

CKR: a general framework for context in Semantic Web

(Theory, prototype and extension to ASP)

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Vrije Universiteit Amsterdam,
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Outline

- 1 Introduction: context in Semantic Web and Linked Open Data
- 2 Contextualized Knowledge Repository (CKR)
- 3 Materialization calculus for CKR
- 4 CKR Prototype implementation
- 5 Current directions

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Introduction and motivation

Need for context in Semantic Web

- Most of Semantic Web data holds in specific **contextual space** (time, location, topic...)
 - **No explicit support** for modelling and reasoning with context sensitive knowledge in SW
(Often handcrafted in implementation)
- Need for well-defined theory of contexts

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Contextualized Knowledge Repository (CKR)

- DL based framework for representation and reasoning with contextual knowledge in the Semantic Web
- **Contextual theory:** based on formal AI theories of context
[McCarthy, 1993, Lenat, 1998, Ghidini and Giunchiglia, 2001]

Other DL contextual frameworks:

[Bao et al., 2010, Klarman and Gutiérrez-Basulto, 2011, Straccia et al., 2010].

Contextual modelling needs

A study on typical use of context in SW lead us to the definition of a set of **representation requirements**:

Requirements

- Statement contextualization: associate context to facts
- Symbols locality: local meaning for symbols
- Cross-context TBox statements: knowledge relations across contexts
- Complex contextualization: more than one contextual values to facts
- Modularity: separation of knowledge in independent modules
- Unified reasoning and query: inference and query use context structure
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→ Definition of “contextual primitives” of CKR

(e.g. cross-context statements → *eval* operator,
complex contextualization → c.classes and modules . . .)

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The **structure of a CKR** is composed by 2 layers:

Global context

- **Metaknowledge:** structure of contexts, context classes, relations, modules and attributes
- **(Global) object knowledge:**
object knowledge shared by all contexts

(Local) contexts

- **Object knowledge with references:**
local object knowledge with references to value of predicates in other contexts
- Knowledge distributed across different **modules**

Restriction of \mathcal{SROIQ} to the syntax of OWL-RL axioms:

- Left-side concept C :

$$C := A \mid \{a\} \mid C_1 \sqcap C_2 \mid C_1 \sqcup C_2 \mid \exists R.C_1 \mid \exists R.\{a\} \mid \exists R.\top$$

- Right-side concept D :

$$D := A \mid D_1 \sqcap D_2 \mid \neg C_1 \mid \forall R.D_1 \mid \exists R.\{a\} \mid \leq n R.C_1 \mid \leq n R.\top$$

with $n \in \{0, 1\}$

- Both-side concept E :

$$E := A \mid E_1 \sqcap E_2 \mid \exists R.\{a\}$$

- TBox axioms: $C \sqsubseteq D, \quad E \equiv E$
- ABox axioms: $D(a), \quad R(a, b)$

Metalanguage \mathcal{L}_Γ

Metavocabulary: $\Gamma = \text{NC}_\Gamma \uplus \text{NR}_\Gamma \uplus \text{NI}_\Gamma$

- **N** $\subseteq \text{NI}_\Gamma$: context names
- **M** $\subseteq \text{NI}_\Gamma$: module names
- **C** $\subseteq \text{NC}_\Gamma$: context classes, including class Ctx
- **R** $\subseteq \text{NR}_\Gamma$: contextual relations
- **A** $\subseteq \text{NR}_\Gamma$: contextual attributes
- For $A \in \mathbf{A}$, a set $D_A \subseteq \text{NI}_\Gamma$ of attribute values of A

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Metalanguage \mathcal{L}_Γ : \mathcal{SROIQ} -RL axioms over context expressions:

$$C := B \mid \{c\} \mid C_1 \sqcap C_2 \mid C_1 \sqcup C_2 \mid \exists R.C_1 \mid \exists R.\{c\} \mid \exists R.T \mid \exists A.\{d_A\} \mid \exists \text{mod.}\{m\}$$

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Individual variable this: $c \in \mathbf{N} \cup \{\text{this}\}$

Object language \mathcal{L}_Σ

Object vocabulary: any DL vocabulary $\Sigma = \text{NC}_\Sigma \uplus \text{NR}_\Sigma \uplus \text{NI}_\Sigma$

Eval expression

Given X an object expression in Σ and C a context expression in Γ

$\text{eval}(X, C)$

“The interpretation of X in all the contexts of type C ”

Left-side only: “imports” meaning of X from all of the contexts in C

Object language \mathcal{L}_Σ : \mathcal{SROIQ} -RL axioms over object expressions

Object language with references \mathcal{L}_Σ^e : extension with eval expressions

Contextualized Knowledge Repository

Contextualized Knowledge Repository:

$$\mathfrak{K} = \langle \mathfrak{G}, \{K_m\}_{m \in M} \rangle$$

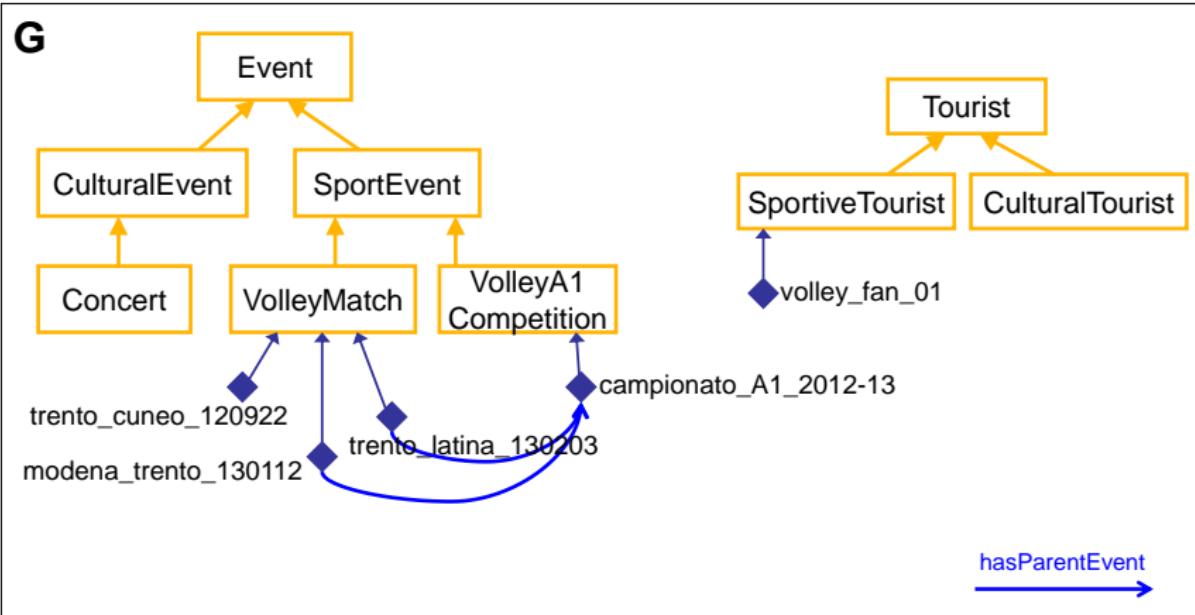
- \mathfrak{G} is a KB over $\Gamma \cup \Sigma$, containing metalanguage axioms in \mathcal{L}_Γ or global object axioms in \mathcal{L}_Σ
- for every module name $m \in M$,
 K_m is a KB over Σ , containing object axioms with references in \mathcal{L}_Σ^e

Tourism example:

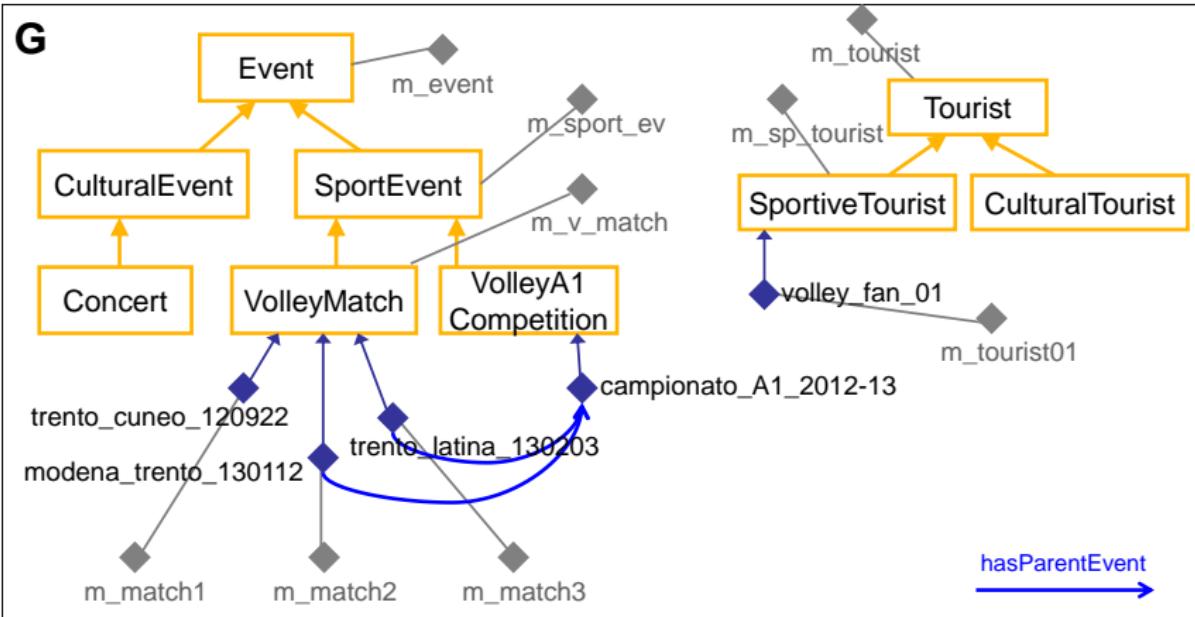
- Idea: Tourism recommendation for events in Trentino
 - Structure of contexts represent **events** and **tourists** information
- Task: find interesting events on the base of tourists' preferences

We model this domain in a CKR $\mathfrak{K}_{tour} = \langle \mathfrak{G}, \{K_m\}_{m \in M} \rangle$

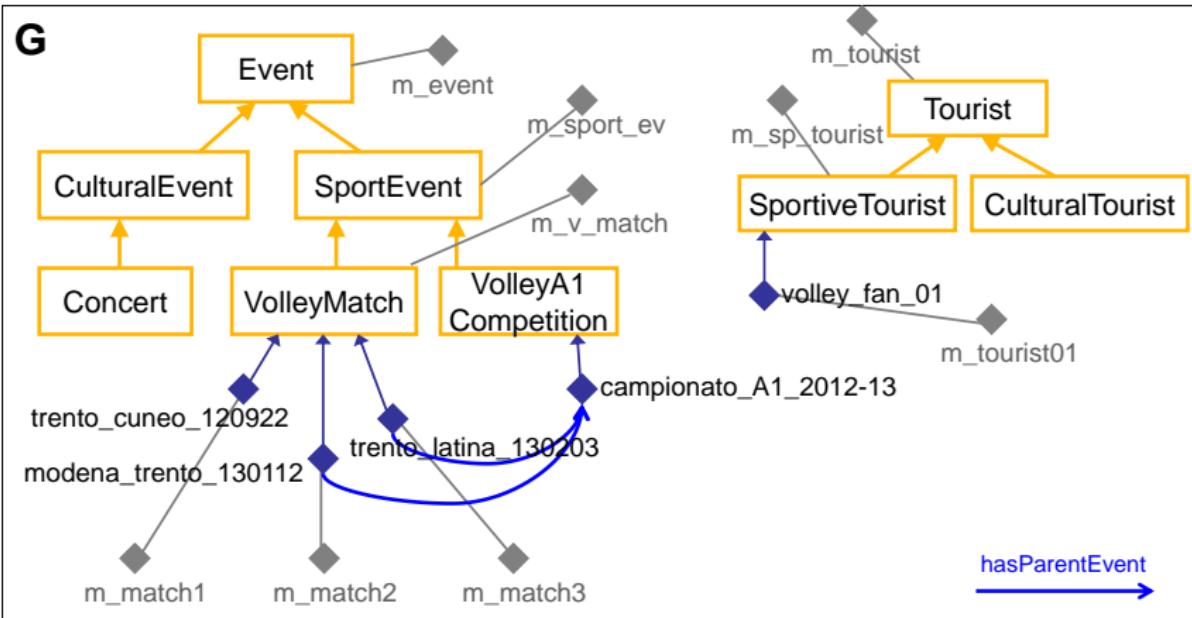
Tourism example: CKR structure



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Tourism example: some modules contents

In K_{v_match} : $HomeTeam \sqsubseteq Team$ $HostTeam \sqsubseteq Team$
 $Winner \sqsubseteq Team$ $Loser \sqsubseteq Team$

In K_{match2} : $HomeTeam(casa_modena_volley)$ $HostTeam(itas_trentino_volley)$
 $Winner(casa_modena_volley)$ $Loser(itas_trentino_volley)$

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 $Winner \sqsubseteq Team$ $Loser \sqsubseteq Team$

In K_{match2} : $HomeTeam(casa_modena_volley) \quad HostTeam(itas_trentino_volley)$
 $Winner(casa_modena_volley) \quad Loser(itas_trentino_volley)$

...

In K_{sport_ev} : “Winners of major volley matches are top teams”

$eval(Winner, VolleyMatch \sqcap \exists hasParentEvent.VolleyA1Competition) \sqsubseteq TopTeam$

In $K_{sp_tourist}$: “Top teams are preferred teams”

$eval(TopTeam, SportEvent) \sqsubseteq PreferredTeam$

CKR Model: given $\mathfrak{K} = \langle \mathfrak{G}, \{K_m\}_{m \in M} \rangle$, a CKR model is a structure:

$$\mathfrak{I} = \langle \mathcal{M}, \mathcal{I} \rangle$$

1. Global interpretation: $\mathcal{M} = \langle \Delta_{\mathcal{M}}, \cdot^{\mathcal{M}} \rangle$ a DL interpretation over $\Gamma \cup \Sigma$

- \mathcal{M} respects interpretation of metalanguage elements
(e.g. $\mathbf{N}^{\mathcal{M}} \subseteq \text{Ctx}^{\mathcal{M}}$ and $\mathbf{C}^{\mathcal{M}} \subseteq \text{Ctx}^{\mathcal{M}}$)
- For every $\alpha \in \mathfrak{G}$, $\mathcal{M} \models \alpha$

Given $c \in \text{Ctx}^{\mathcal{M}}$, let:

$$K(c) = \bigcup \{K_m \mid (c, m^{\mathcal{M}}) \in \text{mod}^{\mathcal{M}}\}$$

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2. Local interpretations: $\mathcal{I}(c) = \langle \Delta_c, \cdot^{\mathcal{I}(c)} \rangle$, for $c \in \text{Ctx}^M$, is a DL interpretation over Σ

- $\mathcal{I}(c), [\text{this}/c] \models \alpha$, for every α axiom of $K(c)$.

3. Propagation of global knowledge:

- $\Delta_c \subseteq \Delta_M$;
- for every $a \in \text{NI}_\Sigma$, $a^{\mathcal{I}(c)} = a^M$.
- for $\alpha \in \mathfrak{G}$ with $\alpha \in \mathcal{L}_\Sigma$, $\mathcal{I}(c) \models \alpha$.

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4. Interpretation of *eval* expressions: given $c \in \text{Ctx}^M$ and

- X a concept or role expression
- C a context expression

$$\text{eval}(X, C)^{\mathcal{I}(c), [\text{this}/c]} = \bigcup_{e \in C^{M, [\text{this}/c]}} X^{\mathcal{I}(e)}$$

“The union of elements of X in the contexts in C ”

Definition (c-entailment)

Given \mathfrak{K} over $\langle \Gamma, \Sigma \rangle$ with $c \in \mathbf{N}$ and an axiom $\alpha \in \mathcal{L}_\Sigma^e$,

α is c-entailed by \mathfrak{K} ($\mathfrak{K} \models c : \alpha$)

if for every model $\mathfrak{I} = \langle \mathcal{M}, \mathcal{I} \rangle$ of \mathfrak{K} , we have $\mathcal{I}(c^\mathcal{M}), [\text{this}/c^\mathcal{M}] \models \alpha$.

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Definition (global entailment)

Given \mathfrak{K} over $\langle \Gamma, \Sigma \rangle$ and an axiom α ,

α is (globally) entailed by \mathfrak{K} ($\mathfrak{K} \models \alpha$) if:

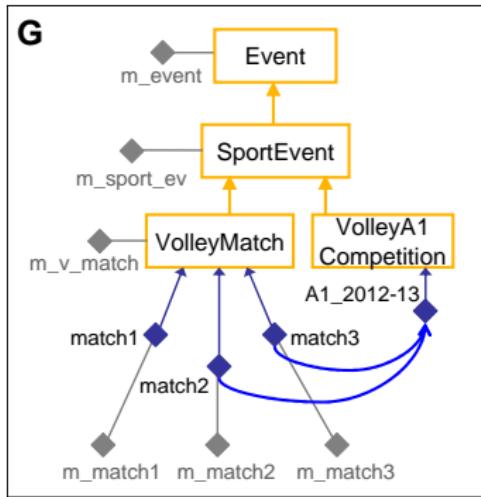
- $\alpha \in \mathcal{L}_\Sigma^e$ and for every $c \in \mathbf{N}$ and model $\mathfrak{I} = \langle \mathcal{M}, \mathcal{I} \rangle$ of \mathfrak{K} , $\mathcal{I}(c^\mathcal{M}), [\text{this}/c^\mathcal{M}] \models \alpha$.
- $\alpha \in \mathcal{L}_\Gamma$ and for every model $\mathfrak{I} = \langle \mathcal{M}, \mathcal{I} \rangle$ of \mathfrak{K} , $\mathcal{M} \models \alpha$.

Tourism example: semantics

Suppose we have $\mathfrak{I} = \langle \mathcal{M}, \mathcal{I} \rangle$ s.t. $\mathfrak{I} \models \kappa_{tour}$.

For each match $matchN$, its KB is:

$$K(matchN^{\mathcal{M}}) = K_{event} \cup K_{sport_ev} \cup K_{v_match} \cup K_{matchN}$$



K_{match1} Winner(bre_banca_cuneo_volley) ...

K_{match2} Winner(casa_modena_volley) ...

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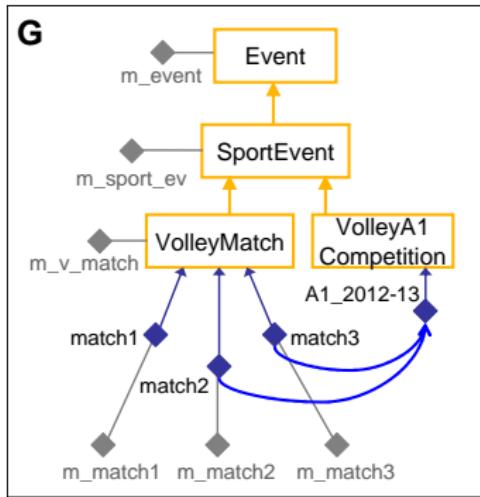
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VolleyMatch \sqcap

$\exists hasParentEvent.VolleyA1Competition = TopMatch$

$eval(Winner, TopMatch) \sqsubseteq TopTeam \in K_{sport_ev}$



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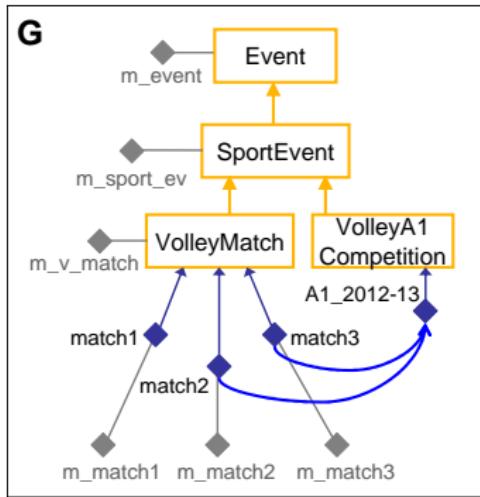
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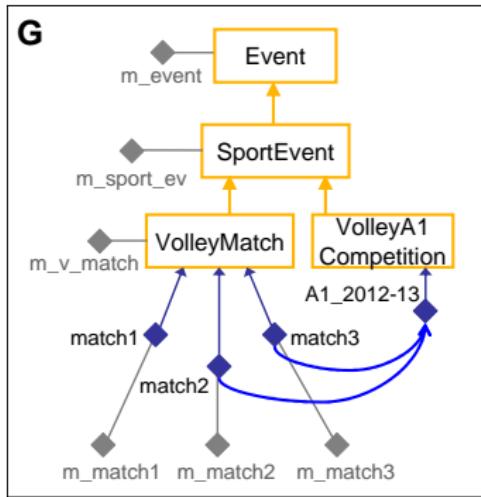
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$$\bigcup_{e \in TopMatch^{\mathcal{M}}} Winner^{\mathcal{I}(e)} \subseteq TopTeam^{\mathcal{I}(matchN)}$$



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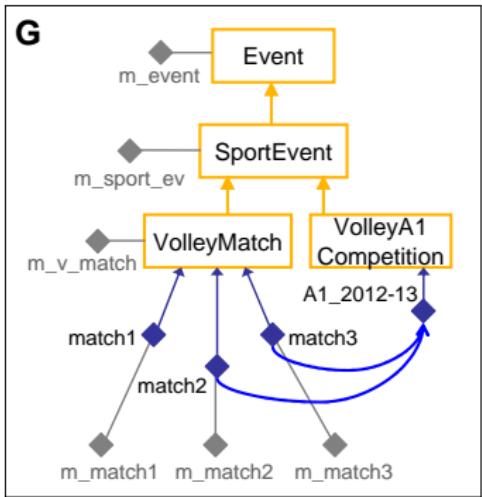
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$$\bigcup_{e \in \{match_2, match_3\}} Winner^{\mathcal{I}(e)} \subseteq TopTeam^{\mathcal{I}(matchN)}$$



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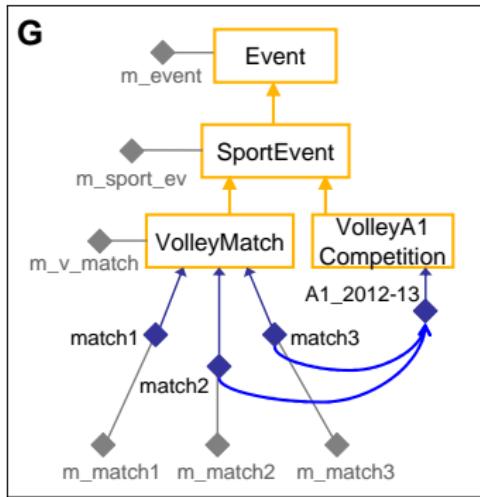
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$\{itas_trentino, casa_modena\} \subseteq TopTeam^{\mathcal{I}(matchN)}$



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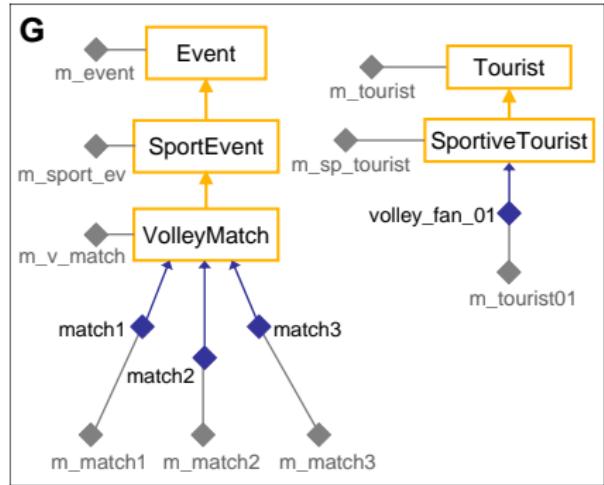
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Tourism example: semantics

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For the context of **volley_fan**:

$$K(\text{volley_fan}^{\mathcal{M}}) = K_{\text{tourist}} \cup K_{\text{sp_tourist}} \cup K_{\text{tourist01}}$$



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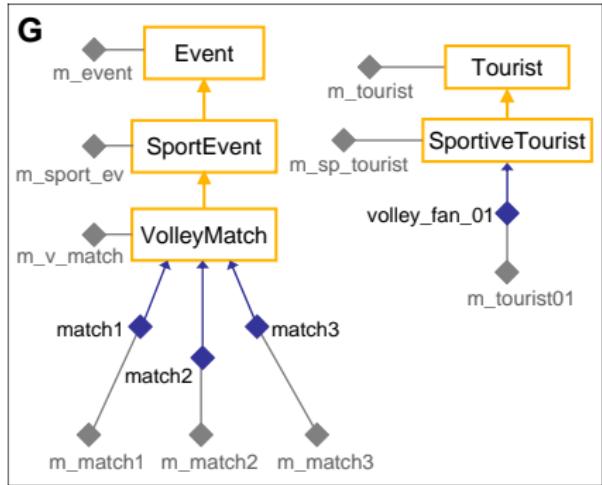
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 $\in \mathbf{K}_{\text{sp_tourist}}$



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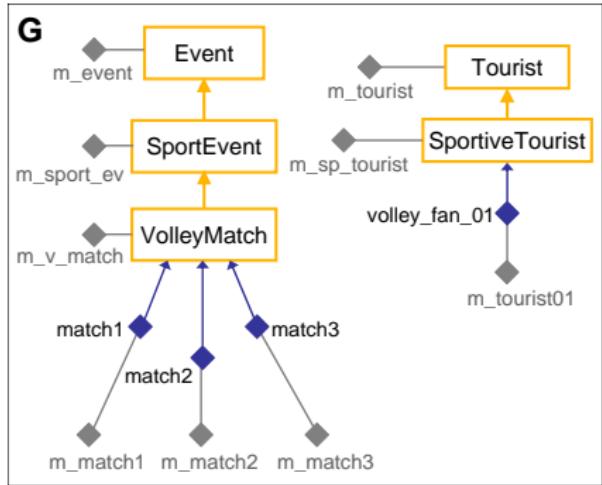
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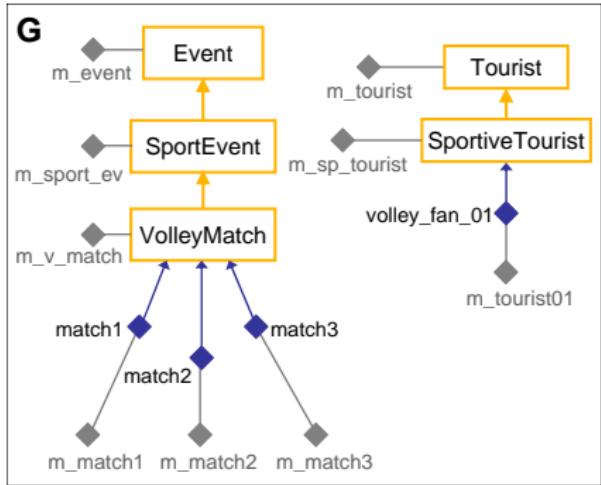
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$$\begin{aligned} & \bigcup_{e \in \text{SportEvent}^{\mathcal{M}}} \text{TopTeam}^{\mathcal{I}(e)} \\ & \subseteq \text{PreferredTeam}^{\mathcal{I}(\text{volley_fan})} \end{aligned}$$



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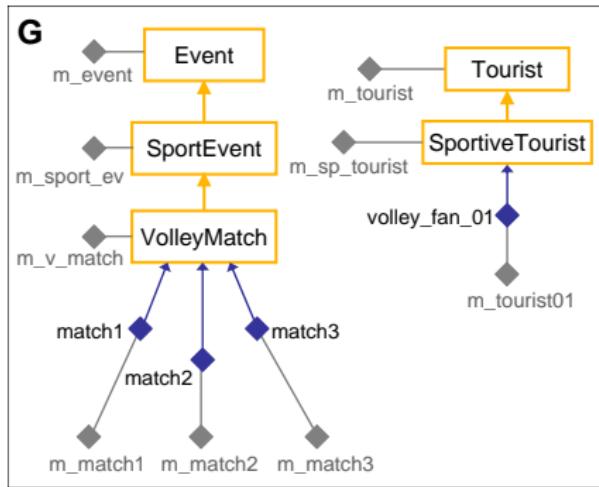
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$$\bigcup_{e \in \{\text{match_1, match_2, match_3}\}} TopTeam^{\mathcal{I}(e)} \subseteq PreferredTeam^{\mathcal{I}(\text{volley_fan})}$$



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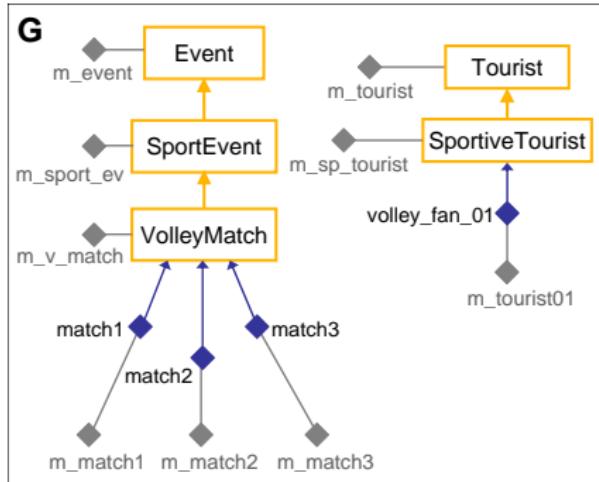
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- 4 CKR Prototype implementation
- 5 Current directions

Materialization calculus K_{ic}

Materialization calculus K_{ic} :

- Calculus for **instance checking** in \mathcal{SROIQ} -RL CKR
- Extension to the CKR structure of **materialization calculus for \mathcal{SROEL}** of [Krötzsch, 2010]
- Formalizes the operation of **forward closure** in implementation

Idea

Composed by 3 sets of rules:

- Input rules I : translation of DL axioms to Datalog atoms
- Deduction rules P : forward inference rules
- Output rules O : translation for DL proved axiom

Normal form

Current version of K_{ic} works on:

- restriction of \mathcal{SROIQ} -RL to \mathcal{SROEL} constructs
- closed CKRs (no this)

Normal form for axioms

$\mathcal{L}_\Gamma, \mathcal{L}_\Sigma :$	$A(a)$	$R(a, b)$	$A \sqsubseteq B$	$\{a\} \sqsubseteq B$
	$A \sqcap B \sqsubseteq C$	$\exists R.A \sqsubseteq B$	$R \sqsubseteq T$	$R \circ S \sqsubseteq T$
$\mathcal{L}_\Gamma :$	$C \sqsubseteq \exists \text{mod.}\{m\}$	$C \sqsubseteq \exists A.\{d_A\}$		
	$\{a\} \sqsubseteq \exists \text{mod.}\{m\}$	$\{a\} \sqsubseteq \exists A.\{d_A\}$		
$\mathcal{L}_\Sigma^e :$		$\text{eval}(A, C) \sqsubseteq B$	$\text{eval}(R, C) \sqsubseteq T$	

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$\mathcal{L}_\Sigma^e :$		$\text{eval}(A, C) \sqsubseteq B$	$\text{eval}(R, C) \sqsubseteq T$	

Normal form property

For every closed \mathfrak{K} , a \mathfrak{K}' can be computed such that \mathfrak{K}' is in normal form and, for all α using symbols from \mathfrak{K} , it holds $\mathfrak{K} \models \alpha$ iff $\mathfrak{K}' \models \alpha$.

Calculus definition

Basic definitions

Given the set of constants \mathbf{C} , variables \mathbf{V} and predicates \mathbf{P}

Term: $t \in \mathbf{C} \cup \mathbf{V}$

Ground substitution: $\sigma : \mathbf{V} \rightarrow \mathbf{C}$

Datalog atom: $p(t_1, \dots, t_n) \quad p \in \mathbf{P}, t_i \text{ terms}$

Datalog rule: $B_1, \dots, B_m \rightarrow H \quad B_i, H \text{ atoms}$

Fact: $\rightarrow H \quad H \text{ ground atom}$

Program: $P \quad P \text{ finite set of rules}$

Proof tree

A **proof tree** for P is a structure $\langle N, E, \lambda \rangle$:

- $\langle N, E \rangle$ is a finite directed tree
- λ is a labelling function
- for each node $v \in N$,
there exists a rule $B_1, \dots, B_m \rightarrow H \in P$
and a ground substitution σ s.t.
 - $\lambda(v) = \sigma(H)$;
 - $\lambda(w_i) = \sigma(B_i)$, with w_i child of v .

Consequence: $P \models H$ if there is a proof tree with root r and $\lambda(r) = H$

Closure: $\text{Clos}(P) = \{H \mid H \text{ ground and } P \models H\}$

Calculus definition

Materialization calculus K_{ic} is composed by:

- input translations: $I_{glob}, I_{loc}, I_{el}$,
 - deduction rules: $P_{glob}, P_{loc}, P_{el}$,
 - output translation: O
-
- I and O are partial functions
 - P are sets of datalog rules
 - given α axiom or symbol, $c \in \mathbf{N}$,
 $I(\alpha, c)$ is undefined or a set of datalog facts
 - given α axiom, $c \in \mathbf{N}$,
 $O(\alpha, c)$ is undefined or a single datalog fact
 - all constant symbols in $I(\alpha, c)$ or $O(\alpha, c)$ are signature symbols appearing in or equal to α

Translation and deduction rules

EL translation rules $I_{el}(S, c)$

$$\begin{array}{ll} C(a) \mapsto \{\text{inst}(a, C, c)\} & R(a, b) \mapsto \{\text{triple}(a, R, b, c)\} \\ \{a\} \sqsubseteq C \mapsto \{\text{inst}(a, C, c)\} & A \sqsubseteq C \mapsto \{\text{subClass}(A, C, c)\} \\ A \sqcap B \sqsubseteq C \mapsto \{\text{subConj}(A, B, C, c)\} & \exists R. A \sqsubseteq C \mapsto \{\text{subEx}(R, A, C, c)\} \\ R \sqsubseteq T \mapsto \{\text{subRole}(R, T, c)\} & R \circ S \sqsubseteq T \mapsto \{\text{subRChain}(R, S, T, c)\} \end{array}$$

EL deduction rules P_{el}

$$\begin{array}{l} \text{subClass}(y, z, c), \text{inst}(x, y, c) \rightarrow \text{inst}(x, z, c) \\ \text{subConj}(y_1, y_2, z, c), \text{inst}(x, y_1, c), \text{inst}(x, y_2, c) \rightarrow \text{inst}(x, z, c) \\ \text{subEx}(v, y, z, c), \text{triple}(x, v, x', c), \text{inst}(x', y, c) \rightarrow \text{inst}(x, z, c) \\ \text{subRole}(v, w, c), \text{triple}(x, v, x', c) \rightarrow \text{triple}(x, w, x', c) \\ \text{subRChain}(u, v, w, c), \text{triple}(x, u, y, c), \text{triple}(y, v, z, c) \rightarrow \text{triple}(x, w, z, c) \end{array}$$

Output translation $O(\alpha, \mathbf{c})$

$$C(a) \mapsto \{\text{inst}(a, C, \mathbf{c})\} \quad R(a, b) \mapsto \{\text{triple}(a, R, b, \mathbf{c})\}$$

Translation and deduction rules

Global rules $I_{glob}(\mathfrak{G})$ and P_{glob}

$$\begin{array}{ll} C \sqsubseteq \exists \text{mod.}\{m\} \mapsto \{\text{hasMod}(C, m, gm)\} & C \in \mathbf{C} \mapsto \{\text{subClass}(C, Ctx, gm)\} \\ C \sqsubseteq \exists A.\{d\} \mapsto \{\text{hasAtt}(C, A, d, gm)\} & c \in \mathbf{N} \mapsto \{\text{inst}(c, Ctx, gm)\} \\ \{c\} \sqsubseteq \exists \text{mod.}\{m\} \mapsto \{\text{triple}(c, \text{mod}, m, gm)\} & \\ \{c\} \sqsubseteq \exists A.\{d\} \mapsto \{\text{triple}(c, A, d, gm)\} & \\ \text{hasMod}(c, m, gm), \text{inst}(x, c, gm) \rightarrow \text{triple}(x, \text{mod}, m, gm) & \\ \text{hasAtt}(c, a, d, gm), \text{inst}(x, c, gm) \rightarrow \text{triple}(x, a, d, gm) & \end{array}$$

Local rules $I_{loc}(S, c)$ and P_{loc}

$$\begin{array}{l} \text{eval}(A, C) \sqsubseteq B \mapsto \{\text{subEval}(A, C, B, c)\} \\ \text{eval}(R, C) \sqsubseteq T \mapsto \{\text{subEvalR}(R, C, T, c)\} \\ \\ \text{subEval}(a, c_1, b, c), \text{inst}(c', c_1, gm), \text{inst}(x, a, c') \rightarrow \text{inst}(x, b, c) \\ \text{subEvalR}(r, c_1, t, c), \text{inst}(c', c_1, gm), \text{triple}(x, r, y, c') \rightarrow \text{triple}(x, t, y, c) \end{array}$$

Deduction algorithm

Global program PG : $PG(\mathfrak{G}) = I_{glob}(\mathfrak{G}) \cup P_{glob}$

Deduction algorithm

Global program PG : $PG(\mathfrak{G}) = I_{glob}(\mathfrak{G}) \cup P_{glob}$

$$\mathbf{N}_{\mathfrak{G}} = \{\mathbf{c} \in \mathbf{C} \mid \text{inst}(\mathbf{c}, \text{Ctx}, \text{gm}) \in \text{Clos}(PG(\mathfrak{G}))\}$$

$$K_c = \bigcup \{K_m \mid \text{triple}(c, \text{mod}, m, \text{gm}) \in \text{Clos}(PG(\mathfrak{G}))\}$$

Local program PC : $PC(c) = P_{loc} \cup I_{loc}(K_c, c) \cup I_{el}(\mathfrak{G}_\Sigma, c)$

Deduction algorithm

Global program PG : $PG(\mathfrak{G}) = I_{glob}(\mathfrak{G}) \cup P_{glob}$

$$\begin{aligned}\mathbf{N}_{\mathfrak{G}} &= \{\mathbf{c} \in \mathbf{C} \mid \text{inst}(\mathbf{c}, \text{Ctx}, \text{gm}) \in \text{Clos}(PG(\mathfrak{G}))\} \\ K_c &= \bigcup \{K_m \mid \text{triple}(\mathbf{c}, \text{mod}, m, \text{gm}) \in \text{Clos}(PG(\mathfrak{G}))\}\end{aligned}$$

Local program PC : $PC(\mathbf{c}) = P_{loc} \cup I_{loc}(K_c, \mathbf{c}) \cup I_{el}(\mathfrak{G}_\Sigma, \mathbf{c})$

CKR program PK : $PK(\mathfrak{K}) = PG(\mathfrak{G}) \cup \bigcup_{\mathbf{c} \in \mathbf{N}_{\mathfrak{G}}} PC(\mathbf{c})$

Given $\alpha \in \mathcal{L}_\Sigma^e$ and a context $\mathbf{c} \in \mathbf{N}$,

$\mathfrak{K} \vdash \mathbf{c} : \alpha$ when $PK(\mathfrak{K})$ and $O(\alpha, \mathbf{c})$ defined and $PK(\mathfrak{K}) \models O(\alpha, \mathbf{c})$

Deduction algorithm

Global program PG : $PG(\mathfrak{G}) = I_{glob}(\mathfrak{G}) \cup P_{glob}$

$$\begin{aligned}\mathbf{N}_{\mathfrak{G}} &= \{c \in \mathbf{C} \mid \text{inst}(c, \text{Ctx}, \text{gm}) \in \text{Clos}(PG(\mathfrak{G}))\} \\ K_c &= \bigcup \{K_m \mid \text{triple}(c, \text{mod}, m, \text{gm}) \in \text{Clos}(PG(\mathfrak{G}))\}\end{aligned}$$

Local program PC : $PC(c) = P_{loc} \cup I_{loc}(K_c, c) \cup I_{el}(\mathfrak{G}_\Sigma, c)$

CKR program PK : $PK(\mathfrak{K}) = PG(\mathfrak{G}) \cup \bigcup_{c \in \mathbf{N}_{\mathfrak{G}}} PC(c)$

Given $\alpha \in \mathcal{L}_\Sigma^e$ and a context $c \in \mathbf{N}$,

$\mathfrak{K} \vdash c : \alpha$ when $PK(\mathfrak{K})$ and $O(\alpha, c)$ defined and $PK(\mathfrak{K}) \models O(\alpha, c)$

Basic algorithm

- Compute closure of \mathfrak{G}
- For every $c \in \mathbf{N}_{\mathfrak{G}}$, compute its associated K_c
- Compute closure of the set of K_c

Soundness and completeness

Theorem (Soundness)

Given $\mathfrak{K} = \langle \mathfrak{G}, \{K_m\}_{m \in M} \rangle$ a closed CKR in normal form, and an atomic assertion $\alpha \in \mathcal{L}_\Sigma$, $c \in \mathbf{N}$, $\mathfrak{K} \vdash c : \alpha$ implies $\mathfrak{K} \models c : \alpha$.

Theorem (Completeness)

Given $\mathfrak{K} = \langle \mathfrak{G}, \{K_m\}_{m \in M} \rangle$ a closed CKR in normal form, and an atomic assertion $\alpha \in \mathcal{L}_\Sigma$, $c \in \mathbf{N}$, $\mathfrak{K} \models c : \alpha$ implies $\mathfrak{K} \vdash c : \alpha$.

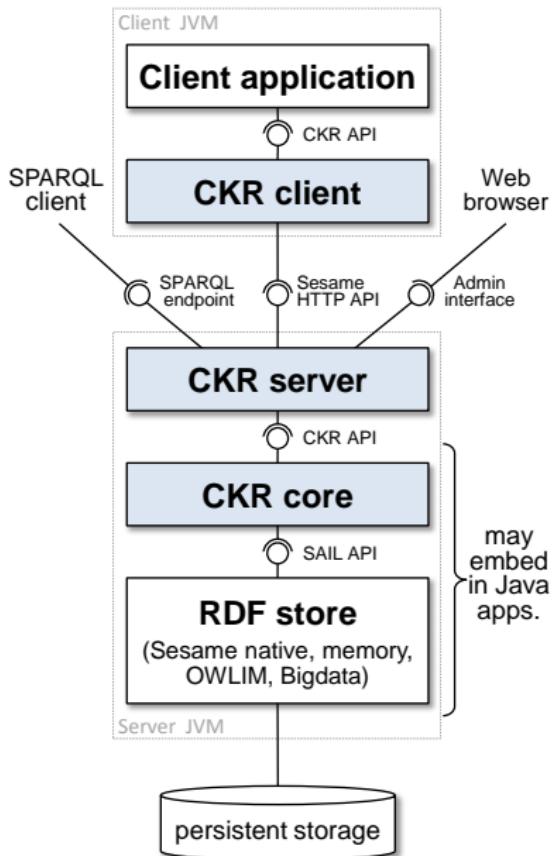
Outline

- 1 Introduction: context in Semantic Web and Linked Open Data
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CKR Prototype: introduction

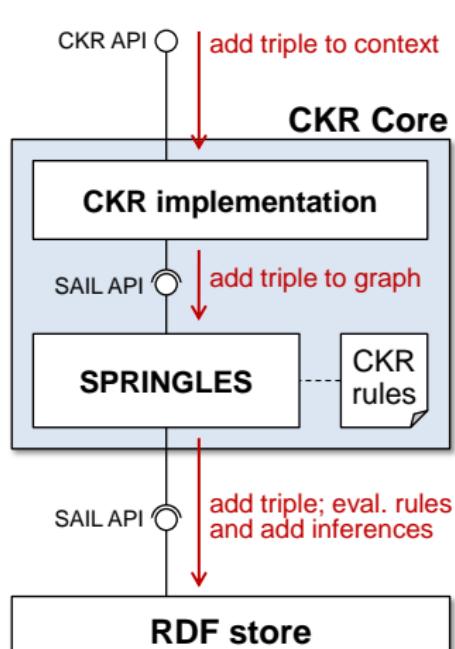
The prototype extends the Sesame Java framework with three modules:

- **CKR core** – CKR implementation on top of a Sesame RDF store
 - knowledge addition/removal
 - closure materialization
 - SPARQL 1.1 queries
 - transactions
- **CKR server** – extension of Sesame Server & Workbench
 - exposes CKR primitives
 - includes a SPARQL endpoint
 - includes an admin UI
- **CKR client** – library to access a CKR from a remote Java application



SPRINGLES

CKR Core is implemented on top of SPRINGLES: SParql-based Rule Inference over Named Graphs Layer Extending Sesame



SPRINGLES features:

- transparent/on-demand closure materialization based on rules
- rules encoded as SPARQL queries addressing Named Graphs (NG)
- customizable rule evaluation strategy

Why SPRINGLES:

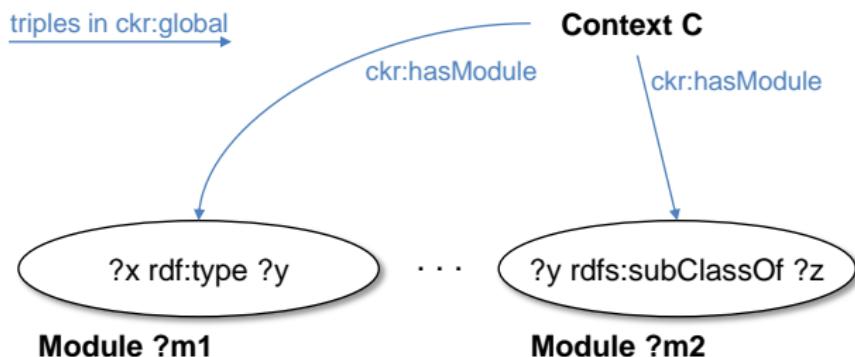
- no inference over NGs in RDF stores

Why SPARQL:

- exploits optimized query engines
- can scale to large KBs (cf. RETE)

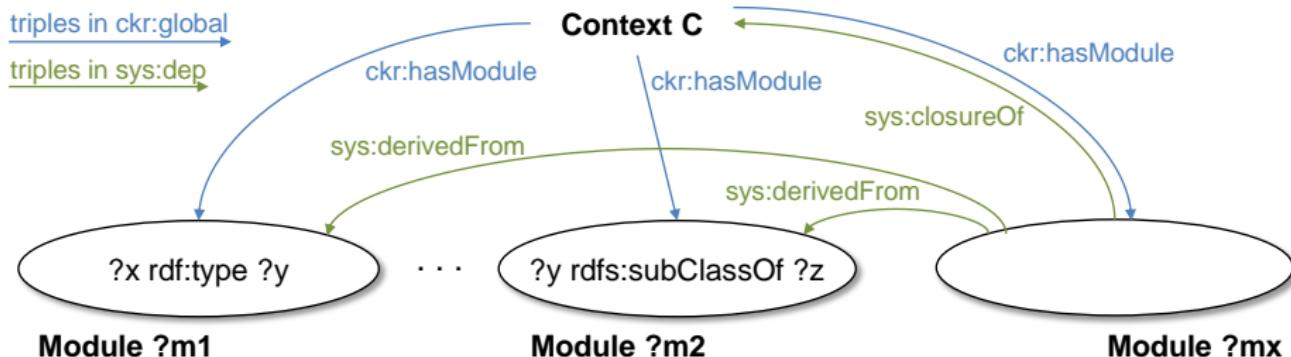
CKR calculus in SPRINGLES: rule example

```
:pel-c-subc a spr:Rule ;
  spr:head """ GRAPH ?mx { ?x rdf:type ?z } """ ;
  spr:body """ GRAPH ?m1 { ?y rdfs:subClassOf ?z }
    GRAPH ?m2 { ?x rdf:type ?y }
    GRAPH sys:dep { ?mx sys:derivedFrom ?m1,?m2 }
    FILTER NOT EXISTS {
      GRAPH ?m0 { ?x rdf:type ?z }
      GRAPH sys:dep { ?mx sys:derivedFrom ?m0 }
    } """ .
```



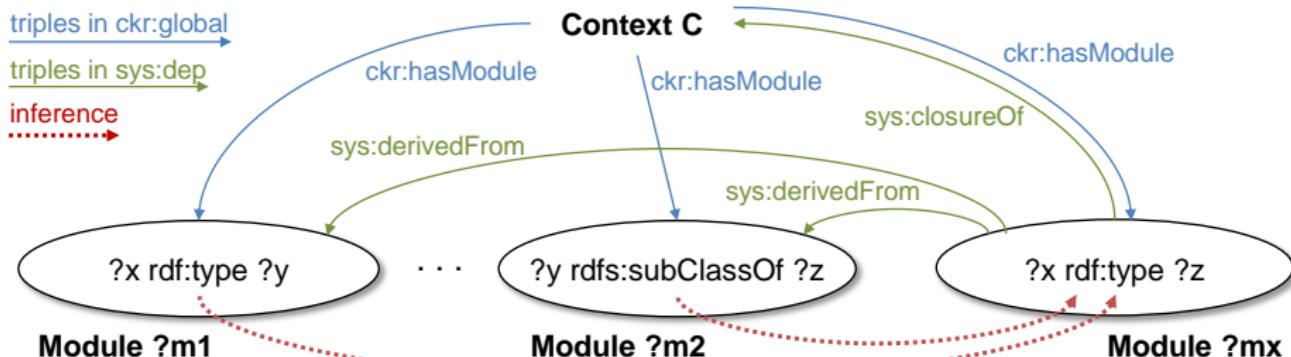
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    } """ .
```



CKR calculus in SPRINGLES: rule example

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    FILTER NOT EXISTS {
      GRAPH ?m0 { ?x rdf:type ?z }
      GRAPH sys:dep { ?mx sys:derivedFrom ?m0 }
    } """ .
```



CKR calculus in SPRINGLES: evaluation strategy

Composition of SPRINGLES primitives: **parallel rule evaluation, sequence, fixpoint, repeat** (not used by CKR)

```
:closure-strategy
  spr:sequenceOf ( :task_add_axioms :task_global_closure
                    :task_link_modules :task_ctx_closure ) .
:task_add_axioms
  spr:evalOf (
    :dep-glob :prp-ap :cls-thing :cls-nothing :dt-type ) .

:task_global_closure
  spr:bind "?g_inf = ckr:global-inf" ;
  spr:fixPointOf [ spr:evalOf (
    :pel-c-subc ... :pel-r-subrc :pgl-c-addmod
    :pgl-i-addmod :pgl-c-submodc :pgl-c-subattc ) ] .

:task_link_modules
  spr:evalOf ( :dep-local-i :dep-local-c ) .

:task_ctx_closure
  spr:fixPointOf [ spr:evalOf (
    :pel-c-subc ... :pel-r-subrc
    :plc-c-subevalat :plc-c-subexeval ) ] .
```

Tourism example: inference and query demo

Repository: Tourism example Demo KB (tourism-demokb) [[change](#)] [[manage](#)]

New Repository

(move the mouse over a property label to get more information about it)

Type: SPRINGLES ▾

ID: ckr-test

Title: CKR test

Inferred context prefix: ckr:inf

Buffering enabled: Yes No

Max concurrent transactions: 0

Max transaction execution time: 1800000

Max transaction idle time: 60000

Backend configuration

Backend type: Sesame Memory store ▾

Persistent: Sesame Memory store

Synchronization delay: Sesame Native store
OWLIM lite store

<http://stettler.fbk.eu:50000/admin>

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Current directions and future works

Directions for formalization and calculus:

- Extension of calculus to full *SROIQ-RL*
(add equality assertions and introduction of inconsistency)
- Local evaluation of metaknowledge and this
- Features of context relations e.g. *Mono(R)*
(represent coverage, previous/successor states in time etc.)
- Extended algorithm:
Compute closure for modules associated to context classes,
without replications in contexts

Directions for CKR implementation:

- CKR layer: accessing by contextual primitives
- Definition of SPARQL extension with context primitives
- Evaluation: definition of test knowledge base
- Extensions to SPRINGLES:
plan language, combination of backward/forward reasoning

Thank you for listening



CKR: a general framework for context in Semantic Web (Theory, prototype and extension to ASP)

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<https://dkm.fbk.eu/>

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