## Working group "Learning and Reasoning" Where we are

#### group Kay R. Amel

GDR IA

Fall 2018-Fall 2019: 3 meetings + a tutorial presentation at Scalable Uncertainty Management'2019 conference + an ArXiv report

2020-2021 Covid !!

Today we restart!

1/8

#### Motivations - The current situation

- Reasoning and learning: two basic concerns at the core of AI
- Since more than 30 years, KRR and ML have been developed independently with a large number of dedicated sub-fields, each with many technical results
- It results into an almost complete separation of the lines of research in the two areas
- making many researchers on one side ignorant of what is going on on the other side

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## Motivations - The aim of this joint work

- going beyond simplistic dichotomies suggesting a large gap between KRR and ML:
  - KRR deals with knowledge, ML handles data
  - KRR privileges *symbolic*, discrete approaches, while *numerical* methods dominate ML
- KRR and ML may have more in common than one might think at first glance
- the goal pursued is to inventory meeting points between KRR and ML

## An ArXiv report

From Shallow to Deep Interactions Between Knowled- ge Representation, Reasoning and Machine Learning Zied Bouraoui (CRIL, Lens), Antoine Cornuéjols (AgroParisTech, Paris), Thierry Denœux (Heudiasyc, Compiègne), Sébastien Destercke (Heudiasyc, Compiègne), Didier Dubois (IRIT, Toulouse), Romain Guillaume (IRIT, Toulouse). João Margues-Silva (ANITI, Toulouse, Fr), Jérôme Mengin (IRIT, Toulouse), Henri Prade (IRIT, Toulouse), Steven Schockaert (School of Computer Science and Informatics, Cardiff), Mathieu Serrurier (IRIT, Toulouse), Christel Vrain (LIFO, Orléans).

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#### Structure of the report

Common Concerns

- Some Methodologies Combining
   Reasoning Principles and Learning
- Examples of KRR/ML Synergies
- References

5/8

Contents of the report

#### **Contents Common Concerns**

- Types of Representation
- Computational Complexity
- Lack and Excess of Information: Uncertainty
- Causality and Explainability

# Contents Methodologies Combining Reasoning Principles and Learning

- Injecting Knowledge in Learning
- Inductive Logic Programming
- Neuro-Symbolic Reasoning
- Formal Concept Analysis
- Rule-Based Models
- Uncertainty in ML: in the data or in the model
- Case-Based Reasoning, Analogical Reasoning and Transfer Learning

Contents of the report

## Contents Examples of KRR/ML Synergies

- Dempster-Shafer Reasoning and Generalized Logistic Regression Classifiers
- Maximum Likelihood Under Coarse Data
- EM Algorithm and Revision
- Conceptual Spaces and the Semantic Description of Vector Representations
- Combining Deep Learning with High Level Inference
- Knowledge Graph Completion
- Declarative Frameworks for Data Mining and Clustering
- Machine Learning vs. Automated Reasoners
- Preferences and Recommendation