







# DynaLearn, una herramienta de razonamiento cualitativo

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### **Outline**

- 1. Introduction
- 2. Qualitative Reasoning modelling
- 3. Semantic Technologies
- 4. Semantic Grounding
- 5. Semantic Feedback
- 6. Research and in-use questions





















"Engaging and informed tools for learning conceptual system knowledge"



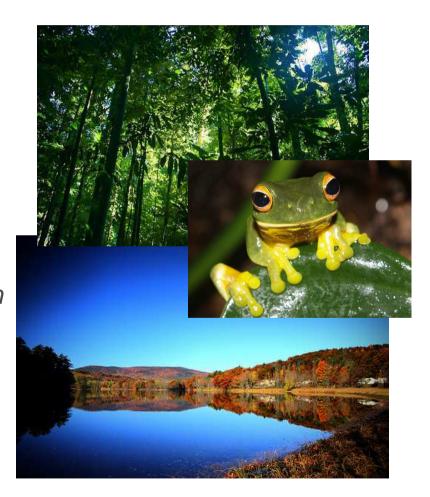
### **QUALITATIVE REASONING**

- Trata de capturar la interpretación humana de la realidad
- Representa sistemas físicos mediante modelos
- Estudia su comportamiento mediante simulación
- Enfocado en las variables cualitativas de los sistemas (ej.: cierto árbol es de tamaño "grande", la población de cierta especie "aumenta", etc.) más que en variables numéricas

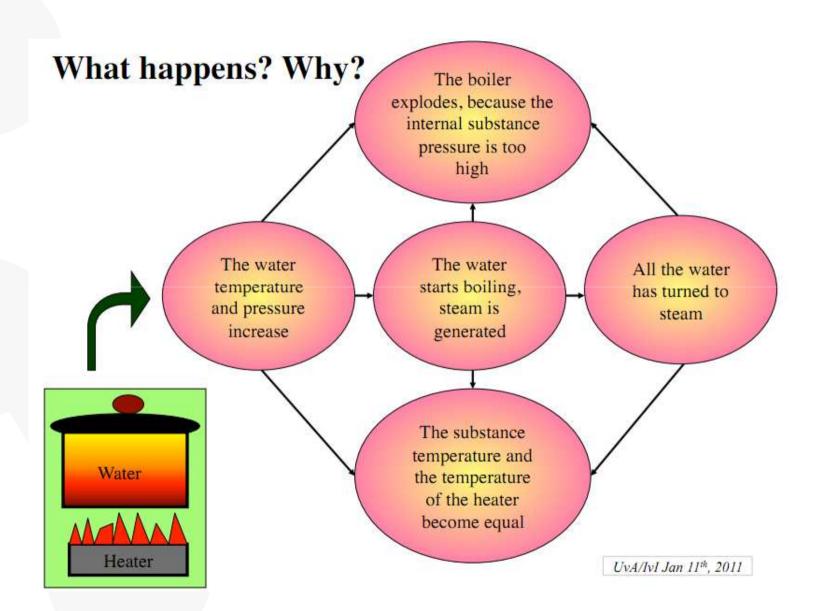


#### APPLICATION TO LEARNING OF ENVIRONMENTAL SCIENCES

- Idea: aprendizaje basado en construir modelos ("Learning by modelling")
- Herramientas para el aprendizaje:
  - Definición de terminología apropiada
  - Interacción con el modelo
  - Predicción de su comportamiento
- Ejemplos:
  - "Estudiar la evolución de la población de una especie cuando se introduce otra en su mismo ecosistema"
  - "Estudiar el efecto de los agentes contaminantes en un rio"
  - •

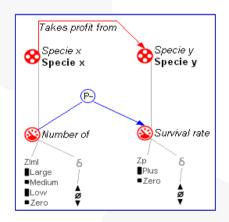


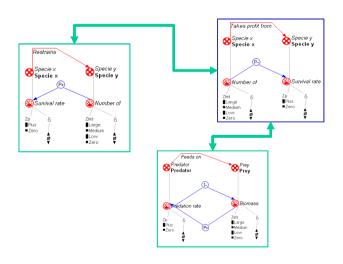




#### **DYNALEARN**

- "Sistema para la adquisición de conocimiento conceptual en el contexto de la enseñanza de ciencias medioambientales". Combina:
  - Construcción de modelos representando un sistema
  - Técnicas semánticas para relacionar distintos modelos de alumnos y profesores
  - Uso de avatares para interaccionar con el sistema

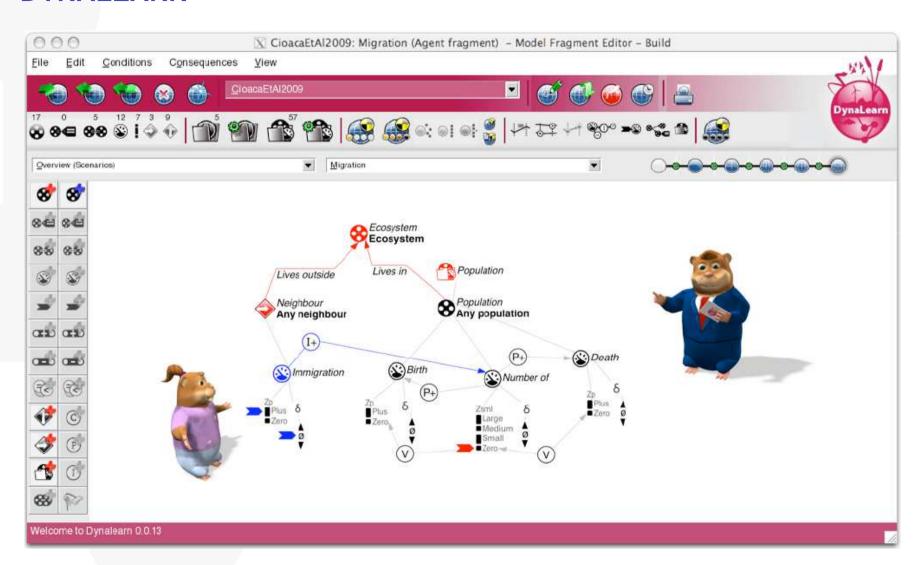








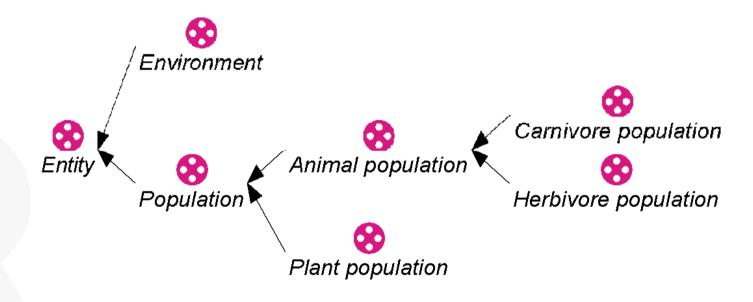
### **DYNALEARN**



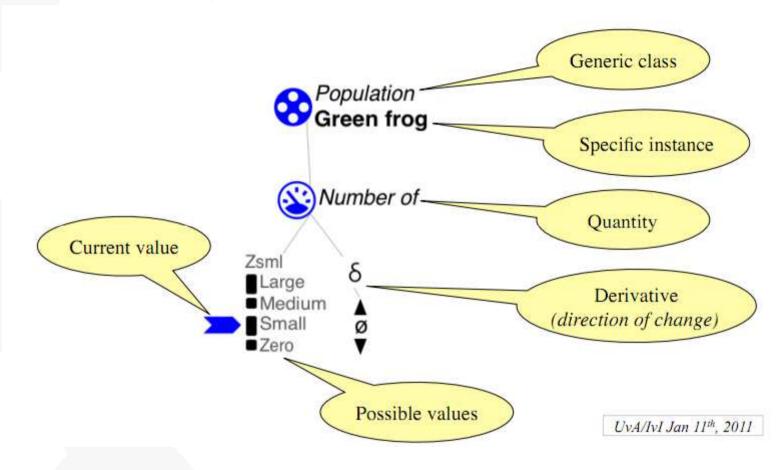


# **QR Modelling**

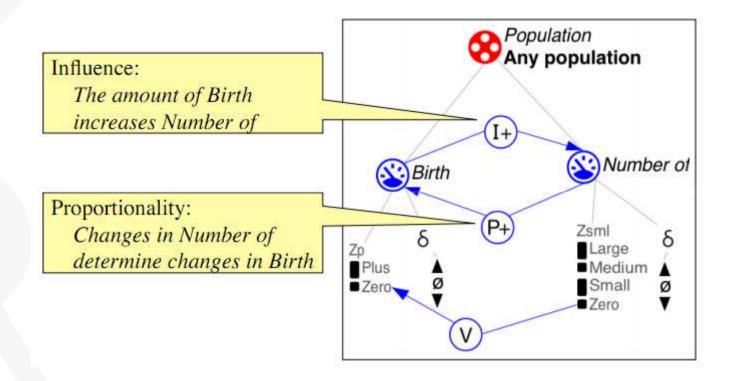
### **Entities**



# **Scenarios** (starting situation)

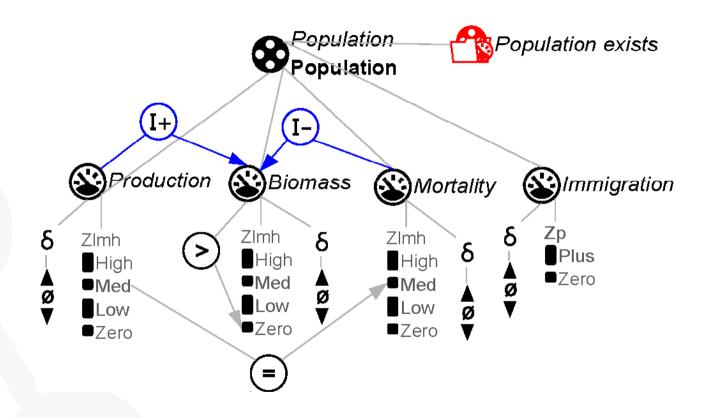


### Model fragments (capturing partial knowledge)



# **QR Modelling**

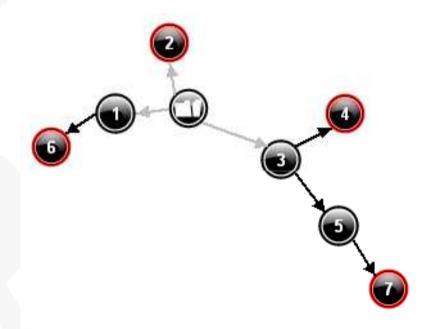
### Model fragments (capturing partial knowledge)



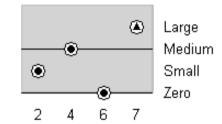


# **QR Modelling**

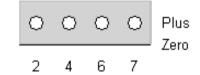
# **Running simulations**



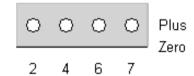
#### Green frog: Biomass



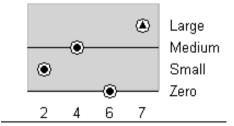
#### Green frog: Birth

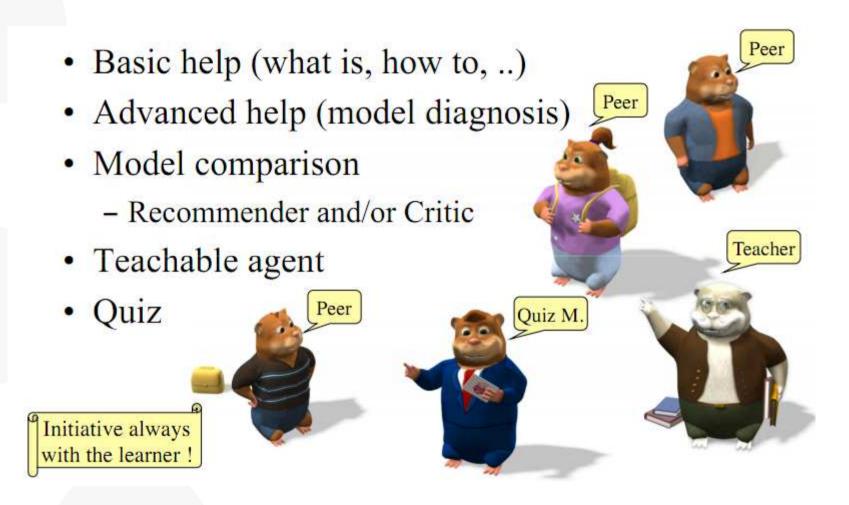


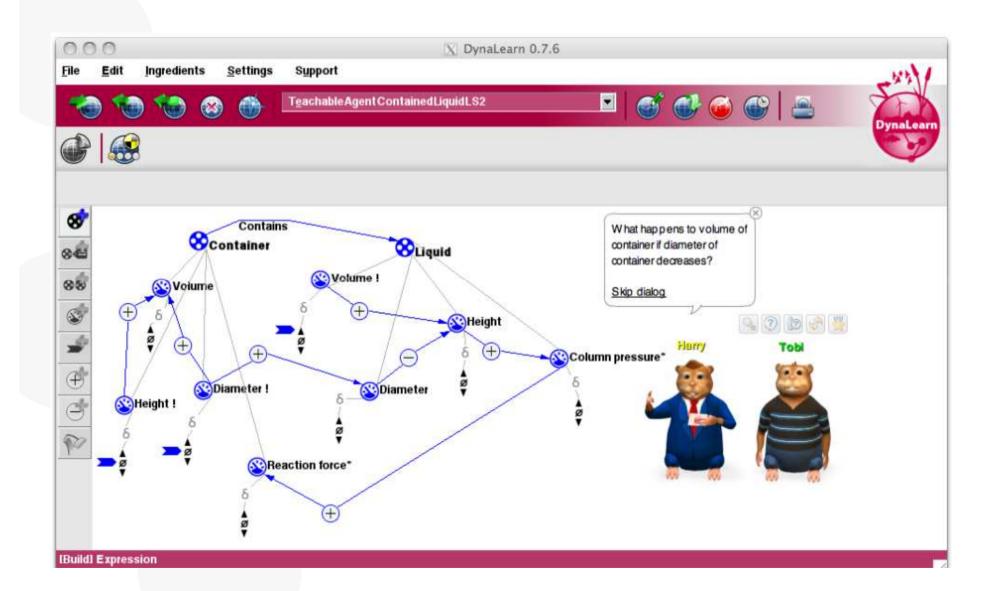
#### Green frog: Death



#### Green frog: Number of







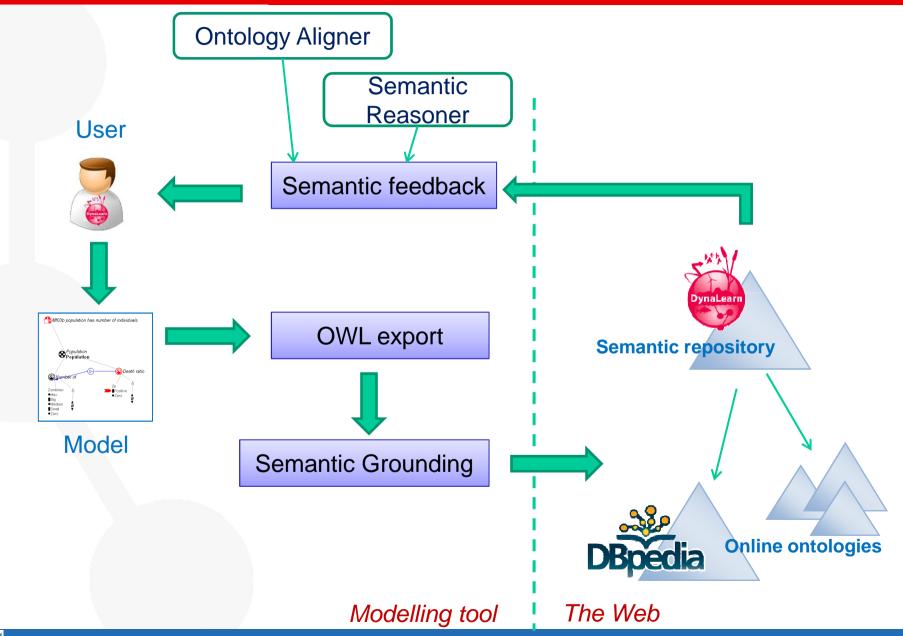
# **Semantic Techniques**

### **SEMANTIC TECHNIQUES**

- To bridge the gap between the loosely and imprecise terminology used by a learner and the well-defined semantics of an ontology
- To put in relation to the QR models created by other learners or experts in order to automate the acquisition of feedback and recommendations from others

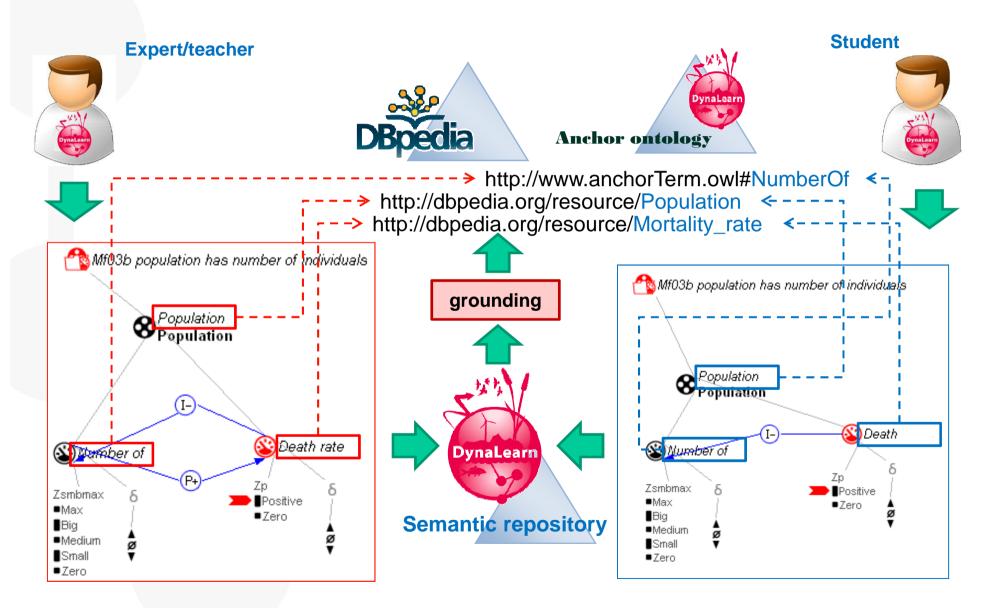


# **Semantic Techniques**





# **Semantic Grounding**





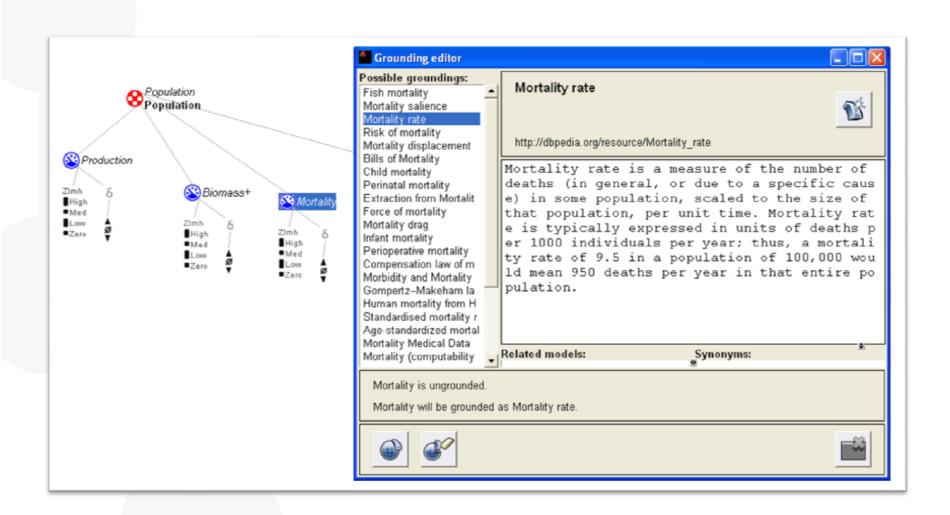
# **Semantic Grounding**

### **Benefits of grounding**

- Support the process of learning a domain vocabulary
- Ensure lexical and semantic correctness of terms
- Ensure the interoperability among models
- Extraction of a common domain knowledge
- Detection of inconsistencies and contradictions between models
- Inference of new, non declared, knowledge
- Assist the model construction with feedback and recommendations



# **Semantic Grounding**





### **Semantic Feedback**

e.g., "You can complete your model with a P+ proportionality"

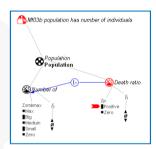


Feedback (assessments)



#### Student











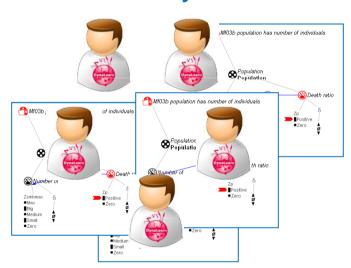
e.g., "Users who modelled death also modelled birth"



Feedback (extensions)

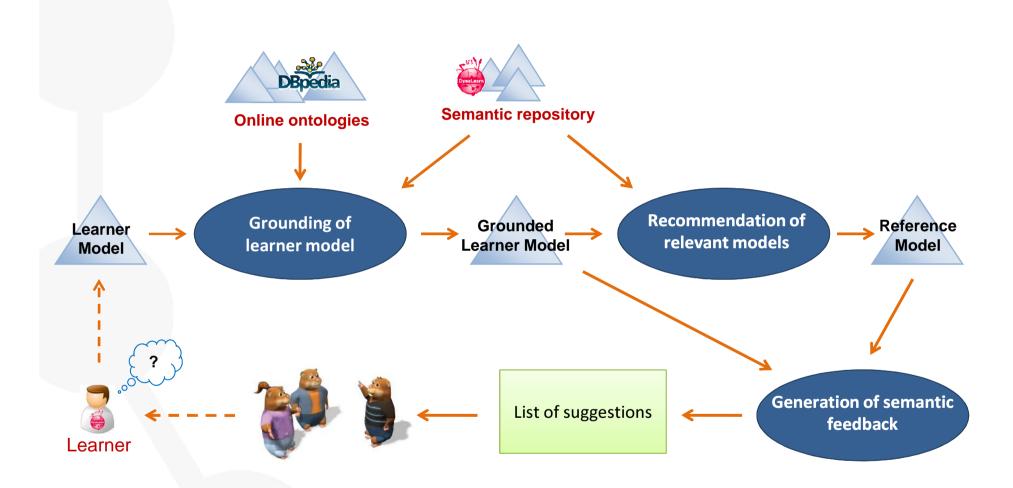


### **Community of users**





# **Semantic Feedback**





### **Semantic Feedback**

- Collaborative filtering for (subjective) community-driven recommendation. E.g.:
  - "Users who liked model X also liked model Y"
  - "Users who modeled X also modeled Y"
- Model-based. Recommendations based on the properties of the model under an objective perspective. E.g.:
  - "Find a model fragment with inverse behaviour to the current one"
  - "List all models which are more specific than the current one"



# Research & in-use questions

#### **SOME RESEARCH QUESTIONS**

- Q1. Which external knowledge source is the most suitable for grounding?
- Q2. Are the proposed groundings suitable according to human opinion?
- Q3. Are the state-of-the-art ontology matching tools suitable for the alignment of QR models?

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### **Q1 – Semantic Web resources**

### **Coverage Study**

Tested 1686 different English words coming from DynaLearn glossaries

| Knowledge source | Coverage Ratio |  |  |
|------------------|----------------|--|--|
| DBpedia          | 72%            |  |  |
| OpenCyc          | 69%            |  |  |
| WordNet          | 45%            |  |  |
| Watson           | 47%            |  |  |

Behaviour of Dbpedia in other languages?

Labels in other languages for the covered English terms:

| Language   | ratio |
|------------|-------|
| English    | 100%  |
| German     | 72%   |
| Spanish    | 64%   |
| Dutch      | 61%   |
| Portuguese | 58%   |



### **Q1 – Semantic Web resources**

### **Coverage Study**

What if we fix spelling errors and suggest nearby terms?: "fiter feeding" → "filter feeding"

| Knowledge source                    | Coverage Ratio |  |
|-------------------------------------|----------------|--|
| DBpedia + Yahoo Spelling Suggestion | 78%            |  |

#### What if we combine several sources?:

| Knowledge source                     | Coverage Ratio |  |
|--------------------------------------|----------------|--|
| DBpedia + OpenCyc                    | 87%            |  |
| DBpedia + Watson                     | 73%            |  |
| Dbpedia + WordNet                    | 72%            |  |
| Dbpedia + OpenCyc + WordNet + Watson | 88%            |  |



### Research & in-use questions

### **SOME RESEARCH QUESTIONS**

Q1. Which external knowledge source is the most suitable for grounding?

DBpedia (combined with OpenCyc for English)

- Q2. Are the proposed groundings suitable according to human opinion?
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### Q2 – human-based evaluation

#### **HULL'S EXPERIMENT**

- Tested 909 English labels covered by DBpedia, randomly selected from DynaLearn glossaries
- Asked 8 expert evaluators, each one evaluated between 200-300 groundings. Each grounding was double-evaluated
- Question: For each grounded term, are all its relevant meanings contained in the set of grounding candidates? If yes, mark the relevant ones.

| Accuracy  | precision@1st |  |  |
|-----------|---------------|--|--|
| (Average) | (Average)     |  |  |
| 83%       | <b>76</b> %   |  |  |

| Inter-evaluator Agreement Level (Average) |                        |         |  |
|-------------------------------------------|------------------------|---------|--|
| Agreem.1                                  |                        |         |  |
| (chosen                                   | Agreem.2 (existence of | Cohen's |  |
| grounding)                                | suitable grounding)    | Карра   |  |
| 78%                                       | 85%                    | 0,47    |  |



# Research & in-use questions

### **SOME RESEARCH QUESTIONS**

Q1. Which external knowledge source is the most suitable for grounding?

Dbpedia (combined with OpenCyc for English)

Q2. Are the proposed groundings suitable according to human opinion?

Yes... (with an 83% accuracy)

Q3. Are the state-of-the-art ontology matching tools suitable for the alignment of QR models?



# **Q4 - Ontology Matching**

#### MODEL MATCHING EXPERIMENT

Reference Alignments:

Provided by experts, manually aligned:

Case 1 - Social aspects of population growth, v1 vs. v2

Case 2 - Soil contamination, v1 vs. v2

Case 3 - Hervibory vs. Predation

Case 4 - Amensalism vs. Commensalism

Ontology alignment tools tested: CIDER, Falcon



# Q4 - Ontology Matching

|                | CIDER     |        |          | Falcon    |        |          |
|----------------|-----------|--------|----------|-----------|--------|----------|
|                | Precision | Recall | Time (s) | Precision | Recall | Time (s) |
| Case 1 (pop.)  | 1.00      | 1.00   | 10.8     | 0.80      | 1.00   | 1.9      |
| Case 2 (soil)  | 1.00      | 1.00   | 9.2      | 0.79      | 1.00   | 2.0      |
| Case 3 (h./p.) | 1.00      | 1.00   | 4.2      | 0.63      | 1.00   | 1.8      |
| Case 4 (a./c.) | 0.67      | 0.80   | 4.6      | 0.44      | 0.80   | 1.7      |
| AVERAGE        | 0.92      | 0.95   | 7.2      | 0.67      | 0.95   | 1.9      |



# Research & in-use questions

#### **SOME RESEARCH QUESTIONS**

Q1. Which external knowledge source is the most suitable for grounding?

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Q2. Are the proposed groundings suitable according to human opinion?

Yes... (with an 83% accuracy)

Q3. Are the state-of-the-art ontology matching tools suitable for the alignment of QR models?

Yes



### Some references

- [1] Bredeweg, B., Liem, J., Linnebank, F., Bühling, R., Wißner, M., Gracia, J., Salles, P., Beek, W. and Gómez Pérez, A. *DynaLearn: Architecture and Approach for Investigating Conceptual System Knowledge Acquisition*. In Intelligent Tutoring Systems 2010, Part II, pp. 272-274, LNCS 6095, Springer-Verlag.
- [2] Gracia, J., Liem, J., Lozano, E., Corcho, O., Trna, M., Gómez-Pérez, A., and Bredeweg, B. (2010). *Semantic Techniques for Enabling Knowledge Reuse in Conceptual Modelling*. Proc. of 9th International Semantic Web Conference (ISWC2010), Shanghai (China), Springer, volume 6414, November 2010. **Nominated as best in-use paper**.
- [3] DynaLearn web site, <u>www.dynalearn.eu</u>



# Thanks for your attention!

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