

Interlinking Cross Language Metadata Using Heterogeneous Graphs and Wikipedia


**XIAOZHONG LIU
MIAO CHEN
JIAN QIN**

**Indiana University Bloomington
Indiana University Bloomington
Syracuse University**

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Recent research has revealed that most articles published in top US accounting journals come from **institutions based in the US or a small number of other English-speaking countries** (Jones and Roberts, 2005)... most recognized academic journals are located in the US or other English-speaking countries, with the consequence that they **only accept papers in English**. Even for journals with a more international basis, **English is the only permitted language**... (Raffournier & Schatt, 2010).

institutions... (Raffournier & Schatt, 2010)



English
Papers

Japanese

French

Chinese

German

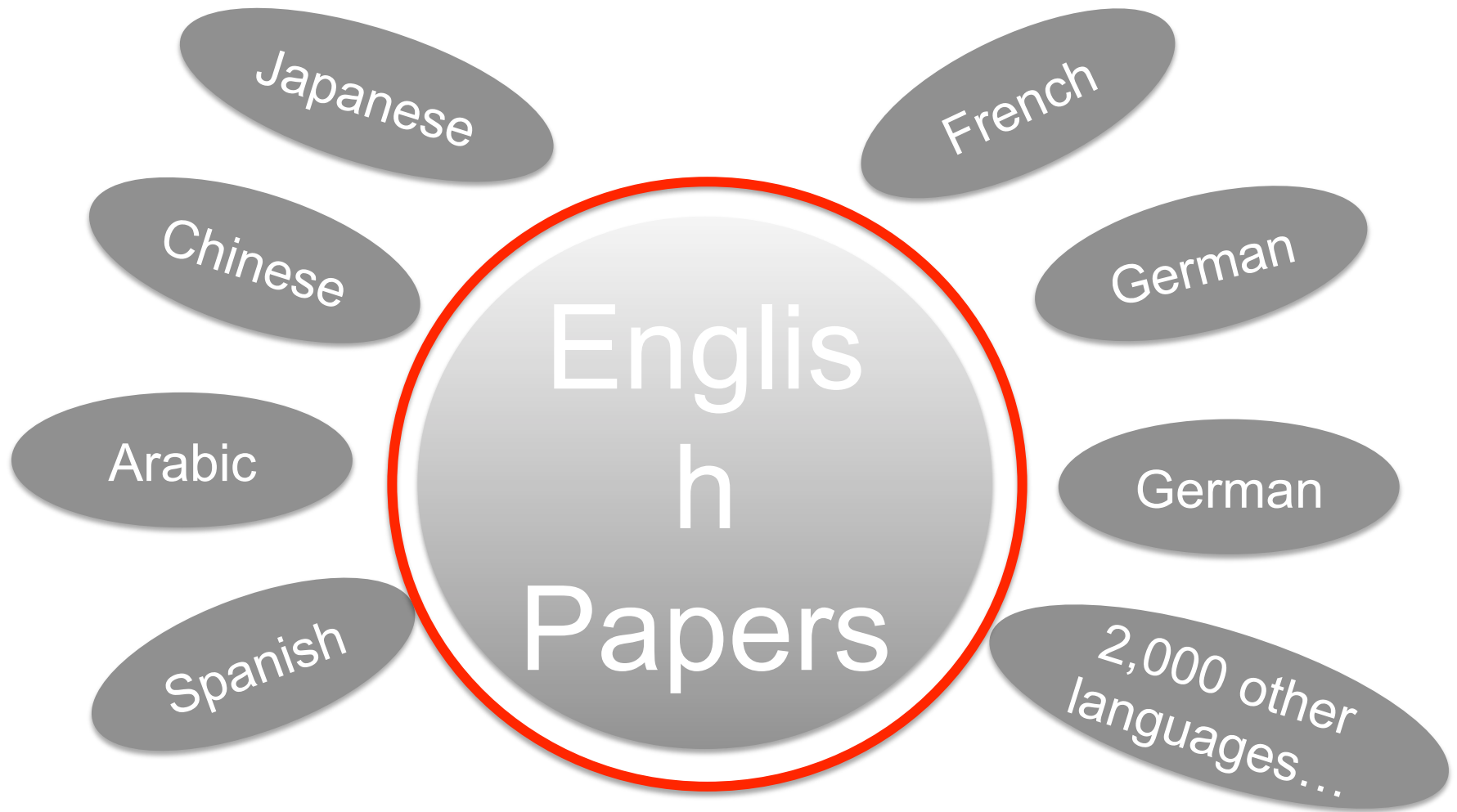
Arabic

English
Papers

German

Spanish

2,000 other
languages...



**How to break this language barrier?
Users from different countries can easily
access those English papers...**

Recent research has revealed that most articles published in top US accounting journals come from **institutions based in the US or a small number of other English-speaking countries** (Jones and Roberts, 2005)... most recognized academic journals are located in the US or other English-speaking countries, with the consequence that they **only accept papers in English**. Even for journals with a more international basis, **English is the only permitted language**... (Raffournier & Schatt, 2010).

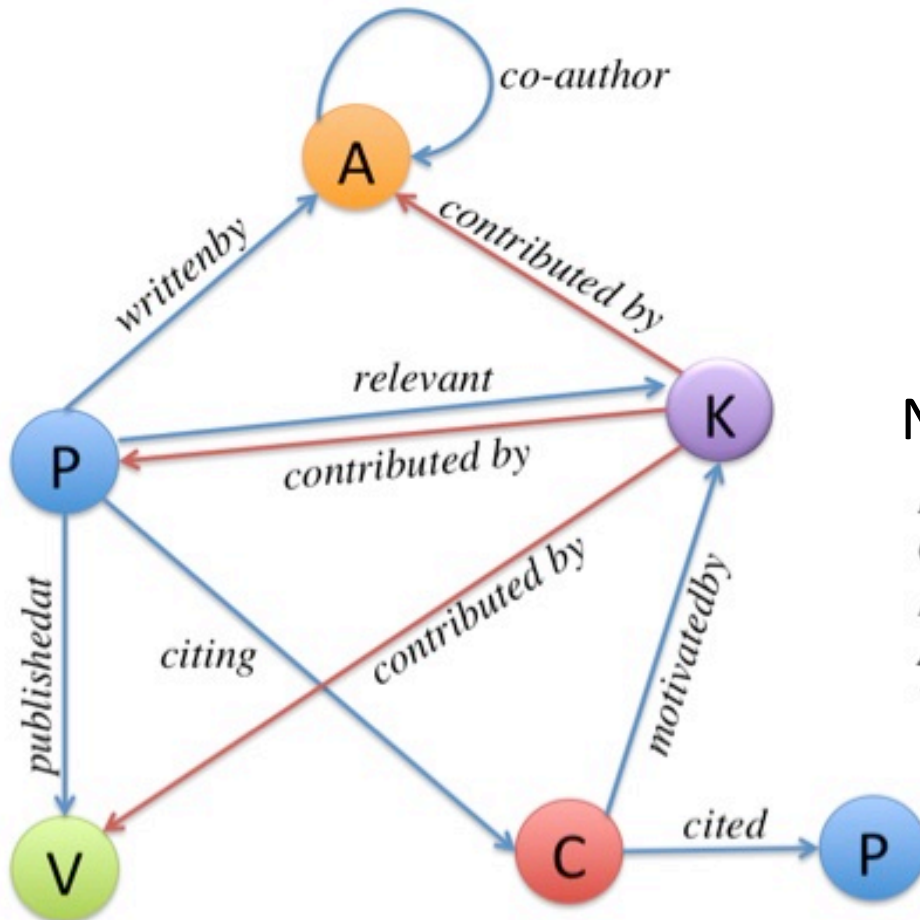
institutions based in the US or a small number of other English-speaking countries

English is the only permitted language

Limitations

- Lack of *citation relationships*, e.g., paper A (in Language A) cites English papers
- Difficulty in *personalizing* user profiles, i.e., how to construct a user profile (in Language A)

All the papers written in a specific language contain nodes and edges



Node type

P: Paper
C: Citation
K: Keyword (topic)
A: Author
V: Venue

Edges:

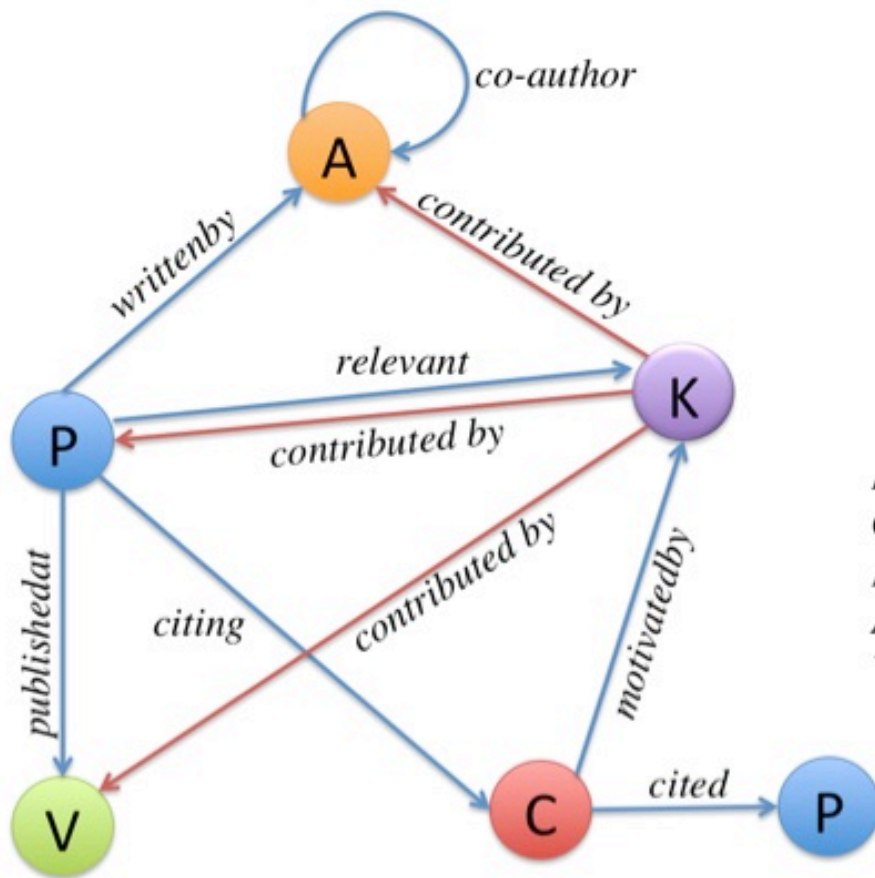
- written by
- contributed by
- published by
- relevant
- motivated by
- citing

Edges have types

1. $P \rightarrow A$: a paper is written by an author;
2. $P \rightarrow V$: a paper is published in a venue;
3. $P \rightarrow K$: a paper or publication is relevant to a keyword;
4. $P \rightarrow P$: a publication cites or links to publications;
5. $K \rightarrow P$: a keyword (topic) is assigned to publications;
6. $K \rightarrow A$: a keyword (topic) is assigned by authors; and
7. $K \rightarrow V$: a keyword (topic) is assigned to venues

Random Walks based on meta-paths

Scenario 1: Recommend Paper (P) to Author (A) based on possible paths



I: $A^* \rightarrow A \rightarrow P?$

II: $A^* \rightarrow P \rightarrow C \rightarrow P?$

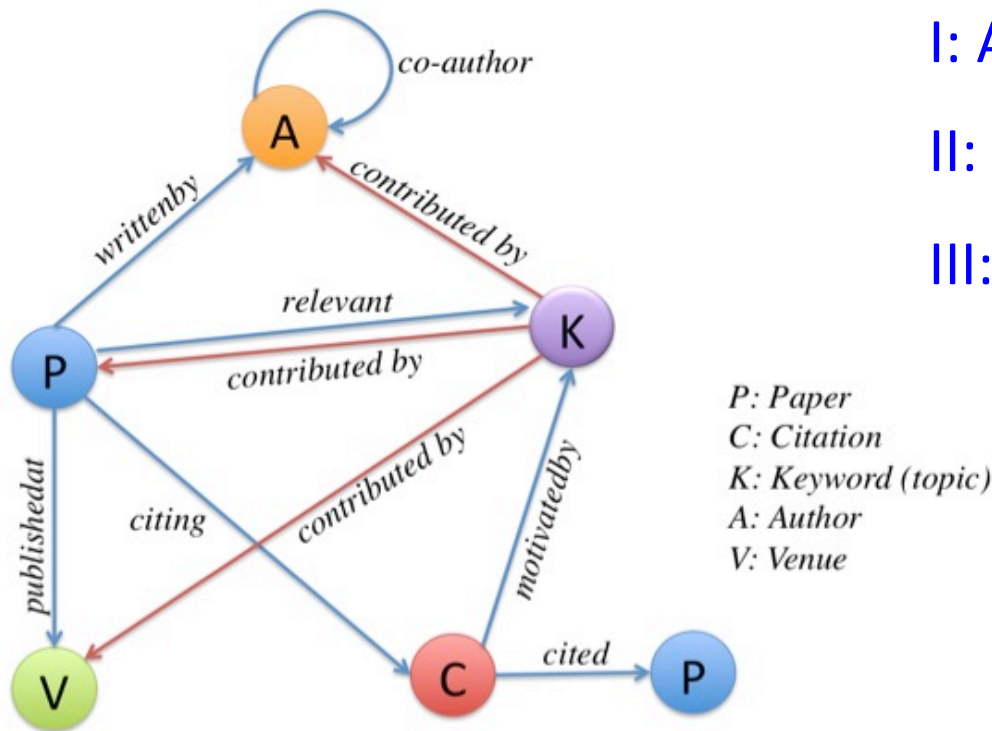
III: $A^* \rightarrow A \rightarrow P \rightarrow C \rightarrow P?$

IV: $A^* \rightarrow P \rightarrow C \rightarrow P \rightarrow V \rightarrow P?$

P: Paper
C: Citation
K: Keyword (topic)
A: Author
V: Venue

Random Walks based on meta-paths

Scenario 2: Suggest Keyword (K) to Author (A) based on possible paths



I: $A^* \rightarrow A \rightarrow K?$

II: $A^* \rightarrow P \rightarrow C \rightarrow P \rightarrow K?$

III: $A^* \rightarrow V \rightarrow P \rightarrow C \rightarrow P \rightarrow K?$

Different meta-paths are integrated into a unique recommendation model.

Proven in citation recommendation for one DL in a single language

Can meta-paths be used to bridge metadata in different languages?

Research questions

Given that two digital libraries, DL1 (in language 1) and DL2 (in language 2), have no direct connections by way of citations or authors:

- **RQ1: How can metadata for publications in DL1 and DL2 be bridged through language equivalents such as topics (keywords), authors, and venues?**
- **RQ2: How can recommendations be made for resources from DL1 to DL2?**

Wikipedia provides a source to link concepts across different languages.

All the Wikipedia concepts are interconnected via hyperlinks and categories.

The screenshot shows the Wikipedia article for "Semantic Web". At the top left is the Wikipedia logo and navigation links (Article, Talk, Read, Edit, View history, Search). The article title "Semantic Web" is at the top. Below it is the introductory text: "From Wikipedia, the free encyclopedia". The main text discusses the Semantic Web as a collaborative movement led by the World Wide Web Consortium (W3C). It mentions that the standard promotes common data formats and aims to convert the current web into a "web of data". It also notes that the Semantic Web stack builds on the W3C's Resource Description Framework (RDF). A red arrow points from the text "The Semantic Web is a collaborative movement led by international standards body the World Wide Web Consortium (W3C)." to the "Wikipedia Concept" label on the right. Another red arrow points from the text "The original 2001 Scientific American article by Berners-Lee, Hendler, and Lassila described an expected evolution of the existing Web to a Semantic Web, but this has yet to happen." to the "Same concept in different languages" label. A third red arrow points from the "Contents" table of contents to the "Same concept in different languages" label. On the left side, there is a sidebar with a "Languages" section, which is expanded to show a list of languages including العربية, বাংলা, Български, Català, Čeština, Dansk, Deutsch, Ελληνικά, Español, Esperanto, Euskara, فارسی, Français, Galego, 한국어, Bahasa Indonesia, Íslenska, Italiano, עברית, Latviešu, Lietuvių, Magyar, Македонски, Nederlands, 日本語, Norsk bokmål, Polski, Português, Русский, Simple English, Српски / srpski, Suomi, Svenska, ភាសាខ្មែរ, Türkçe, Українська, اردو, and Tiếng Việt. At the bottom of the sidebar is an "Edit links" button.

Article Talk Read Edit View history Search

Semantic Web

From Wikipedia, the free encyclopedia

The **Semantic Web** is a collaborative movement led by international standards body the **World Wide Web Consortium** (W3C).^[1] The standard promotes common data formats on the **World Wide Web**. By encouraging the inclusion of **semantic content** in **web pages**, the Semantic Web aims at converting the current web, dominated by unstructured and semi-structured documents into a "web of data". The Semantic Web stack builds on the W3C's **Resource Description Framework** (RDF).^[2]

According to the W3C, "The Semantic Web provides a common framework that allows data to be shared and reused across application, enterprise, and community boundaries."^[2] The term was coined by **Tim Berners-Lee** for a web of data that can be processed by machines.^[3]

While its critics have questioned its feasibility, proponents argue that applications in industry, biology and human sciences research have already proven the validity of the original concept. Scholars have explored the social potential of the semantic web in the business and health sectors, and for social networking.^[4]

The original 2001 *Scientific American* article by Berners-Lee, **Hendler**, and **Lassila** described an expected evolution of the existing Web to a Semantic Web,^[5] but this has yet to happen. In 2006, Berners-Lee and colleagues stated that: "This simple idea ... remains largely unrealized."^[6]

Contents

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- History
- Purpose
 - Semantic Web solutions
 - Web 3.0
- Challenges
- Standards
 - Components
 - Current state of standardization
- Skeptical reactions
 - Practical feasibility
 - Censorship and privacy
 - Doubling output formats
- Projects
 - DBpedia
 - FOAF
 - SIOC
 - GoPubMed
 - eagle-i.net
 - NextBio
- See also
- References
- Further reading
- External links

History

[edit]

The concept of the *Semantic Network Model* was formed in the early 1960s by the cognitive scientist **Allan M. Collins**, linguist **Ross Quillian** and psychologist **Elizabeth F. Loftus** in various publications,^{[7][8][9][10][11]} as a form to represent semantically structured knowledge. It extends the network of **hyperlinked** human-readable **web pages** by inserting machine-readable **metad**

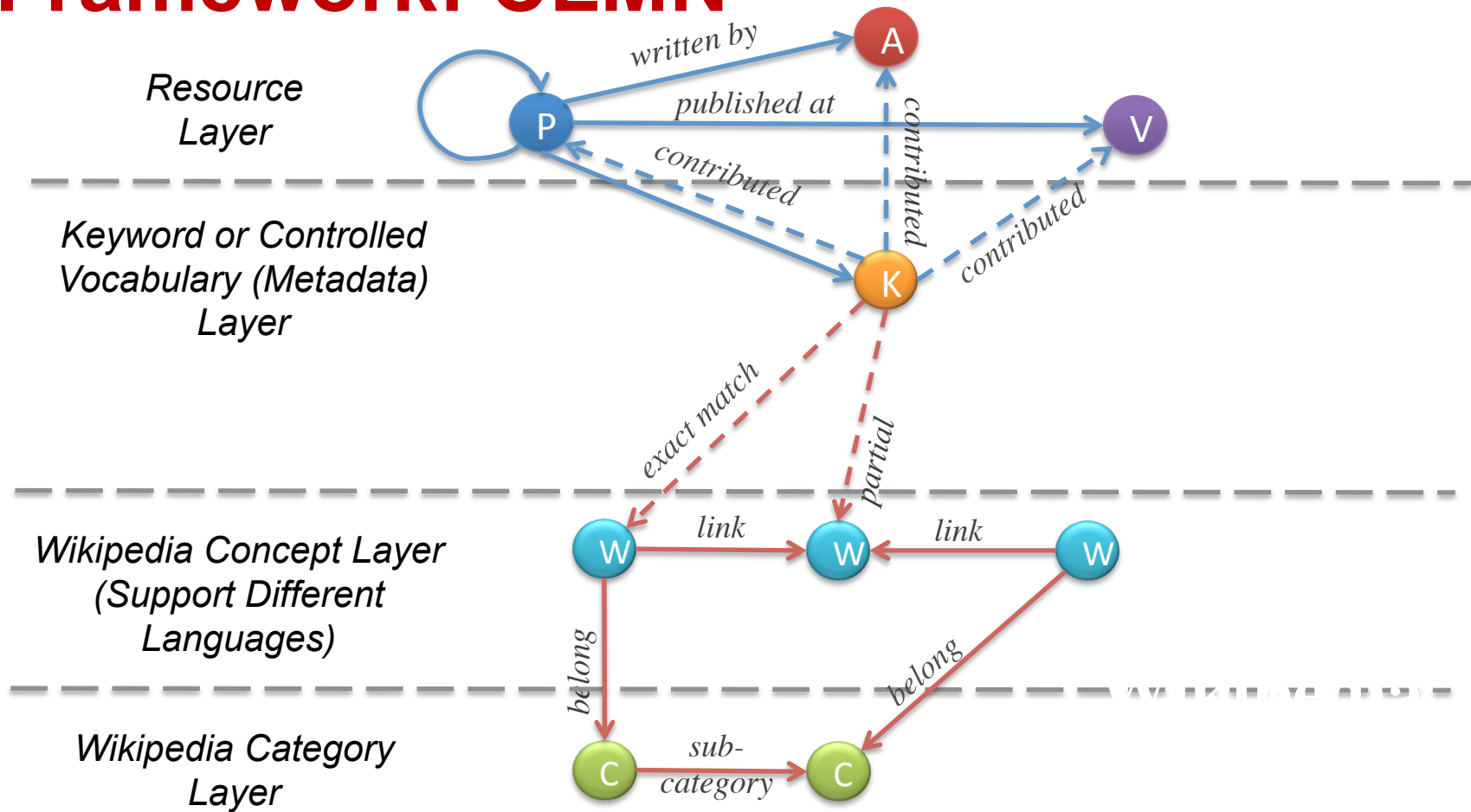
Wikipedia Concept

Same concept in different languages

A solution for the problem:

**Cross-Language
Metadata Network
(CLMN)**

Framework: CLMN



First step: a **Single-Language Metadata Network (SLMN)** is built for a monolingual digital library or repository.

Second step: the SLMN will be mapped to Wikipedia concepts and subject categories to create **Cross-Language Metadata Networks (CLMN)**.

Methods

DL1 = ACM Digital Library (in English)

DL2 = WanFang Digital Library (in Chinese)

Interim: Wikipedia 2014 May Dump

Preliminary experiment:

Input: a Chinese query topic

Output: related English topics

Two random walk functions:

1. [Chinese Keyword] \rightarrow [Wikipedia Concept] \leftarrow [English Keyword]
2. [Chinese Keyword] \rightarrow [Wikipedia Concept] \rightarrow [Wikipedia Category] \leftarrow [Wikipedia Concept] \leftarrow [English Keyword]

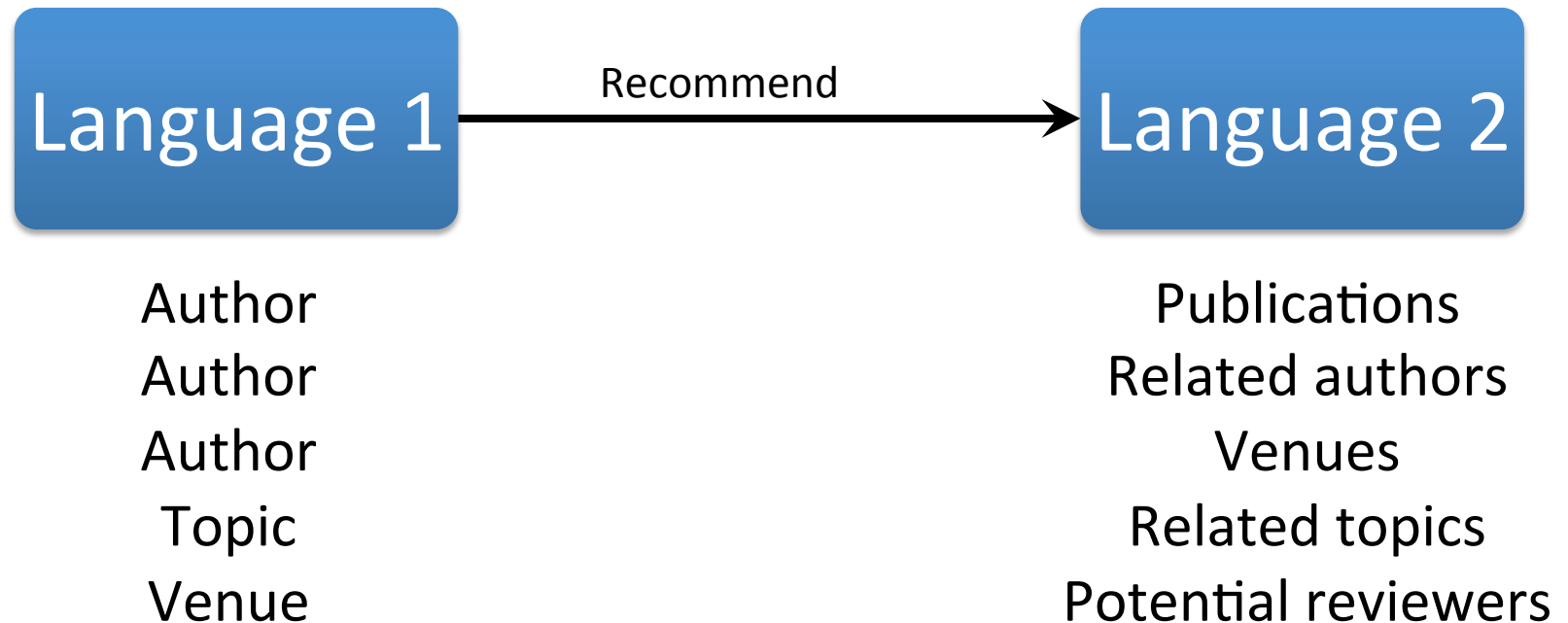
[Chinese Keyword] → [Wikipedia Concept] → [Wikipedia Category] ← [Wikipedia Concept] ← [English Keyword] (26 results)

- ① CK:机器学习 → WP:machine_learning → WC:Machine_learning ← WP:cluster_analysis ← EK:cluster_analysis
- ② CK:机器学习 → WP:machine_learning → WC:Machine_learning ← WP:expectation_maximization_algorithm ← EK:em_algorithm
- ③ CK:机器学习 → WP:machine_learning → WC:Cybernetics ← WP:complex_systems ← EK:complex_systems
- ④ CK:机器学习 → WP:machine_learning → WC:Machine_learning ← WP:reinforcement_learning ← EK:reinforcement_learning
- ⑤ CK:机器学习 → WP:machine_learning → WC:Machine_learning ← WP:pattern_recognition ← EK:pattern_recognition
- ⑥ CK:机器学习 → WP:machine_learning → WC:Machine_learning ← WP:formal_concept_analysis ← EK:concept_analysis

Potential applications

- Automatically generate cross-language vocabularies and convert them to Linked Data format
- Recommend resources across repositories and languages based on:
 - author ID (on a SLMN)
 - keyword (on a SLMN)
 - venues (venue recommendation) or
 - expert (author recommendation)

Potential applications with the Cross-Language Metadata Network



Future research

- A novel approach to generate cross-language metadata and connections
- Larger-scale experiment with evaluation by computer programs and human users
 - Validity
 - Reliability
 - Usefulness

References cited

- Liu, X., Guo, C., Yu, Y., and Sun, Y. (2014) Meta-Path-Based Ranking with Pseudo Relevance Feedback on Heterogeneous Graph for Citation Recommendation, Proceedings of the ACM International Conference on Information and Knowledge Management (CIKM).
- Liu, X., Yu, Y., Guo, C., Sun, Y., and Gao, L. (2014) Full-Text based Context-Rich Heterogeneous Network Mining Approach for Citation Recommendation, Proceedings of the ACM/IEEE Joint Conference on Digital Libraries (JCDL).