# Computing Inferences for Credal ALC Terminologies

#### Kate Revoredo Department of Applied Informatics



Rodrigo B. Polastro, Fabio Cozman and Felipe I. Takiyama Escola Politécnica



#### Quick overview

- Goal: to build a package that performs inferences in terminologies that combine probabilities with *ALC*-style constructs.
- Language is called Credal ALC (CrALC).
- Short paper reports on initial development (mostly by first author).
- Current effort: to implement lifted inference algorithms (mostly by third author).



#### CrALC - Example

- Individuals, concepts, roles.
- Extends ALC constructors with *probabilistic inclusions* 
  - $P(C|D) = \alpha$ , interpreted as: for every element x of domain,  $P(C(x)|D(x)) = \alpha$ .
  - $P(r)=\beta$ , interpreted as: for every pair (x,y) of elements of the domain,  $P(r(x,y))=\beta$ .
- Acyclic terminology

 $B \subseteq A$   $C \subseteq B \sqcup \exists r.D$  P(A)=0.9, P(B|A)=0.4  $P(C \mid B \sqcup \exists r.D)=0.6$  $P(D|\forall r.A)=0.3$ 





#### CrALC - Inference

- The challenge is to compute the probability of an assertion, conditional on other assertions.
  - P(D(a)|B(b)) = ?
    - One solution: generate propositional Bayesian network, solve it.



#### Inference in CrALC - Example

Domain={a,b}



- Markov condition guarantees interpretation as relational Bayesian network.
- P(D(a)|B(b)) = 0.232



### CrALC - Inference

- The challenge is to compute the probability of an assertion, conditional on other assertions.
  - P(D(a)|B(b)) = ?
    - One solution: generate propositional Bayesian network, solve it.
      too hard...
    - Another solution: variational approximation method by Polastro.
      - approximate, and still not very easy....
    - Yet another solution: lifted inference (under implementation...).
- But the problem is that there is no available package to easily run these algorithms.



## A Package

 Adopts specification by enhanced KRSS (Knowledge Representation System Specification).

- Preliminary (free) implementation with variational inference.
- Lifted inference is next step.



http://sites.poli.usp.br/pmr/ltd/Software/CRALC/index.html

# Questions?

