## Capturing and Classifying Ontology Evolution in News Media Archives

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### Agenda

#### Problem & Motivation

Method

Data Driven Ontology Changes Sampling Ontology Learning Limitations

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#### **Ontology Evolution**

Domain Terminology Domain Relations A Small Example

#### **Evolution Patterns**

**Outlook & Conclusions** 

### Problem & Motivation

- ▶ domain knowledge evolves continually → most real world ontologies *do* change
- Stojanovic et al.: Ontology evolution process of adaptation of an ontology

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- to arisen changes
- maintaining consistency (ontology + artifacts)
- two research projects (AVALON, RAVEN)

## Data Driven Ontology Change

#### Stojanovic et al. $\Delta$

(i) explicit, usage driven changes

(ii) implicit, data-driven changes

This work focuses on *data-driven* changes.

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 $\rightarrow$  observe changes in a domain

#### Requirements

#### ontology analysis tool

standardized process to track changes in the domain
ontology learning

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- less laborious
- no inter-/intra personal variations
- lightweight ontologies
- well defined and volatile domain

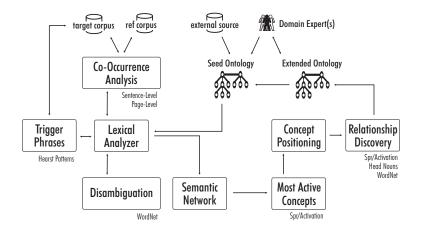
# Sampling

#### well defined domain

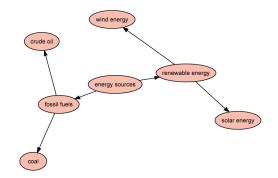
- media coverage on energy sources
- data repository: webLyzard sample based mirroring
  - ▶ 156 news media sites from five English-speaking countries

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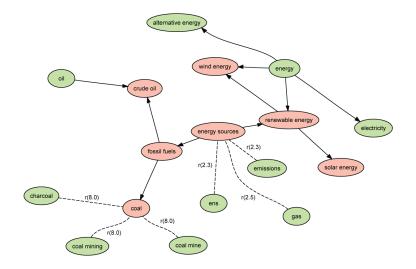
weekly mirrors; from November 2005 to August 2006



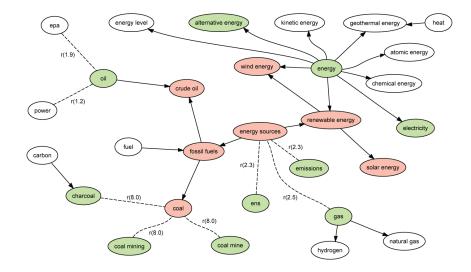
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### Limitations

 detect changes to the *domain language*, but not changes of the conceptualization

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- not one authoritative usage, but averages (e.g. alternative energy)
- handling of salience, limited disambiguation
- very coarse handling of relation types (hierarchical)

## Ontology Evolution

#### domain terminology

- core domain terminology comprises frequently used concepts; constantly included into the domain's ontology
- extended domain terminology additional domain concepts; lower relevance/importance; used for special topics within the domain (e.g. nuclear power, ); not as universally used as the core domain terminology
- peripheral terminology is used documents; does not carry important domain concepts; not included in the domain ontology

## Ontology Evolution

#### domain relations

- core domain relations featuring essential relations between core domain vocabulary,
- extended domain relations comprising relations to extended domain vocabulary as well as non-essential relations between the core vocabulary, and

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 Peripheral domain relations which do not carry enough weight to be included into the ontology.

influenced by: scope, granularity, etc.

## A Small Example

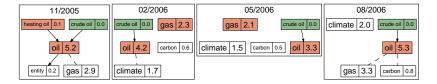


Figure: Evolution of the concept "oil" from November 2005 to August 2006.

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### **Evolution Patterns**

#### Terminology

Changes in a term's importance; focus of media coverage shifts

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- Change of the assigned concept
  - Change in term focus oil
  - Change in term assignment fuel, storage
  - Change in context Sri Lanka, Maldives

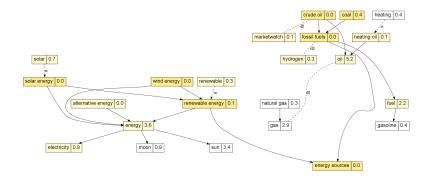


Figure: Extended Ontology (November 2005)

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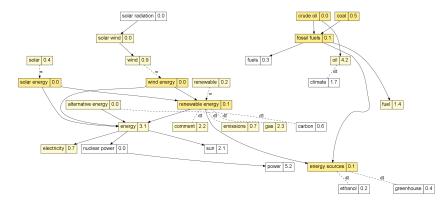


Figure: Extended Ontology (February 2006)

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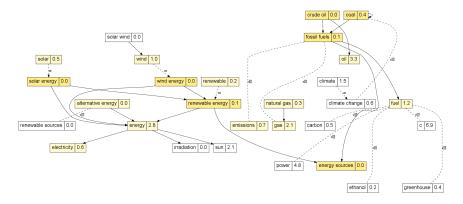


Figure: Extended Ontology (May 2006)

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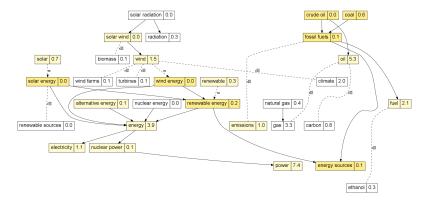


Figure: Extended Ontology (August 2006)

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### Conclusions

- system for tracking changes in domain ontologies
- visualization
- empirical study (online media)
  - three levels of domain concepts and relations (core, extended and peripheral)
  - observed changes to a term's importance and meaning

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## Outlook

- tight integration with the Media Watch on Climate Change
- formalization of changes to the ontology
  - $\rightarrow$  temporal reasoning
- improvements to the ontology learning component
  - relation type detection
  - user feedback (Δ community versus domain experts)

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