/1014	+ Create Narrower Concept The Delete Concept State Add to ExactMatch
Customer success (2) Finance (1)	Classes: 🔘 Skill	
HR Skills (8) Industry knowledge (6) Management (9)	Details Notes Documents Linked Data Tr	riples Visualization Quality Management History
Marketing skills (22)	SKOS Training Scheme +	
Sales skills (2) Languages (11)	Broader Concepts Soft skills	Preferred Label O Communication skills
Communication skills (25) Observation skills (4) Accuracy (0) Concept thinking (0) Critical thinking (0)	Narrower Concepts Confidentiality Consulting Content creation	Alternative Labels Ommunication ability en Professional communication +
Strategic thinking (0) Organizational skills (7) Social skills (5)	Content research Conveying feedback Cross-team communication Customer contacts	Hidden Labels (+)
Automation (1) Development (6)	Customer meetings Customer query analysis Documentation	Scope Notes (+)
Semantic Web skills (16) Solution design (6)	Facilitating workshops and meetings Facilitation Influencing skills	Definitions (+)
System operation (7) Tools (13)	Interviewing Language analysis of competitors	

Issues in Searching for Training Content



For the complexities of training content, a single topical taxonomy is not enough.

 Search on topics does not indicate skill level (beginner, continuing, advanced) or job level (everyone, managers, directors)

e.g. "Manager training" - For new managers or all managers?

Ambiguity between topic and format:

e.g. "Presentation slides" - How to create them or the training delivery format?

- Ambiguity between products and productivity tools
 - e.g. "Apps" or "Applications" Application products our company sells, or applications we use to help us do our jobs?

Solution: Design a **faceted taxonomy** for faceted navigation browse or filtering search results.

Faceted Taxonomy for Training Content

- Facets are aspects/dimensions/filters/metadata fields.
- Users select a concept from each of several facets to search with in combination to limit the content results by different aspects.
- For example, search on training content for:
 - Content type: Video training
 - Level: Intermediate
 - Role: Customer support
 - Skill: Written communication
 - Training program: Upskilling
- Training content is very well suited for facets.



Faceted Taxonomy for Training Content



Publicly available online course coursera Explore ~ ⊘ed2go services also use faceted Goals taxonomies to help people find Filter By: COURSE TYPES the right course. Take a free course Fundamentals Earn a Degree Advanced Career Training $ed\mathbf{x}$ = Earn a Certificate COURSE TOPICS Find your new career Arts and Design (42) Follow what fuels you - save on select programs with code ED Business (196) Subjects Computer Applications (74) Search our catalog Computer Science (64) Data Science Construction and Trades (48) What do you want to learn? Search **Business Computer Science** Information Technology Find skills to learn for your dream job Start quiz

Program -

Level -

Language -

. Filter	Sort by Most Popular	
Ratings		~
Video Dura	ition	~
Торіс		~
Subcatego	ory	~
Level		~
Language		~
Price		~
Features		~
Subtitles		~

Courses ~

Availability -

Learning type -

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Skill -

Partner -

Subject -

Challenges in Designing Facets

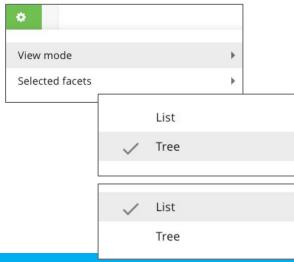


- Facets, to serve as limiting filters, should be mutually exclusive in the concepts they contain.
 - e.g., don't have "Customer support" in both Roles and Skills.
 - **Roles** and **Skills** in particular may be a challenge to distinguish.
- A facet may contain a hierarchy of concepts, but you cannot have a hierarchy of facets.
- All the facets existing for metadata management may be too many for end-users.
 - Select a subset of all concept schemes/metadata properties to be implemented as end-user display facets.
 - Might not implement all of : Organizational units, Product/Service areas, Original sources, Tools, Regions, Access Levels
 - Some filters can be preset by user role/credentials for personalization

Customizing Facets

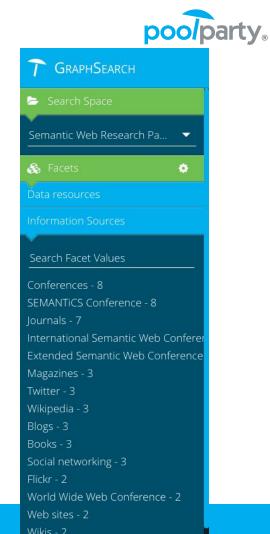
Option of displaying concepts in facets, either:

- in their hierarchy (tree view)
- or as a list, ordered by tagged content item count.



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🗁 Search Space
Semantic Web Research Pap 👻
🗞 Facets 🔹
Data resources (2)
Information Sources (3)
 Print media - 8 Face to face media - 8 Conferences - 8 Web media - 6 Blogs - 5 Social networking - 5 Wikis - 3 Web sites - 2
Organisations (4)
Persons (2)
Places (4)
Products (3)

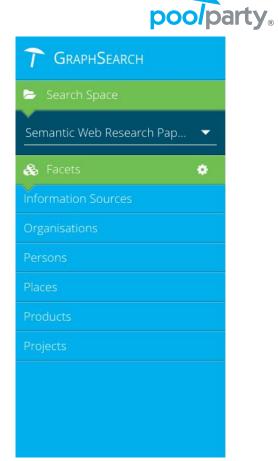


Customizing Facets

Option of selecting different facets for different user audiences.

•		
View mode		×
Selected facets		Data resources
		Information Sources
	~	Organisations
	<u>~</u>	Persons
	~	Places
		Principles
		Products
		Projects
		Specifications
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🗁 Search Space
Semantic Web Research Pap 🔻
🗞 Facets 🔅
Data resources
Information Sources
Organisations
Persons
Places
Principles
Products
Projects
Specifications



Public demo: https://vocabulary.semantic-web.at/GraphSearch

Issues in Finding Training Content not Searched



- Not realizing that a very specific topic exists, so not bothering to look for it.
 - e.g. policy for ads for a specific market
- Specific soft skills and well-being training topics are useful, but not what people usually search for:
 - e.g. "The art of saying no," "Avoiding burnout," Energizing your team"
- New topics, people may not think to look for:
 - e.g. "Norms for hybrid work"
- Wanting to excel in one's role and identify all the training content relevant to one's specific role.

Solution: Recommendation of content based custom semantic relations between different sets (classes) fo concepts, especially between roles and skills or topics.

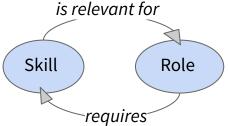


Recommendation Based on Semantic Relations



Semantic Relations

- Relations across classes, concept schemes, or what could be facets
 - E.g. between Skills and Roles
- Relations are customized with meaning (semantics) for a specific use case
 - Not just broader/narrower and related, but "Is required for"
- Based on a knowledge model known as an ontology
 - Ontologies define classes, semantic relations between classes, and custom attributes for classes (although attributes are not needed in a simple knowledge model.



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Live training event (0) Slide deck (0) Video training (0) Levels (3) Advanced (0) Beginner (0) Intermediate (0) Roles (7) Account management (2) Customer support (1) Engineering (5) Information technology (4) Marketing (4) Procurement (3) Sales (3) Skills (4)

Business skills (9)

- Languages (11)
- Soft skills (4)
- Technical skills (7)
- Topics (5)
 - Business and technology issues (11)
 - Data (10)
 - Product knowledge (3)
 - Regulations (2)
- Standards (11)
- Training Programs (6)

Customer support		+ Create Narrower Con	cept 🕆 Delete Concept
tps://elysium.poolparty.biz/TrainingContent/1146 🗍 🗹 🛛 + Add to Blac	klist + A	dd to ExactMatch	
Details Notes Documents Linked Data	Triples	Visualization Quality Management His	story
SKOS Training Scheme +			
Broader Concepts		Preferred Label	
Ø		O Customer support	en
Narrower Concepts		Alternative Labels	
Technical support		\oplus	
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Top Concept of Concept Schemes		Scope Notes (+)	
Roles		0	
\mathscr{O}		Definitions	
		\oplus	

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Search Thesaurus Concepts

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Image: Content Types (3)

Live training event (0)

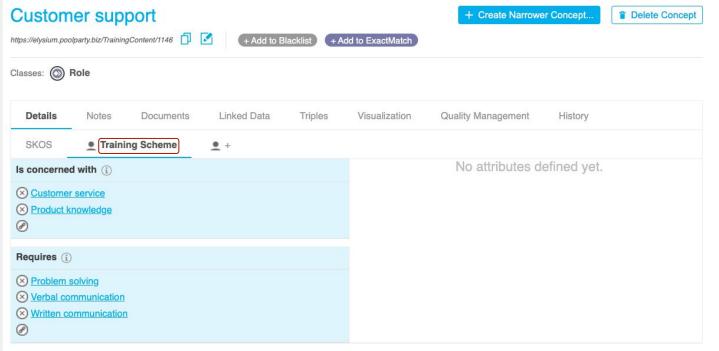
Customer support

Image: Concept (0)

I

Slide deck (0) Video training (0) Levels (3) Advanced (0) Beginner (0) Intermediate (0) Roles (7) Account management (2) Customer support (1) Engineering (5) (Information technology (4) Marketing (4) Procurement (3) Sales (3) Skills (4) Business skills (9) Languages (11)

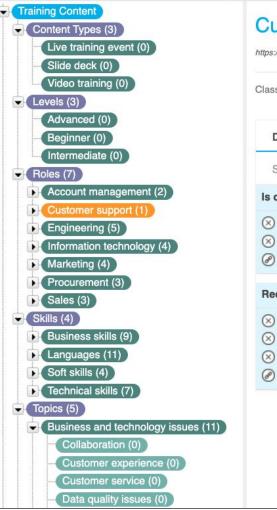
- Soft skills (4)
- F Technical skills
- Topics (5)
 - Business and technology issues (11)
 - Data (10)
 - Product knowledge (3)
 - Regulations (2)
 - Standards (11)
- Training Programs (6)



(?)

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2





Customer service https://elysium.poolparty.biz/TrainingContent/787 Classes: Topic Details Notes Details Notes SKOS Training Scheme Is relevant for (1) Scustomer support

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Metadata and Tagging

Terms displaying in facets (for filtering in the user interface) may be based on either:

- 1. Pre-assigned metadata on structured content, or
- 2. Concepts tagged to the content, coming from the taxonomy
- 1. Course content, as structured content, already has some metadata
 - Examples: Content Type, Level, Training Program, Organizational Unit
 - Assigned by content creators
 - This can be mapped to taxonomy facets
- 2. Descriptive topics of course content needs to be tagged with Topics, Skills, etc.
 - Manually tagged, or
 - Auto-tagged (preferred method)

Solution: Set up a **pipeline** to **extract** (ETL) metadata for the values of some taxonomy facets and to auto-tag topics for the terms in other taxonomy facets.





Semantic Web Company's POC for Google gTech



SWC:

- Consulted on faceted taxonomy and simple ontology for learning content.
- Provided PoolParty server infrastructure.
- Set up UnifiedViews ETL pipeline for extraction and automated tagging of content.
- Set up GraphSearch faceted search user interface (with API) to support search and recommendation of content.



Proprietary + Confidential



Case Study: Leveraging Semantics to Improve Discovery of Training Content

Proprietary + Confidential

Background

about: gTech

Goal: Provide customer support throughout the entire customer lifecycle via troubleshooting, consulting, optimizing, & implementing solutions

Roles: Customer Support Agents, Consultants, Product Ops Managers, Data Analysts/Scientists etc.

01

Problem Statement

Google

50% of gTechers saw learning paths as a critical gap and 22% reported having content discovery issues



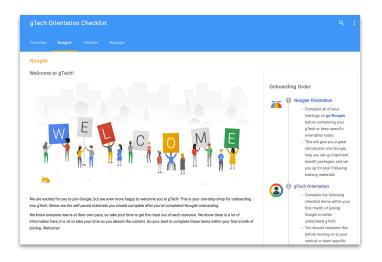
02

User Journey Walk-Through

Let's take a look at an example...

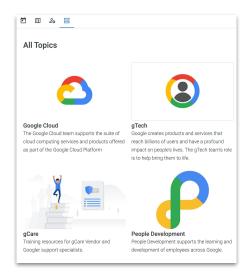


User: Bob is new to gTech and wants to find introductory trainings for the ramp-up.



Desired Outcome: "<u>gTech Orientation Checklist</u>" which has a page specifically for gTech Nooglers.

Bob's Search Experience on Platform A





Does not find the desired content under the "gTech" Topic in the "Browse" tab.

gtech 101	
Content Events	
388 Results	
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	end Foundations > Summary of gPS Foundation Modules , pres consultants a view of what will be tauget in the upcoming modules. Module 1: Learn abo 2 days Area. Coogle Topics covered - Important go Son beginner
	Search & Gen VMO Orboarding Academy > Gloch Structure — Tom
	Trust and Impact = g^{-} (Thirdy Advanced). Indexed by a provided set of the previous page is sending you to https://googleacademy.exward to visit that page, you can return to the

Tries the following searches but still cannot find the desired content:

- "gTech 101"
- "gTech Noogler"
- "gTech Noogler Training"
- "gTech New Hire"
- "gTech Onboarding"



Runs into dead-ends or irrelevant content due to misleading title.

Bob's Search Experience on Platform B

Learning	SEARCH	FAVORITES	SESSION ALERTS	MY ACTIVITY				
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Profile							Format	^
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				A Weekly Training - AdSense which will give you the foundation			Provider Date Range	^

Tries the same set of searches:

- ***** "gTech 101"
- 🗙 "gTech Noogler"
- *gTech Noogler Training
- * "gTech New Hire"

"gTech Onboarding"

Desired content was found after the 5th keyword search.

03

Gap Analysis

Google

Key Gaps with the Existing Ecosystem



User cannot search across platforms

Hinders discovery of content and may result in users giving up



User must use exact keywords found in the metadata

Searching using similar words instead of exact words will result in lack of discovery of such content



Contents with limited description gets buried

Too generic description will lead to low discovery of such content



Role Profiles Integration Does Not Exist

User cannot filter for training content relevant to their role

04

Vision & Goals



based on role &

Empower employees to upskill by providing them with a personalized and easy-to-use training platform.

Empower content creators to reach their target audience by automating metadata management and boosting content discoverability.

> via relevant metadata tagging

Goals | Employee Upskilling



One-Stop-Shop Search & Discovery Platform

Augment content discovery by providing a centralized platform that populates learning resources across platforms



Discovery of similar and related content

Enable discovery of similar and related content by semantically mapping the contents and exposing them as relevant search results



Personalization on Role & Interests

Enable relevant recommendations based on the user's role and their required skills

Goals | Streamline Content Tagging



Automated or assisted content tagging

Streamline the content creator's content management experience with automated or assisted content tagging



Tagging with custom vocabularies

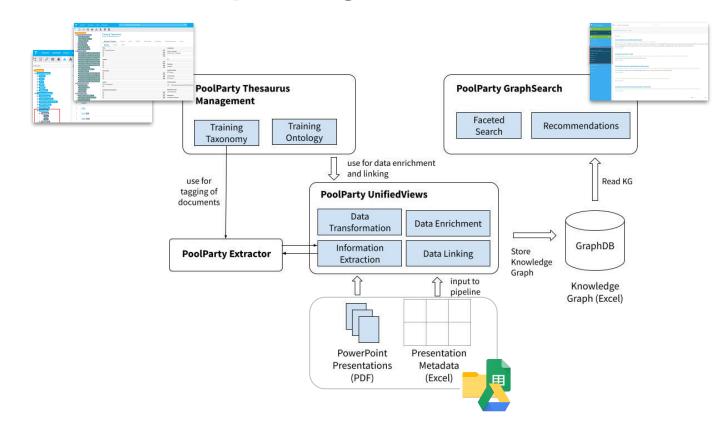
Empower content creators to organize and tag the trainings using custom vocabularies based on business need

05

Proof-of-Concept



Proof-of-Concept Design



Preview: Cross-platform Searchability



Search across Platforms

Augment content discovery by searching across multiple platforms

GraphSearch	■ Search in All Facets	EN 👻						
Search Space	Selected facet values: <i>empty</i>							
tech-demo 👻								
Facets 🔅	55 results							
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		Page: 1 X						

Preview: Enhanced Taxonomy with Synonyms



Taxonomy Enriched with Synonyms

Surface the most relevant content with taxonomy enriched with synonyms



Preview: Automated Content Tagging



Automated Content Tagging

Boost search results with automated content tagging

GRAPHSEARCH	•≡	Search in All Facets	EN 👻						
Search Space	Selected facet values: empty								
ch-demo 👻									
Facets 🗢	55 results								
ty types		Co-employment and Misclassification https:/googleacademy.exceedims.com/student/collection/71213/path/99830 This course is for Googlers looking to improve their operations. It will highlight the legal and reputational risks associated with our temps, vendors, and indeper properly set up engagements to avoid undue risk. In particular, it will look at properly classifying each work type and the definition							
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				Page: 1 X Results per page: 10					

Preview: Role Profiles Integration



Role Profiles Integration

Find relevant trainings to your role with taxonomy integrated with role profiles

7 GraphSearch	€	Search in All Facet	S		en 👻					
Search Space	Sele	ected facet values:	Technical Solutions: Web S	Solutions Eng	gineer (Ro	ole) X Clear all X	•			
gtech-demo 👻										
🗞 Facets 🔷	1	13 results								
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06

Evaluation

Proof-of-Concept Final Evaluation: Criteria

Discoverability evaluation rubric was created with questions focused on 3 key criteria that impact the user's ability to:

- 1. Perform the search dynamically using various keywords and filters
- 2. Identify the **relevant content quickly** while having the option to browse through a **sufficient pool** of contents
- 3. **Complete the search** without needing to explore other platforms

Proof-of-Concept Final Evaluation: Results

Evaluation Category	Evaluation Criteria	Platform A	Platform B	MVP Module	
Cross-Platform Searchability	Does the search platform support cross-platform searchability?	0	0.5*	1	
Dynamic Search Experience	· · · · · ·		1	1	
	Does the search platform support faceted search (i.e. filters)?	0	1	0.5**	
	Does the search engine support semantic search (i.e. similar word search)?	0	0	1	
Relevant Content Identification	Does the search engine support crawling of the content in addition to the content metadata (i.e. title, description, tags)?	0	0	1	
	Does the search platform provide a recommendation engine to find related or recommended content?	0	1	1	
Total Discoverab	1 /6	3.5 /6	5.5 /6		

*Grow search populates content from external platforms (i.e. LinkedIn) but does not pull all contents available in LMS

** PoolParty's GraphSearchUl used for the demo only supports single faceted search but multi-faceted search in the search bar can be enabled for the final frontend Ul.

Metrics: gTech Noogler's Search Experience

A **reduction of 87.5% in total time spent on search** was noted when conducting the search using the PoolParty module.

Evaluation Metrics	Current Search Experience (Platforms A&B)	Test Search Experience (MVP Module)	% Change
Number of steps taken until the desired content was found	12	1	-91.7%
Number of platforms utilized until the desired content was found	2	1 -	
Total time spent on search (min)	8	1	-87.5%

07

Next Steps

Google

Proprietary + Confidentia

What's Next?



Prod Integration

We will explore ways to integrate PoolParty with the training content management systems



Front-End UI Development

We will design a user-friendly front-end UI for the search experience



Data Governance

We will explore best practices for taxonomy / ontology / knowledge graph data governance



Q&A



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