

Flexible and Fine-Grain Decision Support Based on Data Interpretation

A Case Study with Cadral Decision Support System

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**Context (1)** family benefits complexity

## **The National Family Benefits Fund**

takes care of 100,000 families & 160,000 individuals

faces a constant augmentation in number & complexity of the beneficiaries

provides birth, household, education aids

applies European acts & legislation, bi-lateral agreements, national law



**Context (2)** Grand-Duchy of Luxembourg

open & active economy (agriculture, industry, services...)

40% foreigners (from Portugal, Italy, France, Eastern Europe...)

130,000 cross border workers (from France, Belgium, Germany)

450,000 inhabitants





# **Cadral Overview (1)**

2 sides of a use-case

In Luxembourg, Cadral handles the acceptation / refusal of applications filled by the public for family benefits

#### **Integration side**



#### Workflow processing side





# **Cadral Overview (2)**

## utilization modes

### **Problem solving**

CADRAL basic mode for reliable, efficient, fair processing within complex legal frameworks

> Cadral Knowledge Base

### **Mass-simulation**

Use CADRAL for socio-economic predictions, impact measurements with respect to demographic, legal evolutions

#### Validation

Knowledge modeled into Cadral procedures **can be checked** with respect to logic & behavioral properties

### On the fly assistant

CADRAL helps asking the right thing to the right person at the right moment, e.g. when completing paper/online forms





Developed with operational (integrated into the Luxembourg's Family Benefit Fund infrastructure) and academic (PhD hosting) partnerships,

**Cadral** is a decision support framework tailored to fits operational requirements, through:

- business oriented procedural knowledge model
- flexible reasoning kernel
- data interpretation to refine computed results



# **Cadral Architecture (2)**

## a business expert system





**Procedural Model (1)** reasoning schemes

|          | Backward<br>Reasoning        | Forward<br>Reasoning        |
|----------|------------------------------|-----------------------------|
| Setting  | Specialized                  | Intuitive<br>(ifthen rules) |
| Behavior | Logic                        | Complex<br>(erratic)        |
| Results  | Efficient find of 1 solution | Exhaustive search           |



## **Procedural Model (2)**

### rule & illustration





## **Procedural Model (3)** Hierarchical Graph Editor

| ANGLE V | Ajout Edition Propriétés du noeud   Libelle Other cases Form   Form ELLIPSE Color   Actions Image: Color Actions   Historiques Historiques Historiques   Historiques #Noeud:untitled(1)->Age test *Noeud:untitled(1)->Age test   *Noeud:untitled(2)-Scollege ~Noeud:untitled(2)-Scollege ~Noeud:untitled(2)-Scollege   *Noeud:High School High School moved High School moved   High School moved High School moved High School moved   High School moved High School moved High School moved   High School moved High School moved High School moved   High School moved High School moved High School moved   High School moved High School moved High School moved   High School moved High School moved High School moved   High School moved High School moved High School moved   High School moved High School moved High School moved   High School moved High School moved High School moved |
|---------|---|



## **Procedural Model (4)**

## knowledge management

|                       | sp { propose*enfant-mineur                                   | sp { apply*enfant-mineur                            |
|-----------------------|--|---|
| RULE child            | (state <s> ^io.input-link <il> -^enfant-mineur)</il></s>     | (state <s> ^operator.name <b>enfant-mineur</b>)</s> |
| <b>PRE</b> test-age   | ( <s> ^test-age oui)</s>                                     | >   |
| <b>IN</b> age < 18    | ( <il> ^enfant.age &lt; 18)</il>                             | ( <s> <b>^majeur-non</b> oui)</s>                   |
| THEN                  | >  | }   |
| <b>POST</b> child     | ( <s> ^operator <o> + = )</o></s>                            |   |
|                       | ( <o> ^name enfant-mineur)</o>                               | sp { apply*enfant-majeur                            |
| END                   | }  | (state <s> ^operator.name <b>enfant-majeur</b>)</s> |
|                       |  | >   |
| RULE adult Lex & Y    | sp { propose*enfant-majeur                                   | ( <s> <b>^majeur-oui</b> oui)</s>                   |
| PRE test-age compilat | ion (state <s> ^io.input-link <il> -^enfant-majeur)</il></s> | }   |
| <b>IN</b> age >= 18   | ( <s> <b>^test-age oui</b>)</s>                              |   |
| THFN                  | ( <il> ^enfant.age &gt;= 18)</il>                            | Cadral uses   |
|                       | >  | the Soar architecture                               |
| rosi adult            | ( <s> ^operator <o> + = )</o></s>                            | for Knowledge-based                                 |
| END                   | ( <o> ^name enfant-majeur)</o>                               | systems   |
|                       | }  |   |



## **Procedural Model (5)**

effective compilation





# Implementation (1)

Cadral core API

#### **Generic Java API used to define concepts**

- engines: for learning, data interpretation, resolution
- datasets: working memory data with operational contexts
- data encoders/decoders: depends on engines and datasets

#### **Cadral Core integrates proven reasoning technologies**

- Soar: general cognitive architecture library http://sitemaker.umich.edu/soar
- Encog: neural network library http://www.heatonresearch.com/encog
- Weka: machine learning library http://www.cs.waikato.ac.nz/~ml/weka/



# **Implementation (2)**

engines' integration







# **Experiments (1)**

## **Business pre-processing**

#### Goal: Cadral Core for automatic recognition of Benefit Claims' complexity

- Selection of a classification engine (J48 in Weka: decision tree with pruning)
- Building a pertinent dataset
  - Choice of pertinent criteria (children age, family situation...)
  - Extract & encode data from CNPF database
  - Tag problematic claims with the help of operational/maintenance team
- Train the classification engine on the dataset
- Result: classification of the claims according to their complexity before their processing

#### **Limits & perspectives**

- Available: a binary, rigid classification
- Needs: clustering for automatic determination of profiles according to specificities of datasets

#### **Interesting points**

- Business knowledge essential for initialisation with right criteria and datasets
- Business knowledge essential to interpret results: decision support helps the business but does not replace it



## Experiments (2) monitoring software engineering

#### Sonar: open platform to manage code quality

<u>http://www.sonarsource.org/</u>

#### Goal: using Cadral Core to discover quality similarities between CRP-GL projects and major open source projects

- Data extraction and learning from demo Sonar instance -> X clusters <u>http://nemo.sonarsource.org/</u>
- Data extraction from CRP-GL Sonar instance and trying to link projects to clusters
- Use weka clustering (in progress)

#### **Interesting points**

- Metrics selection (ex: is 'number of line code' useful/pertinent?)
- Clusters discovery (are clusters significant?)