

Axiom-oriented Reasoning to Deal with Inconsistency Between Ontology and Knowledge Base



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Outline

- Introduction and Motivation
- Ontology and KB
- Inconsistencies in Ontology and KB
- Framework for Diagnosing and Repairing Inconsistency
- Axiom-oriented Reasoning



Introduction

- Semantic Web is developed as a new generation of the current Web
- Ontology & Knowledge Base (KB) are the two significant elements of the Semantic Web
- When used in practical applications, Ontologies and KBs always suffer inconsistencies
- A mechanism to detect and refine inconsistency in Ontology and KB is highly desirable



Ontology and KB

- Ontology represents knowledge
- KB captures knowledge to be represented with respect to an ontology



Football Ontology

$C = \{ \text{football-player, person, club, city} \}$

$\leq C = \{ \text{football-player} \subseteq \text{person} \}$

$T = \{ \text{integer} \}$

$R = \{ \text{live-in, locate-in, play-for, has-wife} \}$

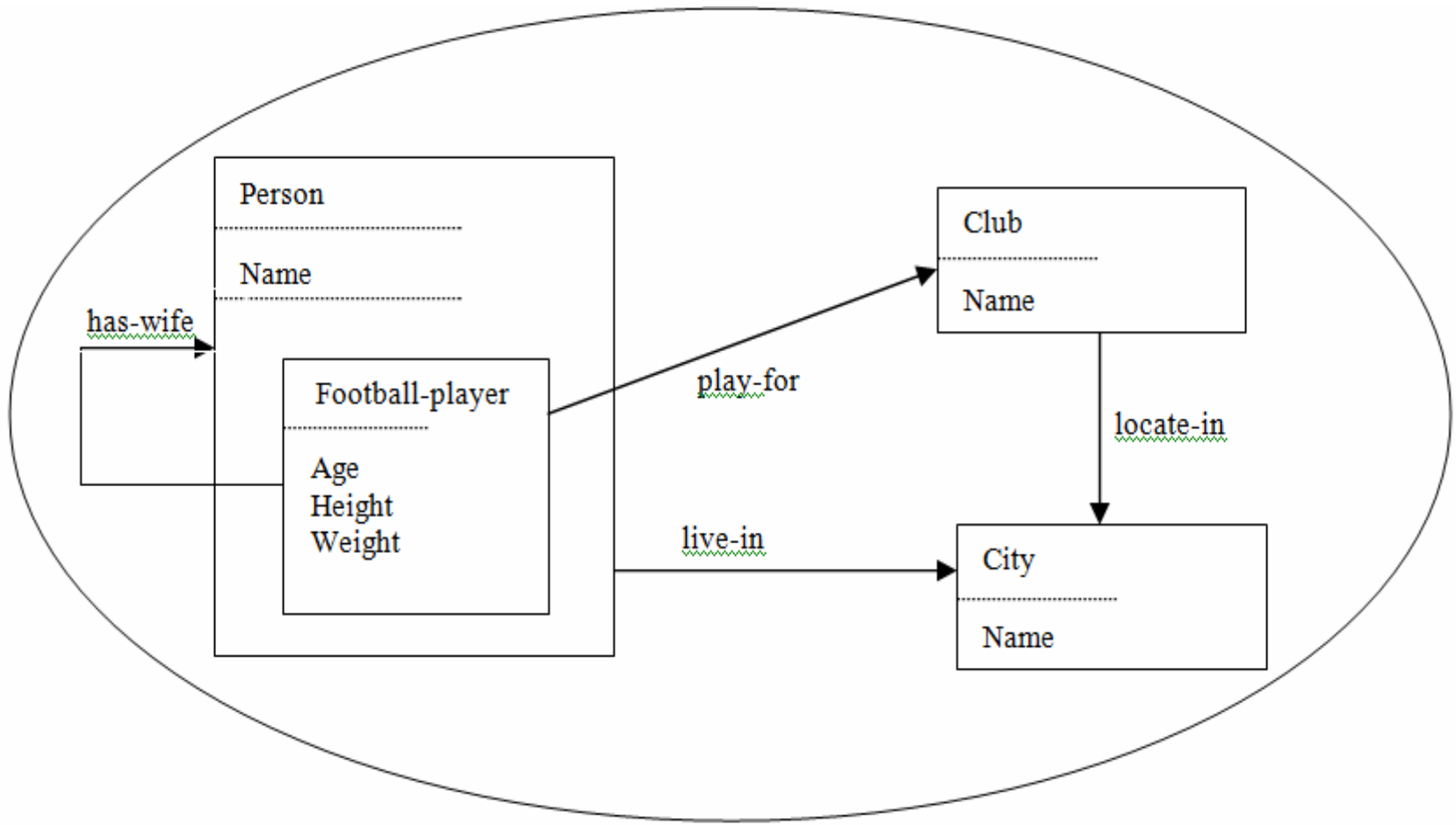
$A = \{ \text{age, height, weight} \}$

$\delta R = \{ \text{live-in} \rightarrow \text{football-player} \times \text{city}, \text{live-in} \rightarrow \text{person} \times \text{city}, \text{locate-in} \rightarrow \text{club} \times \text{city},$

$\text{play-for} \rightarrow \text{football-player} \times \text{club}, \text{has-wife} \rightarrow \text{football-player} \times \text{person} \}$

$\delta A = \{ \text{age} \rightarrow \text{football-player} \times \text{integer}, \text{height} \rightarrow \text{football-player} \times \text{integer},$

$\text{weight} \rightarrow \text{football-player} \times \text{integer} \}$





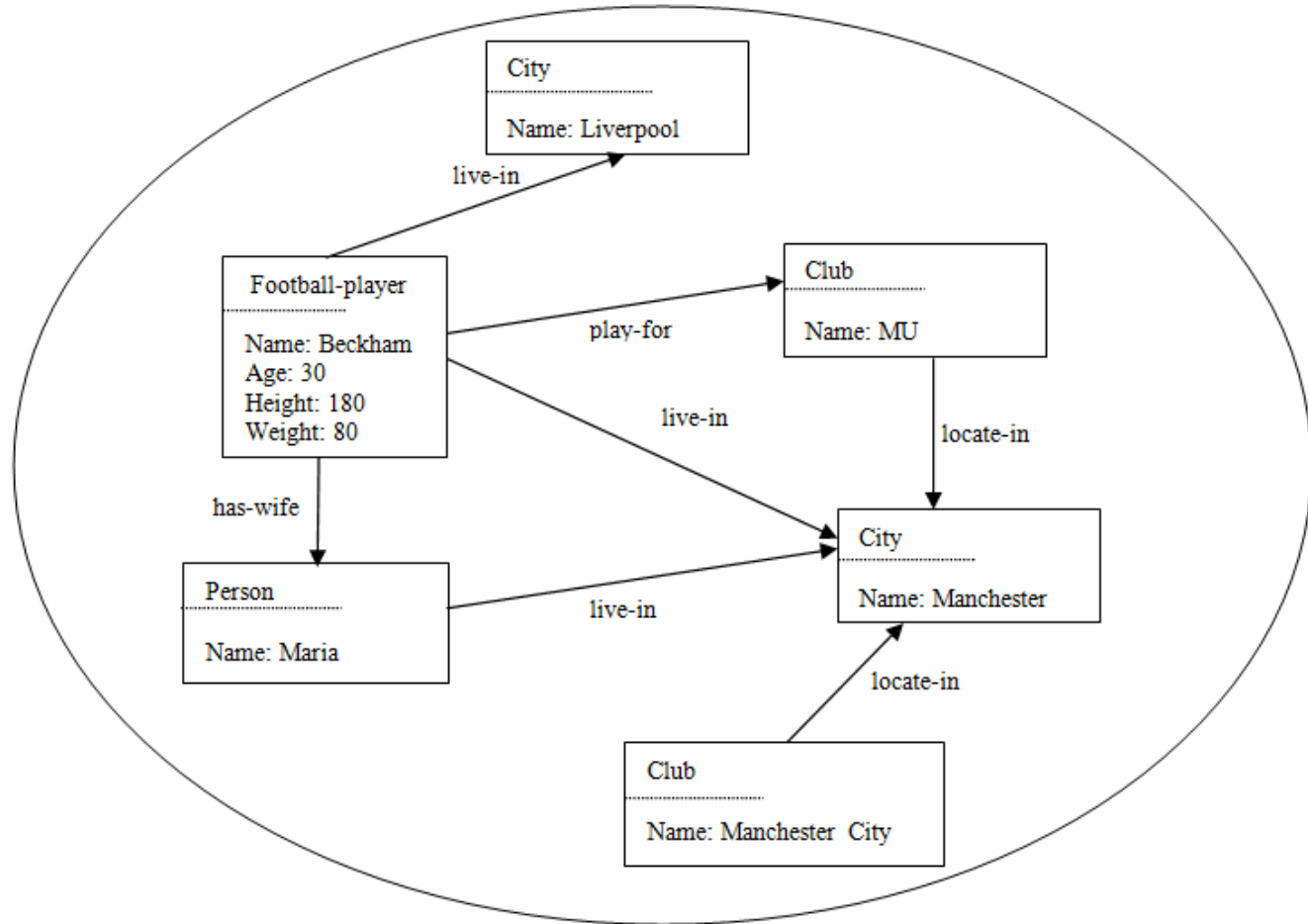
Football KB

$I = \{\text{Beckham, MU, Manchester, Liverpool, Chelsea, Maria}\}$

$\tau C = \{(K5) \text{ football-player (Beckham), } (K6) \text{ club (MU), } (K7) \text{ city (Manchester), } (K8) \text{ city (Liverpool), } (K9) \text{ club (Chelsea)}\}$

$\tau R = \{(K10) \text{ live-in (Beckham, Liverpool), } (K11) \text{ play-for (Beckham, MU), } (K12) \text{ locate-in (MU, Manchester), } (K13) \text{ has-wife (Beckham, Maria), } (K14) \text{ live-in (Maria, Manchester), } (K15) \text{ locate-in (ManCity, Manchester)}\}$

$\tau A = \{(K16) \text{ age (Beckham, 30), } (K17) \text{ height (Beckham, 180), } (K18) \text{ weight (Beckham, 80)}\}$





Axioms Defined in Ontology

(O1) $\text{football-player}(x) \wedge \text{club}(y) \wedge \text{city}(z) \wedge \text{play-for}(x, y) \wedge \text{locate-in}(y, z) \rightarrow \text{live-in}(x, z)$

// football player plays for club will live in the city that the club locates.

(O2) $\text{football-player}(x) \wedge \text{city}(y) \wedge \text{city}(z) \wedge \text{live-in}(x, y) \wedge \text{live-in}(x, z) \rightarrow y = z$

// football player is not living in more than one city.

(O3) $\text{football-player}(x) \wedge \text{has-wife}(x, y) \wedge \text{city}(z) \wedge \text{live-in}(y, z) \rightarrow \text{live-in}(x, z)$

// football player who has wife will live in the same city as his wife's.

(O4) $\text{club}(x) \wedge \text{locate-in}(x, z) \wedge \text{club}(y) \wedge \text{locate-in}(y, z) \rightarrow x = y$

// each city has not more than one club.



Inconsistency in Ontology and KB

- Inconsistency in Ontology
- Inconsistency in KB
- Inconsistency **between** Ontology and KB



Inconsistency in Ontology

- $\text{Bird} \subseteq \text{Animal}$ (birds are animals)
- $\text{Bird} \subseteq \text{Flying-Animal}$ (bird can fly)
- $\text{Penguin} \subseteq \text{Bird}$ (penguins are birds)
- $\text{Penguin} \subseteq \neg \text{Flying-Animal}$ (penguin cannot fly)



Inconsistency in KB

- Person (Bob) (Bob is a person)
- Person (Peter) (Peter is a person)
- **Same-as** (Bob, Peter) (Peter and Bob are the same people)
- **Difference-from** (Bob, Peter) (Peter and Bob are difference people)

Inconsistency between Ontology and KB



- Football Ontology

($O3$) $\text{football-player}(x) \wedge \text{has-wife}(x, y) \wedge \text{city}(z) \wedge \text{live-in}(y, z) \rightarrow \text{live-in}(x, z)$

// football player who has wife will live in the same city as his wife's.

- Football KB

($K5$) $\text{football-player}(\text{Beckham})$

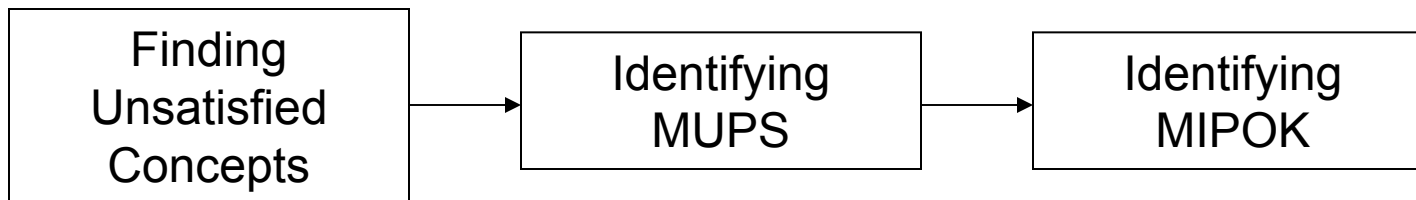
($K10$) $\text{live-in}(\text{Beckham}, \text{Liverpool})$

($K13$) $\text{has-wife}(\text{Beckham}, \text{Maria})$

($K14$) $\text{live-in}(\text{Maria}, \text{Manchester})$



Framework for Diagnosing and Repairing Inconsistency between Ontology and KB





Finding Unsatisfied Concepts

- Unsatisfied concepts:
 - *football-player* (containing unsatisfied individual Beckham who does not live in the same city as his wife does)
 - *city* (because it containing unsatisfied individual Manchester, which has two football clubs).



Identifying MUPS

- MUPS: Minimal Unsatisfied Preserving Sub Ontology and KB - a minimal inconsistent subset, but removal of any single axiom or fact from the set will eliminate the inconsistency.
 - $MUPS(city) = \{O4, K6, K7, K8, K9, K12, K15\}$, $MUPS(football-player) = \{O3, K5, K7, K8, K10, K13, K14\}$ or $\{O1, O2, K5, K6, K7, K8, K10, K11, K12\}$.



Identifying MIPOK

- MIPOK: Minimal Inconsistent Preserving Sub Ontology and KB - the smallest subsets of axioms and facts responsible for all inconsistencies

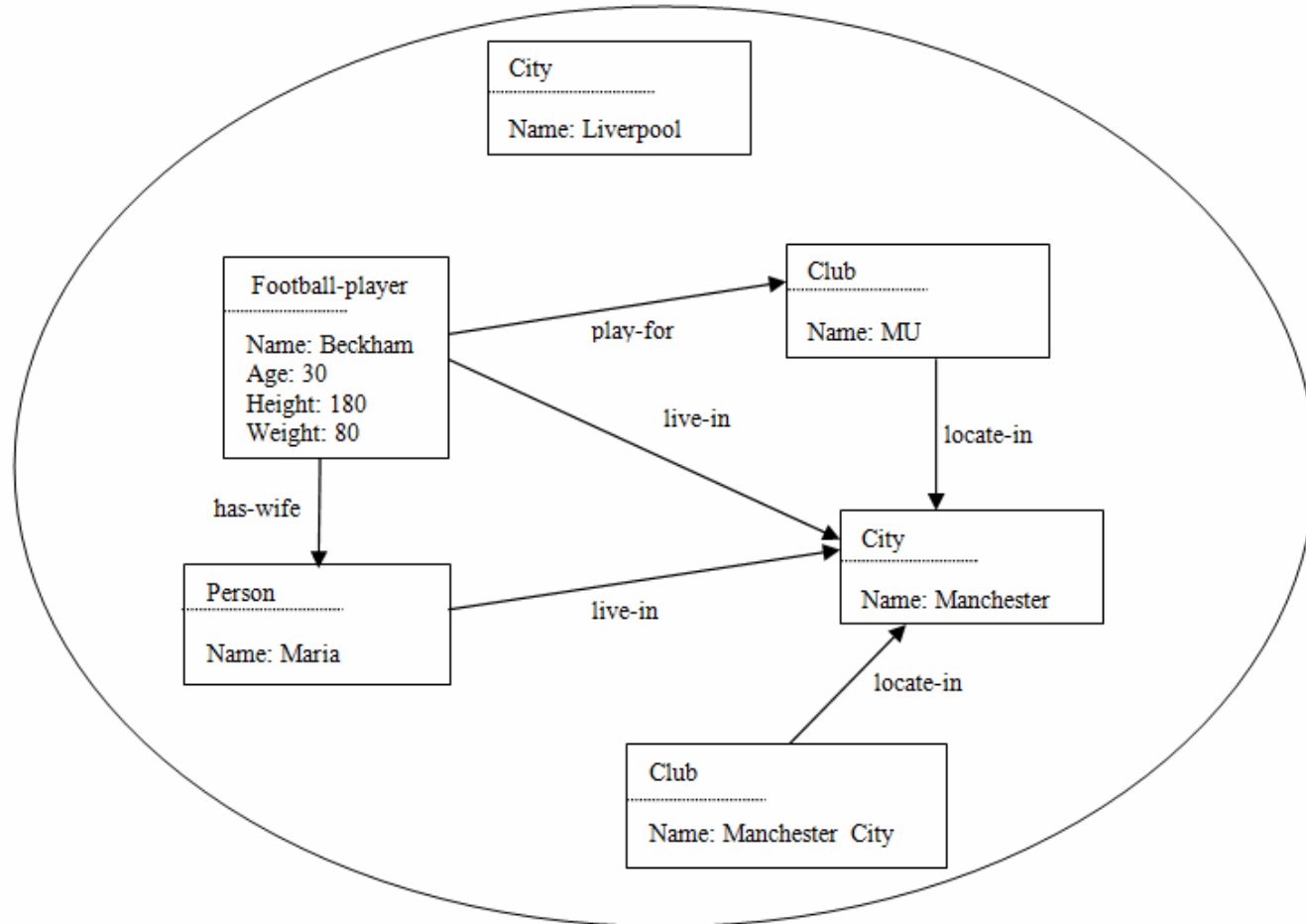
- $MIPOK = \{O4, K10\}$

(*O4*) $club(x) \wedge locate-in(x, z) \wedge club(y) \wedge locate-in(y, z) \rightarrow x = y$ // *each city has not more than one club.*

(*K10*) live-in (Beckham, Liverpool)



Refined Football KB





Axiom-oriented Reasoning

- Remove the number of *formulae* considered when calculating MUPS
 - Rule 1: Only consider formulae relevant to at least one axiom
 - Rule 2: Only consider formulae occurring in both Ontology and KB



Axiom-oriented Reasoning

- General formulae:
 - $\{(O1), (O2), (O3), (O4), (K5), (K6), (K7), (K8), (K9), (K10), (K11), (K12), (K13), (K14), (K15), (K16), (K17), (K18)\}$



Axiom-oriented Reasoning

- Rule 1 Applying

- $\{(O1), (O2), (O3), (O4), (K5), (K6), (K7), (K8), (K9), (K10), (K11), (K12), (K13), (K14), (K15), (K16), (K17), (K18)\}$

(K16): age (Beckham, 30)

(K17): height (Beckham, 180)

(K18): weight (Beckham, 80)



Axiom-oriented Reasoning

- Rule 2 Applying

- $\{(O1),(O2),(O3),(O4),(K5),(K6),(K7),(K8),(K9),(K10),(K11),(K12),(K13),(K14),(K15)\}$

$\{O1, O2, O3, K5\}, \{O1, O2, O4\}, \{K5, K6, K7, K8, K9\}, \{O1, O3, K6\}, \{O1, O3, K7\}, \{O4, K10\}, \dots$



Performance Analysis

- Non axiom-oriented reasoning:
 - $N = 2^{(n+(a+f)^k)}$
- Axiom-oriented reasoning:
 - $N = 2^{((a+f)^{k+1})} - (2^{(a*(a+f)^k)} + 2^{(f+(a+f)^k)})$

where:

a: axioms

f: facts

n: facts not relevant to any axiom

k: number of iteration steps



Thanks for your kind attention

<http://www.dit.hcmut.edu.vn/~tru/VN-KIM>