



Semantic Web Modeling Languages

Lecture 5: Rules

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Slides for remaining lectures at http://semantic-web-book.org/page/ESSLLI_2009



Why Rules?

OWL may not suffice for all applications

- There are statements that cannot be expressed in OWL (cf. Lecture 4)
- Modeling constructs of OWL not always adequate or most desirable
- First-order logic in general may be insufficient (e.g. if non-monotonic negation is desired)

→ “Rules” as an alternative paradigm for knowledge modeling



What is a Rule?

- Logical Rules (predicate logic implications)
 - “ $F \rightarrow G$ ” (equivalent to “ $\neg F \vee G$ ”)
 - Logical extension of a knowledge base (**static**)
 - **Open World**
 - Declarative (descriptive)
- Procedural Rules (e.g. production rules)
 - “If X then Y else Z”
 - Executable machine directive (**dynamic**)
 - **Operational** (meaning = effect on execution)
- Logic Programming (e.g. Prolog, F-Logic)
 - “**man (x) :- person (X) , not woman (X) ”**
 - Approximating logical semantics with procedural aspects, built-ins possible
 - Typically **Closed World**
 - “**semi-declarative**”
- Deduction rules of a calculus (e.g. rules for RDF semantics, lecture I)
 - Rules not part of the knowledge base, “meta-rules”





Which Rule Language?

Rule languages are hardly compatible with each other → important to choose adequate rule language

Possible criteria:

- Clear specification of syntax and semantics?
- Support by software tools?
- Which expressive features are needed?
- Complexity of implementation? Performance?
- Compatibility with other formats, e.g. OWL?
- Declarative (describing) or operational (programming)?
- ...



Which Rule Language?

- **Logical Rules** (predicate logic implications)
 - Clearly defined, extensively researched, well understood
 - Very well compatible with OWL and RDF
 - Not decidable if unrestricted
- **Procedural Rules** (e.g. production rules)
 - Many independent approaches, vague definition
 - Used like programming languages, relation to RDF and OWL not clear
 - Efficient processing possible
- **Logic Programming** (e.g. Prolog, F-Logic)
 - Clearly defined, but many independent approaches
 - Partly compatible with OWL and RDF
 - Decidability/complexity depends very much on the chosen approach



→ In this lecture: predicate logic rules
(which are also the basis for logic programming)



Predicate Logic as a Rule Language

- Rules as first-order logic implications (Horn clauses):

$$A1 \wedge A2 \wedge \dots \wedge An \rightarrow H \quad (\text{“Body} \rightarrow \text{Head”})$$

Example: “ $\text{Man}(x) \wedge \text{happilyMarriedWith}(x,y) \rightarrow \text{HappyHusband}(x)$ ”

- Constants, variables, function symbols can be used; but no negation
- Quantifiers are omitted: free variables considered universally quantified
- **Datalog:** rules without function symbols
 - _ Originally developed for deductive databases
 - _ Knowledge bases (“datalog programs”) are sets of function-free Horn clauses
 - _ Decidable
 - _ efficiently implementable for large datasets (overall complexity ExpTime, i.e. “Draughts” or “Chess”)



Semantics of Datalog?

- Semantics follows from first-order logic:
 - Generally well-known
 - Compatible with other first-order fragments, e.g. description logics (\rightarrow OWL)

Note: to maintain this relationship, we will prefer FOL syntax “hasCat(x,y)” over Turtle style “x hasCat y” or “triple(x,hasCat,y).”



How can datalog and OWL be combined?

SWRL – Semantic Web Rule Language [swirl]

- Proposal for a rule extension for OWL (W3C member submission)
- Idea: datalog rules referring to an OWL ontology
→ Symbols in rules can be OWL identifiers or new symbols
- Various further features and syntactic forms (not relevant here)



Semantics of SWRL

Combined semantics **OWL DL + datalog?**

→ use first-order mapping of OWL (lecture 2)

In effect:

- _ OWL individuals are datalog constants
- _ OWL classes are unary datalog predicates
- _ OWL properties are binary datalog predicates

→ A first-order interpretation can at the same time be a model for an OWL ontology and a datalog program

→ Entailment over OWL+datalog (SWRL) well-defined



Example: SWRL knowledge base

For readability, we abbreviate URIs strongly here; the datalog syntax does not follow a formal specification (SWRL XML is too verbose here)

```
(1) Vegetarian(x)  $\wedge$  Fishproduct(y)  $\rightarrow$  dislikes(x,y)
(2) ordered(x,y)  $\wedge$  dislikes(x,y)  $\rightarrow$  Unhappy(x)
(3) ordered(x,y)  $\rightarrow$  Dish(y)
(4) dislikes(x,z)  $\wedge$  Dish(y)  $\wedge$  contains(y,z)  $\rightarrow$  dislikes(x,y)
(5)  $\rightarrow$  Vegetarian(markus)
(6) Happy(x)  $\wedge$  Unhappy(x)  $\rightarrow$ 

(7) markus rdf:type [
    rdf:type owl:Restriction;
    owl:onProperty ordered;
    owl:someValuesFrom ThaiCurry ]
(8) ThaiCurry rdfs:subClassOf [
    rdf:type owl:Restriction;
    owl:onProperty contains;
    owl:someValuesFrom Fishproduct ]
```



Example: SWRL knowledge base

OWL DL can be translated to first-order logic:

- (1) $\text{Vegetarian}(x) \wedge \text{Fishproduct}(y) \rightarrow \text{dislikes}(x, y)$
- (2) $\text{ordered}(x, y) \wedge \text{dislikes}(x, y) \rightarrow \text{Unhappy}(x)$
- (3) $\text{ordered}(x, y) \rightarrow \text{Dish}(y)$
- (4) $\text{dislikes}(x, z) \wedge \text{Dish}(y) \wedge \text{contains}(y, z) \rightarrow \text{dislikes}(x, y)$
- (5) $\rightarrow \text{Vegetarian}(\text{markus})$
- (6) $\text{Happy}(x) \wedge \text{Unhappy}(x) \rightarrow$

- (7) $\exists y. \text{ordered}(\text{markus}, y) \wedge \text{ThaiCurry}(y)$
- (8) $\forall x. \text{ThaiCurry}(x) \rightarrow (\exists y. \text{contains}(x, y) \wedge \text{FishProduct}(y))$

→ Semantics completely defined

→ Expected conclusion: **Unhappy(markus)**

Note: empty rule heads correspond to “false” (rule body must never be true)
empty rule bodies correspond to “true” (rule head must always be true)



How Hard is SWRL?

- Deduction for OWL DL is NExpTime-complete
 - Deduction for OWL 2 DL is N2ExpTime-complete
 - Deduction in datalog is ExpTime-complete
- How hard is deduction for SWRL?

Deduction for SWRL is undecidable
(for OWL and thus for OWL 2, even for OWL EL)





Undecidability of SWRL



SWRL is undecidable:

There is no algorithm that can draw *all* logical conclusions from *all* SWRL knowledge bases, even with unlimited time and resources.

Practically possible:

- Algorithms that draw *all* conclusions for *some* SWRL knowledge bases
 - Algorithms that draw *some* conclusions from *all* SWRL knowledge bases
- Both trivial if “some” refers to very few things



Decidable Fragments of SWRL



Which classes of SWRL knowledge bases allow for complete inference algorithms?

- All SWRL knowledge bases consisting only of OWL (2) axioms
 - All SWRL knowledge bases only consisting of datalog rules
 - Every fixed finite class of SWRL knowledge bases
- Which more interesting decidable fragments exist?
- **Description Logic Rules**
 - **DL-safe Rules**



Description Logic Rules



Observation:

Some SWRL-rules can already be expressed in OWL 2.

- Identifying all such Description Logic Rules leads to a decidable fragment
- Goal: Exploit “hidden” expressivity of OWL 2
- Implementation directly by OWL 2 tools



Simple Rules in OWL 2: Examples

- Simple OWL 2 axioms correspond to rules:

```
Class1      rdfs:subClassOf      Class2 .  
Property1   rdfs:subPropertyOf   Property2 .
```

correspond to

```
Class1(x)   →   Class2(x)  
Property1(x,y) → Property2(x,y) .
```




Simple Rules in OWL 2: Examples

- Some classes can be decomposed in rules:

```
[ owl:intersectionOf ( Happy Unhappy ) ]  
                        rdfs:subClassOf      owl:Nothing .  
  
[ rdf:type              owl:Restriction;  
  owl:onProperty     livesIn;  
  owl:someValuesFrom [ rdf:type  owl:Restriction;  
                        owl:onProperty locatedIn;  
                        owl:someValuesFrom EUCountry ]  
                        ]  
] rdfs:subClassOf EUCitizen .
```

correspond to

$$\begin{aligned} & \textit{Happy}(x) \wedge \textit{Unhappy}(x) \rightarrow \\ & \textit{livesIn}(x,y) \wedge \textit{locatedIn}(y,z) \wedge \textit{EUCountry}(z) \rightarrow \textit{EUCitizen}(x) \end{aligned}$$



Simple Rules in OWL 2: Examples

- Property chains provide further rule-like axioms:

```
hasUncle owl:PropertyChainAxiom ( hasParent hasBrother ).
```

correspond to

```
hasParent(x,y)  $\wedge$  hasBrother(y,z)  $\rightarrow$  hasUncle(x,z)
```

→ In all examples, mapping can also be inverted (expressing rules in OWL 2)



More Rules (I)

What about the following?

$$\textit{dislikes}(x,z) \wedge \textit{Dish}(y) \wedge \textit{contains}(y,z) \rightarrow \textit{dislikes}(x,y)$$

- Rule head with two variables \rightarrow not representable by subclass axiom
- Rule body contains class expression \rightarrow not representable by subproperty axiom

Yet, this rule can be encoded using OWL 2!



More Rules (2)



Simpler example:

```
Man(x) ∧ hasChild(x,y) → fatherOf(x,y)
```

Idea: replace **Man (x)** by a property expression to encode rule as property chain

- Self can be used to transform classes to properties:
 - Auxiliary property **P_{Man}**
 - Auxiliary axiom:

```
Man owl:equivalentClass [ rdf:type owl:Restriction;  
  owl:onProperty PMan; owl:hasSelf "true"^^xsd:boolean ] .
```

- “Men are exactly those things that have an **P_{Man}** relation to themselves.”

We can now encode the rule as follows:

```
fatherOf owl:propertyChainAxiom ( PMan hasChild ) .
```



More Rules (3)

```
dislikes(x,z)  $\wedge$  Dish(y)  $\wedge$  contains(y,z)  $\rightarrow$  dislikes(x,y)
```

becomes

```
Dish owl:equivalentClass [ rdf:type owl:Restriction;  
  owl:onProperty PDish; owl:hasSelf "true"^^xsd:boolean ].  
  
dislikes owl:propertyChainAxiom  
  ( dislikes [owl:inverseOf contains] PDish ).
```



More Rules (4)

Not so simple:

```
Vegetarian(x)  $\wedge$  Fishproduct(y)  $\rightarrow$  dislikes(x,y)
```

Idea: use `owl:topObjectProperty` for linking unconnected rule body parts

- Self can be used to transform classes to properties:
 - Auxiliary properties `PVegetarian` and `PFishproduct`
 - Axioms:



```
Vegetarian owl:equivalentClass [  
  rdf:type owl:Restriction; owl:onProperty PVegetarian;  
  owl:hasSelf "true"^^xsd:boolean ].  
Fishproduct owl:equivalentClass [  
  rdf:type owl:Restriction; owl:onProperty PFishproduct;  
  owl:hasSelf "true"^^xsd:boolean ].  
dislikes owl:propertyChainAxiom  
  ( PVegetarian owl:topObjectProperty PFishproduct ).
```



Limits of Description Logic Rules

Not all rules can be encoded like this! Example:

```
ordered(x,y) ∧ dislikes(x,y) → Unhappy(x)
```

Overview of possible transformations:

- Inverting properties
- “Rolling-up” side branches, e.g.

```
locatedIn(x,y) ∧ EUCountry(y)                      becomes
```

```
[ rdf:type                      owl:Restriction;  
  owl:onProperty              locatedIn;  
  owl:someValuesFrom          EUCountry                      ]
```

- Replacing concepts by properties (using **hasSelf**)
- Turn property conjunctions into chains



Defining Description Logic Rules

- Preparation: **Normalise rule**
 - For each occurrence (!) of an individual name n in the rule:
Use a fresh variable x , add `[owl:oneOf n] (x)` to rule body, and replace the occurrence of n by x .
 - Replace every atom $P(x, x)$ by
`[rdf:type owl:Restriction; owl:onProperty P;
owl:hasSelf "true"^^xsd:boolean] (x)`.
- **Dependency graph of a rule:** undirected graph where
 - Nodes = variables of a rule
 - Edges = property atoms of a rule (direction is ignored)
- **A SWRL rule is a Description Logic Rule if:**
 - All rule atoms use OWL 2 class and property names only
 - The normalised rule's dependency graph has no cycles



Example

(1) $\text{Vegetarian}(x) \wedge \text{Fishproduct}(y) \rightarrow \text{dislikes}(x,y)$ 

(2) $\text{ordered}(x,y) \wedge \text{dislikes}(x,y) \rightarrow \text{Unhappy}(x)$ 

(3) $\text{ordered}(x,y) \rightarrow \text{Dish}(y)$ 

(4) $\text{dislikes}(x,z) \wedge \text{Dish}(y) \wedge \text{contains}(y,z) \rightarrow \text{dislikes}(x,y)$ 

(5) $\rightarrow \text{Vegetarian}(\text{markus})$ 

(6) $\text{Happy}(x) \wedge \text{Unhappy}(x) \rightarrow$ 

Note: Restrictions like regularity and simplicity must still be satisfied after the translations.



Transforming DL Rules to OWL 2



Input: A Description Logic Rule

- (1) Normalise the rule.
- (2) For every variable z in the head: if z is not in body, add `owl:Thing(z)` to body.
- (3) For every pair of variables x and y :
If x is not reachable from y in the dependency graph, insert `owl:topObjectProperty(x,y)` into the rule
- (4) The rule head must have a form `D(z)` or `S(z,z')`.
For every atom `R(x,y)` in the rule body:
If the path from z to y is shorter than the path from z to x in the dependency graph, then replace `R(x,y)` with `[owl:inverseOf R](y,x)`.
- (5) *While* the rule body contains an atom `R(x,y)` such that y does not occur in any other binary predicate of the rule *do*:
 - If the body contains n unary atoms `C1(y), ..., Cn(y)` then let E denote the expression `[owl:intersectionOf (C1 ... Cn)]` and remove `C1(y), ..., Cn(y)` from the body. Otherwise define E to be `owl:Thing`.
 - Replace `R(x,y)` by: `[rdf:type owl:Restriction; owl:onProperty R; owl:someValuesFrom E](x)`



Transforming DL Rules to OWL 2

The rule can now be expressed in OWL 2:

- If the rule head is unary, then the rule has the form $C_1(\mathbf{x}) \wedge \dots \wedge C_n(\mathbf{x}) \rightarrow D(\mathbf{x})$ then replace it by

```
[owl:intersectionOf (C1, ..., Cn)] rdfs:subClassOf D
```

- If the rule head is binary
 - For every unary atom $C(\mathbf{z})$ in the rule body:
Create a new axiom

```
C owl:equivalentClass [ rdf:type owl:Restriction;  
owl:onProperty R; owl:hasSelf "true"^^xsd:boolean ] .
```

and replace $C(\mathbf{z})$ by $R(\mathbf{z}, \mathbf{z})$, where R is a fresh property.

- Rule now has the form $R_1(\mathbf{x}, \mathbf{x}_2) \wedge \dots \wedge R_n(\mathbf{x}_n, \mathbf{y}) \rightarrow S(\mathbf{x}, \mathbf{y})$. Replace it by:

```
S owl:propertyChainAxiom ( R1 ... Rn ) .
```



Notes on the Transformation

- Replacing a SWRL rule in a SWRL knowledge base by the resulting set of OWL 2 axioms does not affect satisfiability (introduced auxiliary symbols do not occur elsewhere, of course)
- The given algorithm is not optimised: it may produce overly complex axioms in some cases





DL-safe Rules

Observation: Datalog is decidable since rules can be applied in only finitely many ways: variables represent only constants.

- Variables in SWRL might represent arbitrarily many inferred individuals
- Goal: Make rules “safe” by restricting possible variable assignments
- **DL-safe rules** as another decidable fragment of SWRL



DL-safe Rules: Definition



Rules now may also include non-OWL predicates:

- A **datalog atom** is an atom with a predicate symbol that does not occur as a class or property in any OWL axiom.

A SWRL rule is **DL-safe** if:

- Every variable in the rule head occurs in a datalog atom in the body.

→ Only constant symbols relevant when considering variable assignments in datalog atoms.



Enforcing DL-Safety

- Example:

$$\textit{ordered}(x,y) \wedge \textit{dislikes}(x,y) \rightarrow \textit{Unhappy}(x)$$

→ not DL-safe if *ordered* or *dislikes* occur in OWL axioms

- Enforcing DL-safety by restricting rules to **named** individuals:

$$\textit{ordered}(x,y) \wedge \textit{dislikes}(x,y) \wedge O(x) \wedge O(y) \rightarrow \textit{Unhappy}(x)$$

where a fact $\rightarrow O(a)$ is added for all individuals *a*.

→ Rule only applicable to **named** OWL individuals





DL-Safe Rules in Practice

- OWL 2 with DL-safe rules is decidable
- Naïve implementation: each rule expressible by finitely many DL rules where all variables are replaced by individual symbols in all possible ways (very inefficient)
- No increase in worst-case complexity

Implementations:

- Basic support in some reasoners (KAON2, Pellet)
- Implementation in tableau-based tools complicated



A Combined Example

OWL 2 + Description Logic Rules + DL-safe rules still decidable:

- (1) $\text{Vegetarian}(x) \wedge \text{Fishproduct}(y) \rightarrow \text{dislikes}(x, y)$
- (2) $\text{ordered}(x, y) \wedge \text{dislikes}(x, y) \wedge O(x) \wedge O(y) \rightarrow \text{Unhappy}(x)$
- (3) $\text{ordered}(x, y) \rightarrow \text{Dish}(y)$
- (4) $\text{dislikes}(x, z) \wedge \text{Dish}(y) \wedge \text{contains}(y, z) \rightarrow \text{dislikes}(x, y)$
- (5) $\rightarrow \text{Vegetarian}(\text{markus})$
- (6) $\text{Happy}(x) \wedge \text{Unhappy}(x) \rightarrow$
- (7) `markus rdf:type [`
 `rdf:type owl:Restriction;`
 `owl:onProperty ordered;`
 `owl:someValuesFrom ThaiCurry]`
- (8) `ThaiCurry rdfs:subClassOf [`
 `rdf:type owl:Restriction;`
 `owl:onProperty contains;`
 `owl:someValuesFrom Fishproduct]`
- (9) $\rightarrow O(\text{markus})$

\rightarrow We cannot conclude **Unhappy(markus)**



A Combined Example

Explicitly use named individual:

```
(1) Vegetarian(x)  $\wedge$  Fishproduct(y)  $\rightarrow$  dislikes(x,y)
(2) ordered(x,y)  $\wedge$  dislikes(x,y)  $\wedge$  O(x)  $\wedge$  O(y)  $\rightarrow$  Unhappy(x)
(3) ordered(x,y)  $\rightarrow$  Dish(y)
(4) dislikes(x,z)  $\wedge$  Dish(y)  $\wedge$  contains(y,z)  $\rightarrow$  dislikes(x,y)
(5)  $\rightarrow$  Vegetarian(markus)
(6) Happy(x)  $\wedge$  Unhappy(x)  $\rightarrow$ 
(7) markus ordered redThaiCurry .
    RedThaiCurry rdf:type ThaiCurry .
(8) ThaiCurry rdfs:subClassOf [
    rdf:type owl:Restriction;
    owl:onProperty contains;
    owl:someValuesFrom Fishproduct ]
(9)  $\rightarrow$  O(markus)  $\rightarrow$  O(redThaiCurry)
```

\rightarrow Now we can conclude **Unhappy (markus)**



Summary: Rules

- SWRL (“OWL+ datalog”) is undecidable
- Description Logic Rules:
 - SWRL fragment expressible in OWL 2
 - Supported indirectly by OWL 2 reasoners
 - Definition and translation based on dependency graph
- DL-safe rules:
 - SWRL fragment where variables can only assume concrete values
 - Support by some OWL reasoners
 - DL-safety can be enforced (also done implicitly in some tools)
- Combination OWL 2 + DL Rules + DL-safe rules possible



Rules for the Semantic Web?

- Standards and best-practices for rules still missing
- SWRL syntax most widely used in applications
- W3C RIF (Rule Interchange Format) Working Group
 - Standard for various rule languages, also SWRL-like rules
 - Various new features, e.g. syntax from Frame Logic
 - Official specification expected by end 2009
- Many studies on interfacing Logic Programming and OWL
- OWL 2 RL: a profile that can be translated to datalog rules (note: inverse direction of Description Logic Rules)
 - enables some interoperability OWL 2 ↔ RIF
- Operational “inference rules” or “production rules” supported by some RDF-stores (e.g. Jena)



Outlook: Semantic Web Research



This lecture covered basic technologies – many challenges remain:

- **How to create ontologies?**

Engineering aspects, tools, automatic annotation, ontology learning, NLP, evaluation, ...

- **How to deploy ontologies?**

Applications in specific fields, e.g. e-science, life sciences, engineering, e-government, Web Services, ...

- **How to process large amounts of semantic information?**

Scalable reasoning, search and querying, distribution, algorithms, ...

- **How to gather and combine semantic data?**

Information integration, ontology mapping, crawling, ...

- **How to explain all this to normal people?**

User interfaces, deployment processes, tool integration, ...

- **... contributions are welcome!**



The Final Matrix Quote



"I didn't come here to tell you how this is going to end. I came here to tell you how it's going to begin..."



*Where we go from there is
a choice I leave to you.*



Further Reading

- P. Hitzler, S. Rudolph, M. Krötzsch: **Foundations of Semantic Web Technologies**. CRC Press, 2009. (Chapter 6 closely related to this lecture; this also contains more references on types of rules not discussed here)
- I. Horrocks, P.F. Patel-Schneider, H. Boley, S. Tabet, B. Grosz, M. Dean. **SWRL: A Semantic Web Rule Language**. W3C Member Submission, 21 May 2004. Available at <http://www.w3.org/Submission/SWRL/>. (description of SWRL)
- **RIF working group homepage** (containing current status and pointers to documents): http://www.w3.org/2005/rules/wiki/RIF_Working_Group.
- S. Abiteboul, R. Hull, V. Vianu. **Foundations of Databases**. Addison Wesley, 1994. (the “Alice book” is an excellent resource on datalog)

Selected research articles:

- M. Krötzsch, S. Rudolph, P. Hitzler. **Description Logic Rules**. In Proc. 18th European Conf. on Artificial Intelligence (ECAI 2008), IOS Press, 2008. (original reference on Description Logic Rules)
- M. Krötzsch, S. Rudolph, P. Hitzler. **ELP: Tractable rules for OWL 2**. In Proc. 7th Int. Semantic Web Conf. (ISWC 2008), Springer, 2008. (extension of DL Rules to light-weight languages related to OWL EL and OWL RL)
- B. Motik, U. Sattler, R. Studer. **Query answering for OWL DL with rules**. Journal of Web Semantics, 3(1):41-60, 2005. (original reference on DL-safe rules)
- B.N. Grosz, I. Horrocks, R. Volz, S. Decker. **Description logic programs: combining logic programs with description logic**. In Proc. 12th Int. World Wide Web Conference (WWW-03), ACM, 2003. (original paper introducing DLP, a description logic that can be translated to datalog; closely related to OWL 2 RL)