# Towards Creating Pedagogic Views from Encyclopedic Resources

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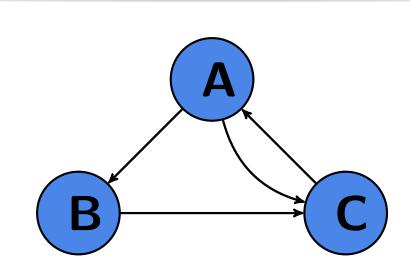
### 1. Introduction

**Observation**: Encyclopedic resources like Wikipedia have good reference value and broad coverage, but have limited pedagogic value. Textbooks on the other hand are often static and limited in coverage.

### Motivation

How can we effectively create a pedagogic view of content from encyclopedic resources?

# 2. Concept network



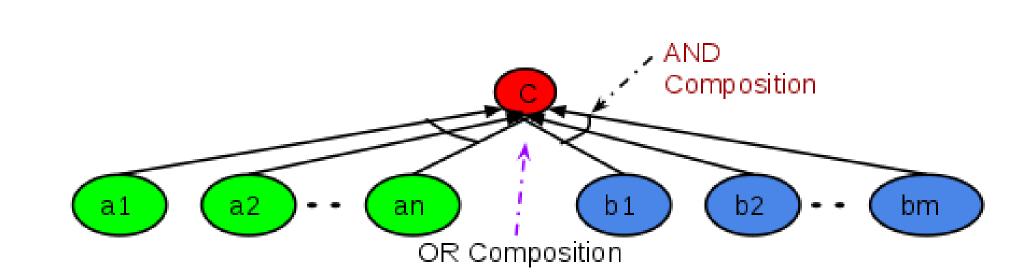
- Edge from a concept A to a concept B signifies that A is used to define B
- Circularity in the concept network:
- Description of Concept A assumes that Concept C is known
- Description of Concept C assumes that Concept A is known
- Ideally, a pedagogic resource should ensure that its concept network is a directed acyclic graph

### Goal

Identify circular definitions and help content editors eliminate them

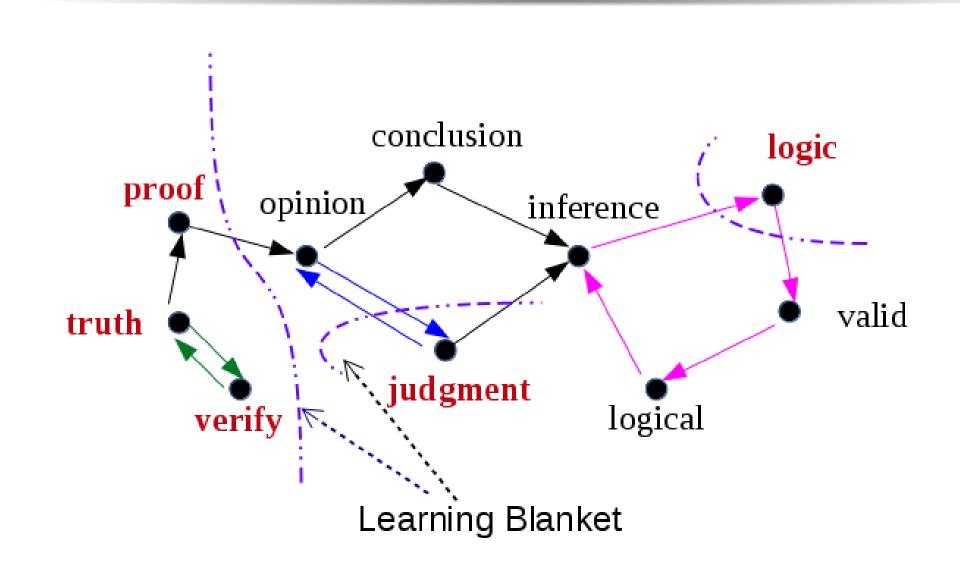
• WordNet is used as an example of encyclopedic resource, where concepts are words

# 3. Soft AND-OR composition



• User has to know either all  $a_i$  s or all  $b_j$  s to understand the Concept C. Soft AND-OR composition imposes relaxation on AND

# 4. Example



• Learning blanket encompasses the set of concepts in the concept graph that learner is familiar with

Circularities situated below the learning blanket do not challenge the learner

# 5. Methods to resolve circular dependencies

- Perceptual grounding
- Eg: Concepts like *red* can be defined by contrasting against other colors
- Collapsing
- Eg: Concepts such as *polite* and *courteous* can be defined using a single definition *showing good manners*
- Linguistic grounding
- Eg: the circular definition of *opinion* in the example depicted in section 5 can be broken by redefining it as a personal view instead of the current definition a judgment of a person.

# 6. Greedy discovery of concepts for grounding

- Identify the set of concepts that do not take part in any cycle
- Rank the remaining concepts based on the extent to which they affect learning due to cycles
- Add concepts one by one in the ranked order, until there are no more cycles in the graph

# 7. Ranking concepts for grounding

### Relative Coverage

 $helpsUnderstand(a,b) \iff a \text{ occurs in the defi-}$  nition of b

 $Coverage(a) = \{b \mid helpsUnderstand(a, b)\}$ 

 $Reachability(b) = \{a \mid helpsUnderstand(a, b)\}$ 

 $RelativeCoverage(a) = \sum_{b \in Coverage(a)} \frac{1}{|Reachability(b)|}$ 

Weakness: Ignores transitive closures and implicitly assumes OR composition

## PageRank

• Recursively estimate the importance of concepts in the concept network

**Limitation**: Score of a concept increases (decrease) with increase (decrease) in the score of any of its in-neighbours

# Proposed Solution: Weighted PageRank with weight as Relative Coverage

# 8. Identifying regions for collapsing

- **Hypothesis**: Nodes in Strongly Connected Components(SCC) are related
- Collapse SCCs in which the number of nodes is less than some threshold
- Rank SCCs using topological sort

### 9. Resources

- Learning resources: content words in Brown and Gutenberg corpora
- Brown Corpus 23,238 content words
- Gutenberg Corpus 18,361 content words
- Concept network: using the word definitions in WordNet
- Average learning blanket: words present in Indian English Textbook published by National Council of Educational Research And Training(NCERT)

# 10. Comparison of methods

### Values denote % of concepts flagged to experts

Avg. level	Relative		Pagerank		Pagerank		Random	
of learning	Coverage				(Rel Cov)			
blanket	Brown	Gut	Brown	Gut	Brown	Gut	Brown	Gut
1	13.9	14.7	14.7	14.8	13.6	13.9	28.5	29.5
2	13.0	12.9	12.7	12.5	11.4	11.3	24.1	25.9
3	12.5	12.3	12.5	10.9	10.6	10.7	25.7	23.8
4	11.2	9.9	10.4	9.2	9.0	8.8	19.3	20.3
5	13.4	10.8	9.3	12.2	8.5	12.9	18.1	20.2

• Smaller fraction of concepts should be flagged for editing to reduce the human effort. Values in bold correspond to the best reductions.

# 11. Example - concepts suggested for collapsing

displeasure	magnificent	pasture	sleeve
displease	grandeur	herbage	armhole
deceit, deceive	stubborn	existence	enfold
defraud	obstinate	extant	enclose
dishonest	tenaciously	exist	

# 12. Conclusion and future work

#### • Contribution:

- Identified characteristics of the encyclopedic resources that hinder learning
- Proposed approaches that help experts create a pedagogic view of an encyclopedic resource. Experiments show significant reduction in the number of concepts flagged for editing

#### • Future work:

- Explore personalized extensions to discover the learning blanket of a learner to help her explore the pedagogic space of concepts
- Extend to resources like Wikipedia

### References

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