

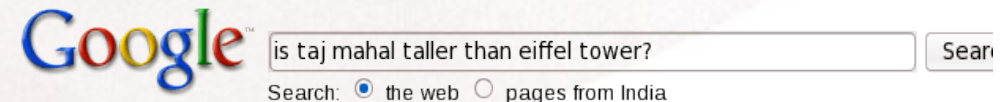
# ***Semantic Search***

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# Semantic Search




- Is that a yes or a no?









## Web




[Amazon.com: Lego Make & Create Eiffel Tower 1:300: Toys & Games](#)    
Standing **taller than** 3-1/2 feet, the Lego Make & Create **Eiffel Tower** kit lets builders re-create an ... **Lego Taj Mahal** - Make and Create Set 10189 ...  
[www.amazon.com/Lego-Make-Create-Eiffel-Tower/dp/B000P0Z9KQ](http://www.amazon.com/Lego-Make-Create-Eiffel-Tower/dp/B000P0Z9KQ) - 299k -  
[Cached](#) - [Similar pages](#) - 




[Plans for Eiffel Tower in Dubailand, Dubai UAE](#)    
**Eiffel Tower**, Dubai is to be part of the \$1.5 billion Falcon city of ... Believe it or not, the 'Dubai **Eiffel Tower**' is to be in true Dubai style, **taller than** the ... Dubailand-Leaning-**Tower**-Pisa-**Taj Mahal**-replicas ...  
[www.overseaspropertymall.com/regions/middle-east-property/uae-property/dubai-property/eiffel-tower-in-dubai/](http://www.overseaspropertymall.com/regions/middle-east-property/uae-property/dubai-property/eiffel-tower-in-dubai/) - 75k - [Cached](#) - [Similar pages](#) - 

[World's tallest viaduct to be inaugurated in France.\(Worldwatch ...](#)    
... reaches 343 metres at its highest point, 19 metres **taller than** the **Eiffel Tower**. ...  
Look, I said, there's the top of the **Eiffel Tower**. Don't be so daft, ... The **Eiffel Tower** is in France. yes no 5. The **Taj Mahal** is blue. yes no 6. ...  
[www.encyclopedia.com/doc/1G1-125568202.html](http://www.encyclopedia.com/doc/1G1-125568202.html) - 51k - [Cached](#) - [Similar pages](#) - 

[Routemaster scale: constructions](#)    
The **Eiffel Tower**, Paris, France The Great Pyramid of Giza, Egypt ... The top of the dome is 365 ft (111 metres) high - **taller than** a column of ... In contrast, only two buses could safely be accommodated in the **Taj Mahal** in Crawley, UK. ...  
[www.lighthouse.org.uk/rms/constructions.html](http://www.lighthouse.org.uk/rms/constructions.html) - 14k - [Cached](#) - [Similar pages](#) - 

[Dubai's the Limit; In the Persian Gulf, on a not particularly oil ...](#)    
1 Jun 2006 ... The Dubai **Eiffel Tower** Residence will be "**taller than** its Parisian cousin."  
The Dubai Grand **Taj Mahal** Hotel is "rich with the complexity and ...  
[www.accessmylibrary.com/coms2/summary\\_0286-15603407\\_ITM](http://www.accessmylibrary.com/coms2/summary_0286-15603407_ITM) - 35k -  
[Cached](#) - [Similar pages](#) - 

[Falconcyl of Wonders \(L.L.C\)](#)    
The Falconcyl includes multi-purpose/ residential buildings, **Eiffel Tower** (**taller than** original), **Taj Mahal** (**bigger than** the original), Hanging Gardens of ...  
[www.falconcyl.com/faq.asp](http://www.falconcyl.com/faq.asp) - 27k - [Cached](#) - [Similar pages](#) - 

[Falconcyl of Wonders - Wikipedia, the free encyclopedia](#)    
14 Feb 2009 ... It would be **taller than** the original **Eiffel Tower** and be named "Dubai **Eiffel Tower**". ... Leaning **Tower** of Pisa and **Taj Mahal** replicas ...  
[en.wikipedia.org/wiki/Falconcyl\\_city\\_of\\_wonders](http://en.wikipedia.org/wiki/Falconcyl_city_of_wonders) - 34k - [Cached](#) - [Similar pages](#) - 

# ***Semantic Search (contd)***

1. Understand that “tall” relates to height
2. Fetch the heights of “Taj Mahal” and “Eiffel Tower” from semantically annotated sites on the internet
3. Perform a comparison
4. Return the result

In short, do Logical Inferencing

# ***Outline***

- Motivational example
- Ontologies
- Description Logic
- Querying
- Conclusion

# *Present day search: Keyword based*

1. Automobile stereo and radio retail store
2. Automobile engine rebuilding, repair and exchange workshop
3. Car repair and retail shop
4. Jeep repair and retail shop
5. Motor mending and replacement workshop

Query	Results
Automobile	1,2
Automobile retail	1
Car repair	3
Motor repair	
Engine repair	2
Motor exchange	

\*Example from Ontoseek(1999) by Guarino et al

# *Improve: Add structure*

No	Business type	Activity	Object	Market area
1	Store	Retail	Radio, Stereo	Automobile
2	Workshop	Rebuilding, repair, exchange	Engine	Automobile
3	Shop	Retail, repair	Car	
4	Shop	Retail, repair	Jeep	
5	Workshop	Replacement, mending	Motor	

No	Business type	Activity	Object	Market area	Result
1	-	-	Automobile	-	
2	-	Retail	Automobile	-	
3	-	Repair	Car	-	3
4	-	Repair	Motor	-	
5	-	Repair	Engine	-	2
6	-	Repair	Motor	-	

# *Improve: Add structure*

No	Business type	Activity	Object	Market area
1	Store	Retail	Radio, Stereo	Automobile
2	Workshop	Rebuilding, repair, exchange	Engine	Automobile
3	Shop	Retail, repair	Car	
4	Shop			
5	Workshop			

**Increase in Precision!**

No	Business type	Activity	Object	Market area	Result
1	-	-	Automobile	-	
2	-	Retail	Automobile	-	
3	-	Repair	Car	-	3
4	-	Repair	Motor	-	
5	-	Repair	Engine	-	2
6	-	Repair	Motor	-	

# *Improve further: Use Ontology*

No	Document	Disambiguated description
1	Automobile stereo and radio retail store	[car, auto, automobile, machine, motorcar], [radio receiver, receiving set, radio set, radio, tuner, wireless], [stereo, stereo system, stereophonic system], [retail, sell retail], [shop, store]
2	Automobile engine rebuilding, repair and exchange workshop	[car, auto, automobile, machine, motorcar], [engine], [rebuilding], [repair, fix, fixing, mending, reparation], [substitution, exchange], [workshop, shop]
3	Car repair and retail shop	[car, auto, automobile, machine, motorcar], [repair, fix, fixing, mending, reparation], [retail, sell retail], [shop, store]
4	Jeep repair and retail shop	[jeep, landrover], [repair, fix, fixing, mending, reparation], [retail, sell retail], [shop, store]
5	Motor mending and replacement workshop	[motor], [repair, fix, fixing, mending, reparation], [replacement, replacing], [workshop, shop]



# *Use Ontology (contd)*

<b>No</b>	<b>Query</b>	<b>Disambiguated query</b>	<b>Result</b>
1	Automobile	[car, auto, automobile, machine, motorcar]	1,2,3,4
2	Automobile retail	[car, auto, automobile, machine, motorcar], [retail, sell, retail]	1,3,4
3	Car repair	[car, auto, automobile, machine, motorcar], [repair, fix, fixing, mending, reparation]	2,3,4
4	Motor repair	[motor], [repair, fix, fixing, mending, reparation]	2,5
5	Engine repair	[locomotive, engine, locomotive engine, railway locomotive], [repair, fix, fixing, mending, reparation]	-
6	Motor exchange	[motor], [substitution, exchange]	2,5

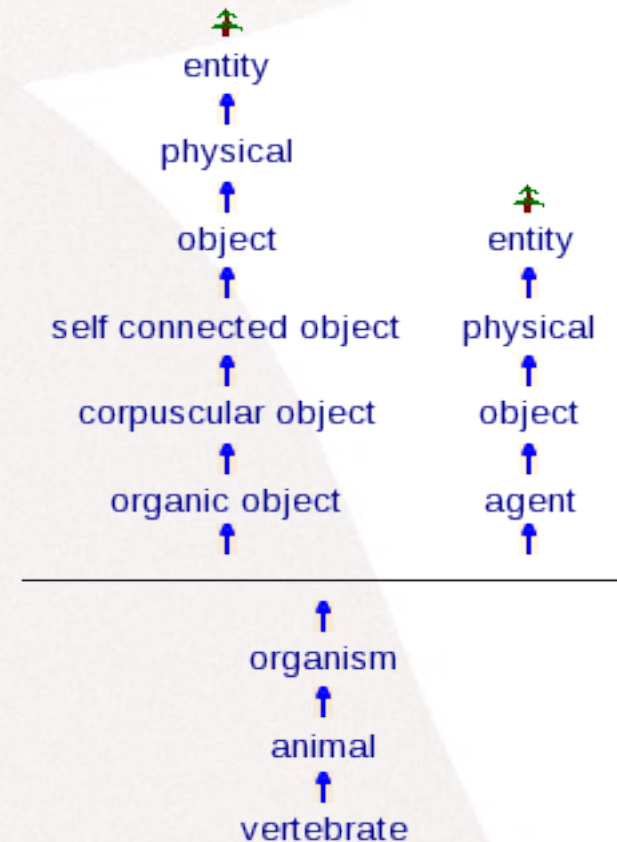
# Use Ontology (contd)

No	Query	Disambiguated query	Result
1	Automobile	[car, auto, automobile, machine, motorcar]	1,2,3,4
2	Automobile retail	[car, auto, automobile, machine, motorcar], [retail, sell retail]	1,3,4
3	Car repair	[car, auto, automobile, machine, motorcar], [repair, fix,	2,3,4
4	Motor repair	ration]	2,5
5	Engine repair	railway eparation]	-
6	Motor exchange	[motor], [substitution, exchange]	2,5

Increase in Recall!

# Ontology

- Individuals
- Concepts
- Relations
- Roles
- Axioms



invertebrate is disjoint from vertebrate.

If **bone** is an instance of **bone**, then there exists vertebrate **vert** so that **bone** is a part of **vert**.

# *Description Logic*

- Description logics (DL) are a family of knowledge representation languages
- Used to represent the concept definitions of an application domain formally
- “Description”
  - refers to concept descriptions used to describe a domain
- “Logic”
  - logic-based semantics which can be given by a translation into first-order predicate logic.

# DL – Constituents

**Concepts** Unary predicates *Eg. Person, Female*

**Roles** Binary predicates *Eg. hasChild*

**Individuals** Constants *Eg. Mary, John*

**Constructors** • Union  $\sqcup$ : *Eg. Man  $\sqcup$  Woman*

• Intersection  $\sqcap$ : *Eg. Person  $\sqcap$  Female*

• Restriction Exists  $\exists$ : *Eg.  $\exists$ hasChild.Female*

• Restriction ForAll  $\forall$ : *Eg.  $\forall$ hasChild.Engineer*

• Negation  $\neg$ : *Eg.  $\neg$ Man*

• Number restriction:  $\leq k, \geq m$

**Axioms** Mother  $\sqsubseteq$  Parent

# ***DL Constituents (contd)***

- “A man that is married to a doctor and has at least five children, all of whom are professors”

*Human*  $\sqcap$   $\neg$ *Female*  $\sqcap$   $\exists$ *married.Doctor*  
 $\sqcap$  ( $\geq 5$ *child*)  $\sqcap$   $\forall$ *child.Professor*

# ***DL Interpretation***

- An interpretation  $\mathcal{I}$  is a tuple  $(\Delta^{\mathcal{I}}, \cdot^{\mathcal{I}})$  where
  - $\Delta^{\mathcal{I}}$  is the domain
  - $\cdot^{\mathcal{I}}$  is a mapping which maps
    - \* Names of individuals to elements of  $\Delta^{\mathcal{I}}$
    - \* Names of concepts to subsets of  $\Delta^{\mathcal{I}}$
    - \* Names of roles to subsets of  $\Delta^{\mathcal{I}} \times \Delta^{\mathcal{I}}$

# Concepts, Roles and Interpretation

Individuals  $i^{\mathcal{I}} \in \Delta^{\mathcal{I}}$

Interpretation function  $\cdot^{\mathcal{I}}$

Mary

John

Concepts  $C^{\mathcal{I}} \subseteq \Delta^{\mathcal{I}}$

Teacher

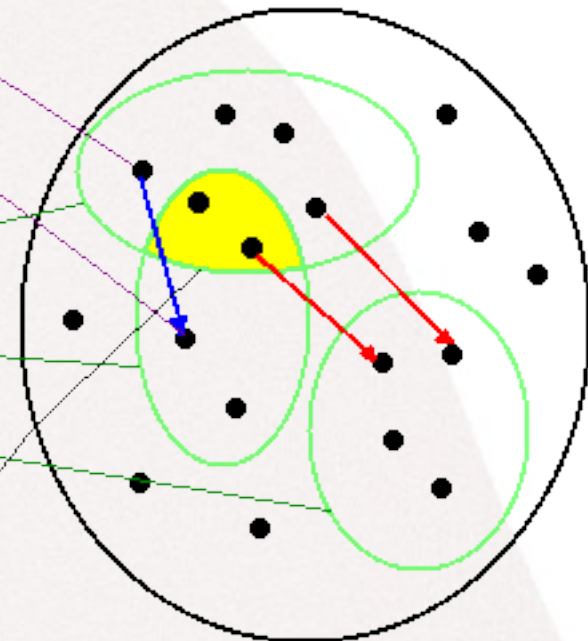
Student

Car

Roles  $R^{\mathcal{I}} \subseteq \Delta^{\mathcal{I}} \times \Delta^{\mathcal{I}}$

hasChild

owns



Interpretation domain  $\Delta^{\mathcal{I}}$

$Teacher \sqcap Student$



# ***DL Knowledge base***

- **TBox**

*Woman*  $\equiv$  *Person*  $\sqcap$  *Female*

*Man*  $\equiv$  *Person*  $\sqcap$   $\neg$ *Woman*

*Mother*  $\equiv$  *Woman*  $\sqcap$   $\exists$ *hasChild.Person*

*Father*  $\equiv$  *Man*  $\sqcap$   $\exists$ *hasChild.Person*

*Parent*  $\sqsubseteq$  *Person*

- **ABox**

$\langle$ *PETER* $\rangle$  : *Father*

$\langle$ *MARY* $\rangle$  : *Mother*

$\langle$ *MARY, PETER* $\rangle$  : *hasChild*

$\langle$ *PETER, HARRY* $\rangle$  : *hasChild*

# *Inferencing on the KB*

- Satisfiability: Is there some interpretation that satisfies axioms in TBox?
- Subsumption: Is concept A more general than concept B?
- Equivalence: Are concept A and concept B the same?
- Instance check: Can assertion  $\alpha$  be entailed by the ABox?
- Retrieval: Which individuals satisfy concept C?

# *Inferencing on the KB*

- Satisfiability: Is there some interpretation that satisfies axioms in TBox?
- Subsumption: Is concept A more general than concept B?  
CO
- Entailment: Is TBox the same as TBox'?
- Instance check: Can assertion  $\alpha$  be entailed by the ABox?
- Retrieval: Which individuals satisfy concept C?

All of these can be reduced to checking satisfiability

# *Tableaux Inferencing Algorithm*

- (1) Convert description to Negation Normal form
- (2) For any existential restriction, introduce a new individual as role filler such that it satisfies the constraints expressed by the restriction.
- (3) Use value restrictions in interaction with already defined role relationships to impose new constraints on individuals
- (4) For disjunctive constraints, try both possibilities in successive attempts. Backtrack if you reach an obvious contradiction
- (5) If an at-most number restriction is violated then the algorithm must identify different role fillers

# Tableaux Inferencing algorithm (example)

$(\exists teaches.Biology) \sqcap (\exists teaches.Statistics) \sqsubseteq (\exists teaches.(\underline{Biology \sqcap Statistics}))$

Bio-statistics

$(\exists R.A) \sqcap (\exists R.B) \sqsubseteq (\exists R.(A \sqcap B))$

# Tableaux Inferencing algorithm (example)

- Check whether  $(\exists R.A) \sqcap (\exists R.B) \sqsubseteq (\exists R.(A \sqcap B))$
- If  $C = (\exists R.A) \sqcap (\exists R.B) \sqcap \neg(\exists R.(A \sqcap B))$  is unsatisfiable, then  $(\exists R.A) \sqcap (\exists R.B) \sqsubseteq (\exists R.(A \sqcap B))$
- Move the negations as far inside as possible.

$$C = (\exists R.A) \sqcap (\exists R.B) \sqcap \forall R.(\neg A \sqcup \neg B)$$

$C$  is now in negation normal form.

- Now, we try to construct an interpretation  $\mathcal{I}$  such that  $C^{\mathcal{I}} \neq \phi$ . This means there must exist an individual in  $\Delta^{\mathcal{I}}$  that is an element of  $C^{\mathcal{I}}$ . So, we construct an individual  $b \in C^{\mathcal{I}}$ .
- Since  $C$  is the conjunction of 3 concepts,  $b$  must satisfy  $b \in (\exists R.A)^{\mathcal{I}}, b \in (\exists R.B)^{\mathcal{I}}$  and  $b \in (\forall R.(\neg A \sqcup \neg B))^{\mathcal{I}}$ .

# *Tableaux Inferencing algorithm (contd)*

- From  $b \in (\exists R.A)^{\mathcal{I}}$ , we can see that there must exist an individual  $c$  such that  $(b, c) \in R^{\mathcal{I}}$  and  $c \in A^{\mathcal{I}}$ . Similarly,  $b \in (\exists R.B)^{\mathcal{I}}$  implies that there must exist an individual  $d$  with  $(b, d) \in R^{\mathcal{I}}$  and  $d \in B^{\mathcal{I}}$ .
- Since  $b$  must also satisfy  $\forall R.(\neg A \sqcup \neg B)$ , and  $c, d$  were introduced as fillers of  $b$  for  $R$ , we get 2 more constraints  $c \in (\neg A \sqcup \neg B)^{\mathcal{I}}$  and  $d \in (\neg A \sqcup \neg B)^{\mathcal{I}}$ .
- Now,  $c \in (\neg A \sqcup \neg B)^{\mathcal{I}}$  means  $c \in (\neg A)^{\mathcal{I}}$  or  $c \in (\neg B)^{\mathcal{I}}$ .  $c \in (\neg A)^{\mathcal{I}}$  clashes with the constraint  $c \in A^{\mathcal{I}}$ , implying that this choice leads to an obvious contradiction. Hence, we must choose  $c \in (\neg B)^{\mathcal{I}}$ . Similarly, we must choose  $d \in (\neg A)^{\mathcal{I}}$  in order to satisfy the constraint  $d \in (\neg A \sqcup \neg B)^{\mathcal{I}}$  without contradicting  $d \in B^{\mathcal{I}}$ .

# *Tableaux Inferencing algorithm (contd)*

- Now, since we have satisfied all constraints without encountering an obvious contradiction, we can conclude that  $C$  is satisfiable.
- We have generated an interpretation  $\mathcal{I}$  as proof of this fact:  $\Delta^{\mathcal{I}} = \{b, c, d\}$ ;  $R^{\mathcal{I}} = \{(b, c), (b, d)\}$ ;  $A^{\mathcal{I}} = \{c\}$  and  $B^{\mathcal{I}} = \{d\}$ . This means that, for this interpretation,  $b \in C^{\mathcal{I}}$  i.e.  $b \in ((\exists R.A) \sqcap (\exists R.B))^{\mathcal{I}}$ , but  $b \notin (\exists R.(A \sqcap B))^{\mathcal{I}}$ . This shows that  $(\exists R.A) \sqcap (\exists R.B)$  is not subsumed by  $\exists R.(A \sqcap B)$ .

$$(\exists R.A) \sqcap (\exists R.B) \not\subseteq (\exists R.(A \sqcap B))$$



# DL Family

- $\mathcal{ALC}$  - Concepts constructed using  $\sqcup, \sqcap, \exists, \forall, \neg$ , but roles are atomic.
- $\mathcal{S}$  is an abbreviation for  $\mathcal{ALC}$  with transitive roles.
- $\mathcal{H}$  for role hierarchy. Eg:  $hasDaughter \sqsubseteq hasChild$
- $\mathcal{O}$  for nominals. Eg:  $\{Mary, Hohn\}$
- $\mathcal{I}$  for inverse roles. Eg:  $isChildOf \equiv hasChild^{-1}$
- $\mathcal{N}$  for cardinality restrictions. Eg:  $\geq 2hasChild$
- $\mathcal{F}$  restricts cardinality to be 0 or 1.
- $\mathcal{Q}$  for qualified number restrictions. Eg:  $\geq 2hasChild.Professor$
- $\mathcal{R}$  for role inclusion and role disjointness.
- $(\mathcal{D})$  to denote use of datatype properties, data values or data types.

For example,  $\mathcal{SHOIQ} = \mathcal{ALC}$  with transitive roles  $+\mathcal{H} + \mathcal{O} + \mathcal{I} + \mathcal{Q}$

# OWL – Web Ontology Language

- A language based on RDF, RDFS and XML to represent Ontologies
- A W3C standard

```
-<rdfs:Class rdf:ID="Animal">  
  <rdfs:subClassOf rdf:resource="#Organism"/>  
  -<rdfs:comment>  
    An Organism with eukaryotic Cells, and lacking stiff cell walls, plastids, and photosynthet  
  </rdfs:comment>  
</rdfs:Class>  
  
-<owl:ObjectProperty rdf:ID="wears">  
  -<rdfs:comment>  
    (wears ?AGENT ?CLOTHING) means that ?AGENT is wearing the item of Clothing  
  </rdfs:comment>  
  <rdfs:type rdf:resource="#BinaryPredicate"/>  
  <rdfs:domain rdf:resource="#Animal"/>  
  <rdfs:range rdf:resource="#Clothing"/>  
</owl:ObjectProperty>
```

# ***OWL Species***

- **OWL DL**
  - Uses SHOIN(D)
  - Non deterministic exponential time reasoning
- **OWL Lite**
  - Uses SHIF(D)
  - Deterministic exponential time reasoning
- **OWL Full**
  - Goes well outside DL framework
  - Reasoning undecidable

# Querying

- Q = “John Little Sysedit publications”

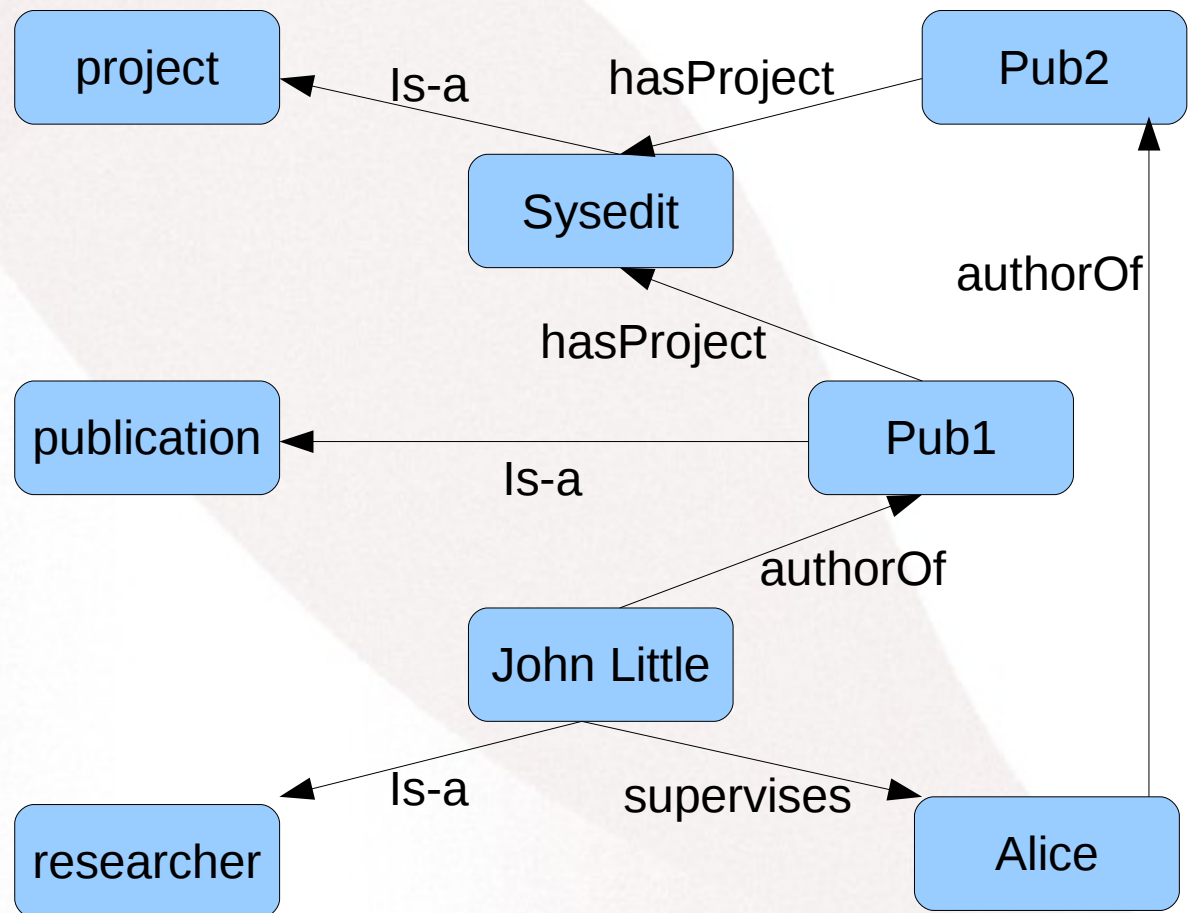
Sysedit

publication

John Little

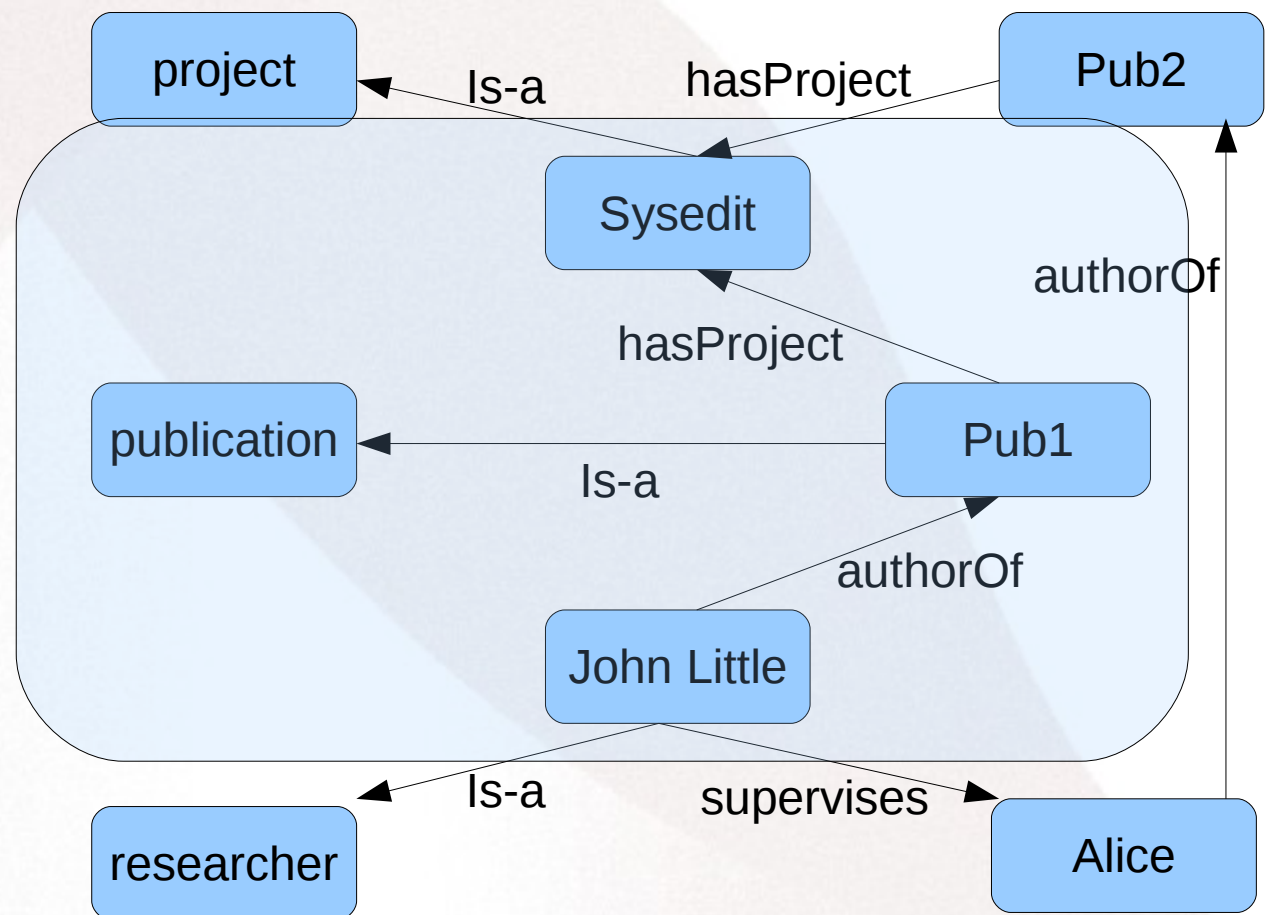
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- Q = “John Little Sysedit publications”



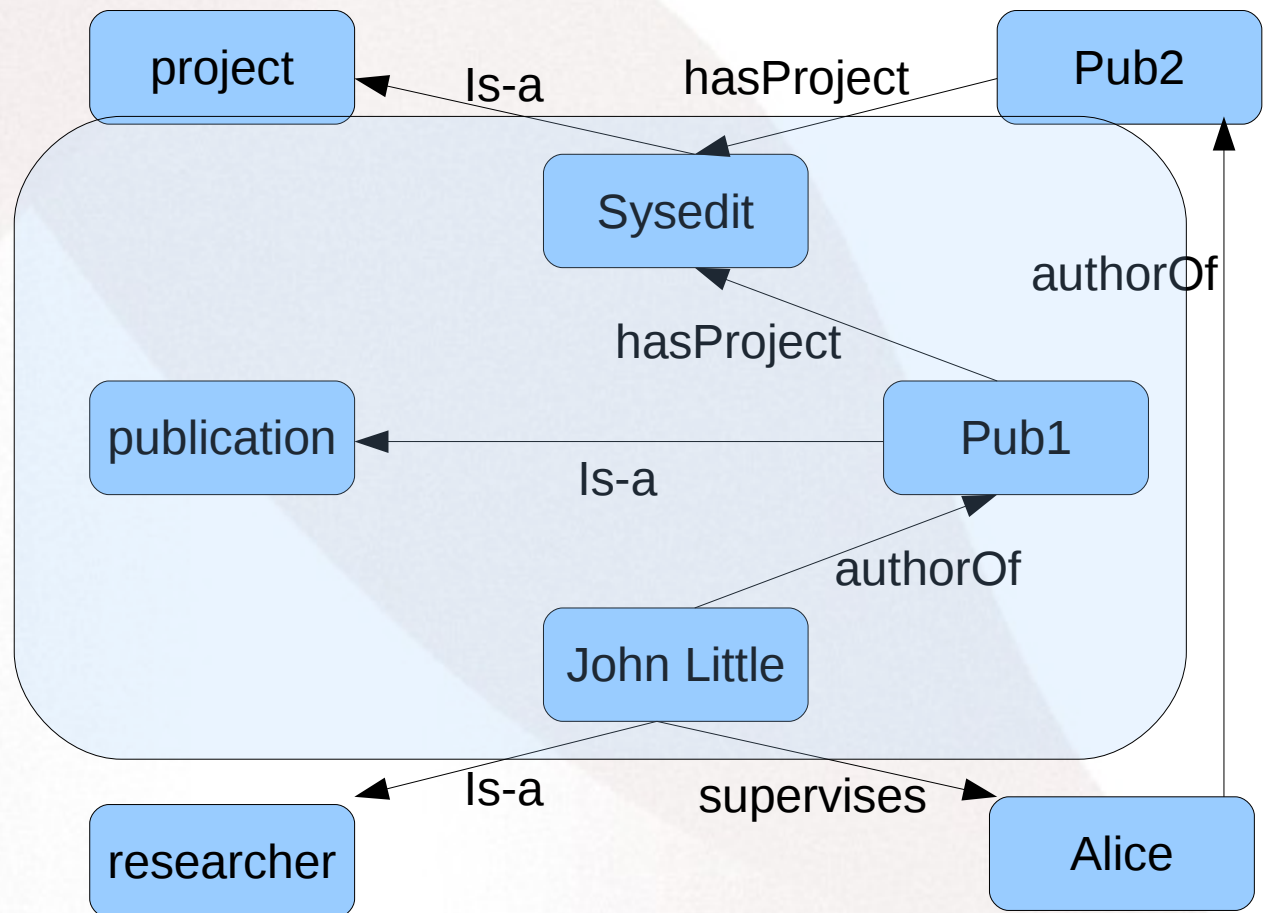
# Querying

- Q = “John Little Sysedit publications”



# Querying

$Q = \langle x, JohnLittle \rangle : name \wedge \langle x, y \rangle : author \wedge \langle y, z \rangle : hasProject$   
 $\wedge \langle z, Sysedit \rangle : name \wedge \langle y : publication \rangle$



# *Conclusions*

- Semantic web is a hot topic of research
- Semantic annotation of documents using ontologies and inferencing gives better search results
- Need of the hour
  - Standards
  - Annotation tools
  - Efficient large scale inferencing engines
  - World wide acceptance and use



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