

## Decentralized Reasoning with Inconsistencies in Peer-to-Peer Inference Systems IASI-GEMO team

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- 1. Introduction
  - Peer Data Management Systems
  - The SomeWhere platform
- 2. Reasoning with inconsistent peers theories
  - Detection of inconsistencies
  - Well-Founded Reasoning

## Why Peer-to-Peer?



### **Characteristics of P2P Systems**

- Networks of independent peers
- Each peer can be a provider and a consumer (client / server)
- Scaling up
- Dynamic architectures
- Robustness

**Goal :** Explore how to benefit from such nice properties in the context of semantic information integration systems





## Answering queries in a PDMS

## 2 steps approach

• query reformulation

computes maximal rewritings of the query

i.e. most general conjunctive queries that entails the initial query wrt the global theory

evaluation of the reformulations against data





- Propositional reasoning is already difficult
- Simplicity of the language allows for efficient algorithms implementation
- Tremendous improvements of SAT solvers over the previous decades
- Consequence Finding algorithms may benefit from some of these techniques
- The encoding may be hidden to the user

SomeWhere is a general architecture that can be used in a much wider range of applications than information integration



## No peer knows the global theory !

A peer only knows

- its local theory
- mappings with its direct neighbors

Many interesting inference problems have to be reconsidered in this fully distributed setting

- Can we obtain in a fully decentralized way the very same answers that would be obtained in the centralized case ?
- Does the solution scale up ?

## For consequence finding ?

#### DeCA [Adjiman & al 06]

- runs on all peers
- query a peer with its language
- computes consequences of an input clause c

#### A two step algorithm

1. Computes local consequents wrt some production field.

Pure local consequents are returned immediately

- 2. Split/Recombination strategy
  - clauses involving foreign variables are splitted
  - Implicates of foreign litterals are recursively computed by neighbors peers
  - respective results are recombined incrementally





#### **Properties**

- Anytime
- Termination notification
- Correctness
- Completeness

all proper prime implicates of a clause wrt the global theory are returned

DeCA has been implemented in the SomeWhere Plateform

#### **Experimental evaluation**

- "small world" networks of 1000 peers
- random 2+k clause theories (crossover sat/unsat) 70 variables

#### $\Rightarrow$ Somewhere scales up

[IJCAI'05,JAIR'06]



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# In case of inconsistency ?

#### Problem 1

Trivialization renders DECA answers meaningless !

#### **Problem** 2

Inconsistencies **cannot be avoided** because the framework is decentralized

All peers being equal... no culprit !

#### New challenges :

- Can we detect the presence of inconsistencies ?
- Can we restrict the reasoning to produce only meaningful answers ?



#### A reasonable hypothesis

We assume each T<sub>i</sub> to be consistent

Peer theories  $T_i = L_i U M_i$ 

- $L_i$ : the "local" part of  $T_i$
- $M_i$ : the "mapping" part of  $T_i$

Thus  $L = U L_i$  is consistent

Mappings are responsible for inconsistencies

#### Def

A **nogood** is a subset ng of  $M = U M_i$ such that L U ng is inconsistent



### It can be done in a fully decentralized way

the empty clause should be derivable from any clause of a nogood

When a new mapping *m* is added look for proofs of the empty clause

- with *m* as input clause
- *ms is* the mapping support of the proof
  *ms* U {*m*} is a nogood !

# **P2P-NG(m,P)** is a both a specialized and extended version of DeCA

- used for each addition of a mapping *m* to a peer *P*
- keeps track of mapping supports
- termination conditions are different
- looks for all possible empty clause proofs
- focuses on derivation of the empty clause

## P2P-NG illustration





### **Properties of P2P-NG**

- correct
- complete

all **minimal nogoods** are discovered whatever the order of mapping introduction

- nogoods are stored in a distributed way
  A nogood found by P2P-NG(m,P) is recorded by the peer P
- Peers having mappings involved in nogood are not necessarily aware of it



**Def** a **well founded consequent** of c wrt the (global) theory T is a consequent of c wrt a consistent subset of T

Intuition

consequents all mapping support of which contain some nogood should be discarded

### Problem

all nogoods have been detected but no peer knows where these are stored



An extension of DeCA that

- computes consequents of some input clause
- keeps track of mapping supports
- collects **relevant** nogoods on visited peers
- filter out consequents that are not well founded

#### relevant nogoods

a nogood ng is relevant to a consequent with a set of mapping supports sms =  $\{ms_1, ..., ms_K\}$  if it contains at least a mapping of  $ms_1, ..., ms_K$ 

#### WF-Deca: illustration $(a_4 \{[m_4]\} \varnothing) \otimes (\Box \{[m_2]\} \varnothing) \otimes (\Box \{[m_3]\} \{[m_2, m_3]\})$ q<sub>4</sub> ? $(a_4 \{[m_2, m_3, m_4]\} \{[m_2, m_3]\})$ M<sub>4</sub> $P_4$ $\mathbf{m}_4$ : $\neg \mathbf{q}_4 \mathbf{v} \mathbf{a}_4 \mathbf{v} \mathbf{a}_1 \mathbf{v} \mathbf{b}_1$ $\Box \{[m_3]\} \{[m_2, m_3]\}$ $a_4 v b_1 v a_1 \{[m_4]\} \emptyset$ $\Box \{ [ m_2 ] \} \emptyset$ Lγ L<sub>2</sub> b<sub>1</sub> $b_3$ **a**<sub>2</sub> ng = M<sub>3</sub> M<sub>1</sub> **b**<sub>1</sub>? $[m_2, m_3]$ a<sub>1</sub>? $m_3: \neg b_3 v b_1$ $m_2: \neg a_2 v a_1$ **P**<sub>3</sub> **P**<sub>2</sub> **¬a**₁ {[ ]} Ø $\neg b_1 \{[]\} \emptyset$

¬a<sub>1</sub> v ¬b<sub>1</sub>

L<sub>1</sub>

**P**<sub>1</sub>

 $\mathbf{a}_1$ 

 $b_1$ 

## WF-DeCA Properties

#### **Properties**

- anytime
- termination notification
- guarantee that **all** relevant nogoods are collected
- correctness relies on the completeness of P2P-NG

⇒ **SomeWhere+** [experimental evaluation]



Fully decentralized reasoning in a P2P setting is possible and scales up

- Deca consistent network
- WF-Deca with inconsistencies

Outcome of projects Picsel3, Mediad [FT R&D]

- SomeWhere [regist. softw.] used at Univ. Toronto
- SomeRDFS [WebContent]



- dynamicity of P2PIS
- rewriting evaluation strategies
  - preferences
  - cost model

### Related work :

- Trust model inconsistent answers
- conservative extension
- conditional mappings / alternative semantics