#### FBK PDI Activity Report

Report period: June 2016 - January 2017

#### PDI Work Package involvement

■ WP1 - Foundations of organizational modeling

WP2 - Management of event logs

WP3 - Hybrid monitoring

WP4 - Inference of accurate predictions

WP5 - Case studies



Management of event logs (M1 - M24)

### WP2 objective (from DoW)

Development of a comprehensive conceptual framework for the **extraction of** (possibly incomplete) **multi-dimensional event logs** from the legacy data sources of an organization.

## Tasks: PDI current focus

- **T2.1** Definition of a language for the end-user modeling of log mappings. [D2.1, M6]
- T2.2 Development of a combined framework for event log extraction by enriching OBDA with log mappings. [D2.1, M6; D2.2, M18]
- **T2.3** Management of incomplete logs. [D2.2, M18]
- T2.4 Development of an architectural extension of the ProM OS backbone towards KOS. [D2.3, M24]

#### T2.3 incomplete logs: problems



### Incomplete logs: approaches

#### Abduction-based (ECAI '16, AI\*IA '16);

Planning-based.

### Incomplete logs: abduction

An abductive logic program is a triple (KB, A, IC) where:

- □ KB is a static knowledge base;
- A is a special set of predicates, called abducibles;
- IC is a set of integrity constraints.

Given a goal G, the abductive reasoning looks for  $\Delta \subseteq A$  such that:

#### $\mathsf{KB} \ \mathsf{U} \ \Delta \vDash \mathsf{G} \ \mathsf{U} \ \mathsf{IC}$

The set  $\Delta$  is referred as the abductive explanation.

### Incomplete logs: abduction

#### $\mathsf{KB} \ \mathsf{U} \ \Delta \vDash \mathsf{G} \ \mathsf{U} \ \mathsf{IC}$

- $\Box \quad \text{Process model} \Rightarrow \text{IC}$
- $\Box \quad \text{Partial trace} \Rightarrow \text{KB}$
- $\Box \quad \mathsf{G} \Rightarrow \varnothing$
- $\Box \quad \Delta \Rightarrow \text{trace completion}$

The (first-order logic based) framework is expressive enough to take into account **data** (currently: time).

# Incomplete logs: planning

An action language defines a dynamic domain D by means of:

- Fluents;
- actions;
- rules;

A planning problem is a triple:

- dynamic domain D;
- initial state;
- goal, i.e., the final state.

The solution is a sequence of actions from initial to final state.

## Incomplete logs: planning

- $\Box Fluents \Rightarrow process states;$
- $\Box$  actions  $\Rightarrow$  process activities;
- $\Box$  rules  $\Rightarrow$  workflow + **partial trace**;
- initial state  $\Rightarrow$  process initial state;
- $\Box$  final state  $\Rightarrow$  process final state.

Data (variables) can be encoded as process states.

### The role of data

Events in the trace can carry a complex payload.

We need an **expressive** and **intuitive** data-aware process model.



#### Relational-AWare SYStems





Hybrid Monitoring (M12 - M36)

### WP3 objective (from DoW)

Definition and development of mechanisms for the **hybrid monitoring** (combining symbolic and statistical) of processes.

# Tasks: PDI current focus

- **T3.1** Definition of a framework to combine symbolic and statistical approaches for process monitoring. [D3.1, M24]
- **T3.2** Analysis and tuning of existing machine learning techniques for hybrid monitoring approaches. [D3.2, M30]
- **T3.3** Extracting symbolic representations of properties from data. [D3.3, M36]
- **T3.4** Concept drift detection. [D3.3, M36

#### T3.3: Spaghetti-like proc models



#### Declarative process discovery



### What is already there?



#### Declare Miner



#### A new approach

#### Faster Miner (EDOC'16)



## Apriori Algorithm

#### $\boldsymbol{\mathcal{L}}$ on $\boldsymbol{\Sigma}$



Frequent activity sets  $A_1, A_2, ..., A_n \subseteq \Sigma^*$  $A_k = \{a, b\}$ 

- Support: percentage of traces containing the set of activities
- □ Frequent Activity Set → high support (> supp\_threshold)

# Sequence Analysis

#### Frequent activity set instantiated on a Declare template

Response
X • · · · Y
(a,b)
(b,a)
(a,c)
(d,a)
(a,j)
(j,a)

. . .



# Frequently satisfied constraints



- An algorithm for each Declare template
- Further optimizations: Pruning and Multithreading



- Deliverable format and submission
- ProM plugin for log incompleteness

#### References

- [ECAI'16] Chesani, De Masellis, Di Francescomarino, Ghidini, Mello, Montali, Tessaris: Abducing Workflow Traces: A General Framework to Manage Incompleteness in Business Processes. ECAI 2016: 1734-1735
- [AI\*IA'16] Chesani, De Masellis, Di Francescomarino, Ghidini, Mello, Montali, Tessaris: Abducing Compliance of Incomplete Event Logs. AI\*IA 2016: 208-222
- [CILC'16] Chesani, De Masellis, Di Francescomarino, Ghidini, Mello, Montali, Tessaris: AbducingWorkflow Traces: a General Framework to Manage Incompleteness in Business Processes, CILC2016

#### References

- [AAAI'17] De Masellis, Di Francescomarino, Ghidini, Montali, Tessaris. Add Data into Business Process Verification: bridging the gap between theory and practice. Conference on Artificial Intelligence, AAAI 2017, (to appear).
- [EDOC'16] Kala, Maggi, Di Ciccio, Di Francescomarino: Apriori and Sequence Analysis for Discovering Declarative Process Models. EDOC 2016: 1-9