# Temporal Description Logic for Ontology-Based Data Access

## **Alessandro Artale**

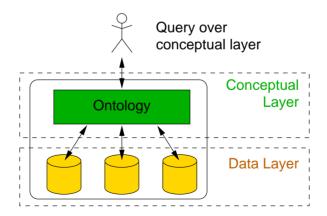
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joint work with

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#### Desiderata:

- Hide to the user where and how data are stored
- Present to the user a *conceptual view* of the data
- Query the data sources through the conceptual model



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• Certain Answers:

$$\mathsf{cert}_{\mathcal{T},\mathcal{A}}(q) = \{a \mid \mathcal{T} \cup \mathcal{A} \models q(a)\}$$

In this case

$$\mathsf{cert}_{\mathcal{T},\mathcal{A}}(q) = \{\mathsf{sue},\mathsf{peter}\}.$$

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• To support querying temporal data, the ontology  $\mathcal{T}$  should model temporal conceptual knowledge as well:

 $\diamond_P \exists$ diagnose.heartdisease  $\sqsubseteq$  atrisk

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• For  $q = \operatorname{atrisk}(x, 2013)$  we obtain

$$\mathsf{cert}_{\mathcal{T},\mathcal{A}}(q) = \{\mathsf{peter},\mathsf{sue}\}$$

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- Queries at least two sorted conjunctive queries with variables for individuals and timepoints, and expressions t < t', A(x,t), P(x,y,t).
- Every such query should be SQL/FO-rewritable (with linear-order < available).</li>

#### The Ontology Language: TQL

TQL contains OWL 2 QL, where OWL 2 QL ontologies consist of inclusions

 $B_1 \sqcap B_2 \sqsubseteq \bot, \quad B_1 \sqsubseteq B_2, \quad R_1 \sqsubseteq R_2$ 

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with

$$R_i ::= \perp | P | P^-,$$

 $B_i ::= A \mid \exists R_i,$ 

and should be "maximal" FO-rewritable with:

- rigid concept and roles;
- persistent in the future concepts and roles;
- instantaneous concepts and roles;
- convex concepts and roles.
- etc.

## Syntax: OWL 2 QL extended by $\diamond_F$ and $\diamond_P$

TQL ontologies/TBox consist of inclusions

$$C \sqsubseteq B, \quad S \sqsubseteq R$$

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and C and S are defined by:

$\mathbf{C} ::= B$		$C_1 \sqcap C_2$	$\diamond_P C$		$\diamond_F C,$
${f S}$ ::= $R$		$S_1\sqcap S_2$	$\diamond_P S$	I	$\diamond_F S,$

Thus TQL has a Horn-like TBox with temporal operators only on the left-hand side.

## **TQL: Expressivity**

TQL can express the following temporal constraints:

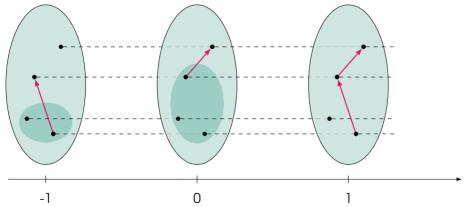
- person is rigid:  $\diamond_F \diamond_P$  person  $\sqsubseteq$  person;
- mother is **persistent**:  $\diamond_P$  mother  $\sqsubseteq$  mother;
- givesbirth is instantaneous: givesbirth  $\Box \diamond_P$  givesbirth  $\sqsubseteq \bot$ ;
- employed is **convex**:  $\diamond_P$  employed  $\Box \diamond_F$  employed  $\sqsubseteq$  employed.

#### **Semantics**

Temporal interpretations  $\mathcal{I}$  are given by  $(\mathbb{Z}, <)$  (time points) and standard (atemporal) interpretations

$$\mathcal{I}(n) = (\Delta^{\mathcal{I}}, \cdot^{\mathcal{I}(n)}),$$

for each  $n \in \mathbb{Z}$ . We assume constant domain and rigid interpretation of individuals. Thus, interpretations look as follows:

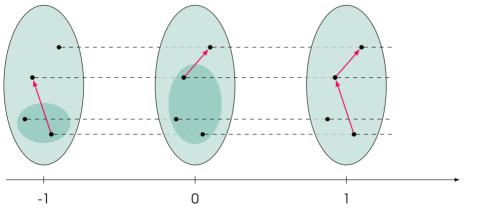


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 $(\diamondsuit_P C)^{\mathcal{I}(n)} = \{x \mid x \in C^{\mathcal{I}(m)}, \text{ for some } m < n\},$ 

 $(\diamondsuit_{\scriptscriptstyle F} C)^{\mathcal{I}(n)} = \{x \mid x \in C^{\mathcal{I}(m)}, ext{ for some } m > n\}.$ 

## Temporal SQL/FO-Rewritability

Consider again

• *A*:

 $atrisk(peter, 2013), \quad diagnose(sue, fibrillation, 1982), \quad heart disease(fibrillation)$ 

•  $\mathcal{T}$ :

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•  $\mathcal{T}$ :

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• Then  $q = \operatorname{atrisk}(x, 2013)$  can be rewritten into

 $q_{\mathcal{T}} = \operatorname{atrisk}(x, 2013) \lor \exists t' < 2013 . \exists y. \operatorname{diagnose}(x, y, t') \land \operatorname{heartdisease}(y, t')$ 

and

$$(\mathcal{T},\mathcal{A})\models q(a,2013) ext{ iff } \mathcal{A}\models q_{\mathcal{T}}(a,2013)$$

#### **Temporal Datalog**<sub>∃</sub> Formulation

Let

 $B = A \mid \exists R$ 

TBoxes consist of "datalog" rules of the form

 $B(x,t) \leftarrow \mathsf{Body}(x,\vec{t})$ 

where  $Body(x, \vec{t})$  is a conjunction of atoms of the form B'(x, t') and t' < t'' and

$$P(x,y,t) \gets \mathsf{Body}(x,y,\vec{t})$$

where  $Body(x, y, \vec{t})$  is a conjunction of atoms of the form B'(x, y, t') and t' < t''.

Note: Link between rules for unary and binary predicates only via  $\exists R$ .

#### **Main Result**

Queries are two-sorted conjunctive queries (CQs):

 $\exists \vec{y} \ \vec{t} \underbrace{\varphi(\vec{x}, \vec{y}, \vec{s}, \vec{t})}$ 

conjunction of atoms

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**Theorem.** Let  $q(\vec{x}, \vec{t})$ , be a CQ and  $\mathcal{T}$  a TQL ontology. Then one can construct a disjunction of CQs  $q_{\mathcal{T}}(\vec{x}, \vec{t})$  such that, for any  $\mathcal{A}$ , any  $\vec{a} \subseteq \operatorname{ind}(\mathcal{A})$ , and any  $\vec{n} \subseteq \operatorname{tem}(\mathcal{A})$ , we have

$$(\mathcal{T},\mathcal{A})\models q(ec{a},ec{n}) \quad ext{iff} \quad \mathcal{A}\models q_{\mathcal{T}}(ec{a},ec{n})$$

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- CQ answering for  $\{A \sqsubseteq \diamond_P B\}$  NP-hard—by reduction of 2 + 2-SAT.

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Parity problem: Given a binary string output 1 iff the number of 1s is even.

We reduce the Parity problem which is not computable in  $AC^0$  (Furst,Saxe and Sipser, 1984) to query answering in TQL TBox with  $\bigcirc_F$ .

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**TBox** 

$$\mathcal{T} = \{C_1 \sqcap \bigcirc_F C_{even} \sqsubseteq C_{odd}, \ C_1 \sqcap \bigcirc_F C_{odd} \sqsubseteq C_{even}$$
$$C_0 \sqcap \bigcirc_F C_{even} \sqsubseteq C_{even}, \ C_0 \sqcap \bigcirc_F C_{odd} \sqsubseteq C_{odd}\}$$

ABox. Encodes the binary strings and terminates with  $C_{even}(a, n + 1)$ . E.g., the binary string w = 01001 is encoded as:

$$\mathcal{A}_w = \{C_0(a,0), C_1(a,1), C_0(a,2), C_0(a,3), C_1(a,4), C_{\text{even}}(a,5)\}$$

 $(\mathcal{T},\mathcal{A}_w)\models C_{\mathit{even}}(a,0)$  iff w has an even number of 1's

#### **Extensions with NEXT and Automata**

We can construct a Non-Deterministic Finite Automata (NFA) to compute query answers. E.g., the automaton  $\mathfrak{A}_{\mathcal{T}}$  for the parity TBox starting at t = n is:

$$C_0(a,t-1)$$
  $C_1(a,t-1)$   $O \supset C_0(a,t-1)$ 

 $\mathfrak{A}_{\mathcal{T}}$  accepts  $\mathcal{A}$  iff  $(\mathcal{T},\mathcal{A})\models C_{even}(a,0).$ 

- Upper Bound. The problem whether an automata accepts a word is tractable: it belongs to complexity class  $NC^1$  (contained in LogSpace).
- Future Work. The automata encoding without roles is obvious: We intend to extend it to languages with roles.

## **Future Work**

- Investigate efficient rewritings, implementation.
- Consider datalog-rewritability: then NEXT-operator should be ok.
- The TQL languages with  $\bigcirc_F$  seems to be still FO-rewritable with arithmetic predicates, e.i.,  $TQL_{core,\bigcirc_F}$  is conjectured to be in  $FO(+, \times)$ .