Modularity in Ontologies: Comparison of module notions

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ESSLLI, 15 August 2013



#### **Comparison between**

- MEX and locality-based modules
- modules based on syntactic and semantic locality



# MEX experiments with SNOMED CT

### SNOMED CT:

- Systematised Nomenclature of Medicine (Clinical Terms).
- $\sim$  400,000 terms
- used in health care etc. in the US, UK, Australia etc.
- an acyclic *EL*-terminology (+ role box):

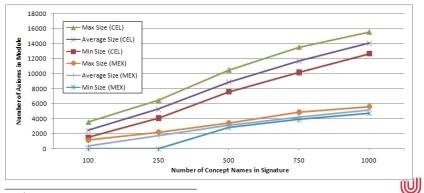
[Konev, Lutz, Walther, Wolter 2008] [Sattler, Schneider, Zakharyaschev 2009]



# Experiment 1: Extraction of modules from SNOMED CT

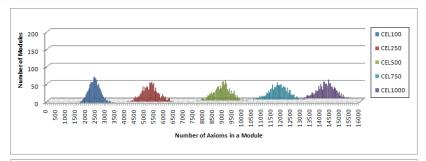
MEX: prototype implementation of the MEX algorithm<sup>1</sup> vs. CEL: implementation of  $\perp$ -locality based modules

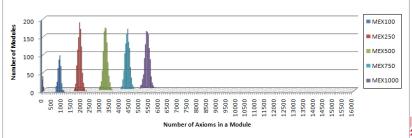
- $\Sigma$  randomly selected from SNOMED CT
- signature size up to 1000; for each size 1000 samples



<sup>1</sup>http://www.csc.liv.ac.uk/~konev/software/

### MEX vs. ⊥-locality based modules: frequency

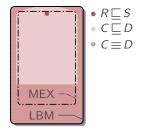




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# Experiment 2: SNOMED modules for clinical signatures

- Experiments with SNOMED again
- Compared modules for 24,000 terms from intensive care unit
- Locality-based modules (LBM)  $\Leftrightarrow$  minimal modules (MEX)





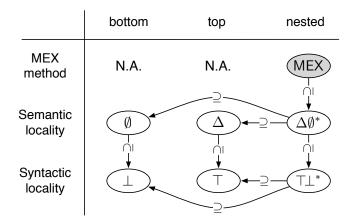
# Preliminary conclusion

- MEX and locality-based modules are efficient to extract
- For random signatures from SNOMED, they differ significantly in size
- For clinical signatures from SNOMED, they don't differ much
- Most differences are caused by equivalence axioms (in fact, MEX = LBMs for equivalence-free *EL* terminologies)

### Can this be generalised

- to other ontologies?
- to modules based on syntactic versus semantic locality?

## Reminder: module notions



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Questions

Given a seed signature  $\Sigma$  and ontology  $\mathcal{O}$ ,

• ... how likely is 
$$\emptyset$$
-mod $(\Sigma, \mathcal{O}) \subset \bot$ -mod $(\Sigma, \mathcal{O})$   
 $\Delta$ -mod $(\Sigma, \mathcal{O}) \subset \top$ -mod $(\Sigma, \mathcal{O})$   
 $\Delta \emptyset^*$ -mod $(\Sigma, \mathcal{O}) \subset \top \bot^*$ -mod $(\Sigma, \mathcal{O})$   
MEX-mod $(\Sigma, \mathcal{O}) \subset \Delta \emptyset^*$ -mod $(\Sigma, \mathcal{O})$ 

and how large is the difference?

(variation: given axiom  $\alpha$ , is it likely that  $\alpha$  is Ø-local but not  $\perp$ -local for  $\Sigma$  $\Delta$ -local but not  $\top$ -local for  $\Sigma$ ?)

Is the difference in extraction time?

# Sampling the seed signatures

- $\mathcal{O}$  has exponentially many potential seed signatures  $\Sigma$ .
- Modules for different  $\Sigma_1, \Sigma_2$  may coincide.
- Still, O can have exponentially many modules.
   ⇒ Thursday [Del Vescovo et al., 2010]
- We don't yet know what typical seed signatures are.
- Sample random seed signatures
  - Sample one  $\Sigma$ : pick each axiom with probability p = 0.5
  - Achieve confidence interval ±5% with confidence level 95%: select 400 random Σ's (if O is big enough)

#### Sample axiom seed signatures (non-random, exhaustively)

Genuine mod.s (GMs) → Thursday

- $\ldots$  -mod(sig( $\alpha$ ),  $\mathcal{O}$ ), for  $\alpha \in \mathcal{O}$
- $\bullet\,$  every module of  ${\mathcal O}$  is the union of some GMs

# The ontology corpus

Name	Expressivity	#Axioms	Sig. size	
BioPortal	AL-SROIQ(D)	10-16,066	10-16,068	
(234 entries)				
TONES				
Galen	$\mathcal{ALEHIF}+$	4,735	3,161	
Koala	$\mathcal{ALCON}(\mathcal{D})$	42	32	
Mereology	SHIN	38	21	
MiniTambis-rep'd	$\mathcal{ALCN}$	170	227	
<b>OWL-S</b> Profile	$\mathcal{ALCHOIN}(\mathcal{D})$	276	163	
People	ALCHOIÑ	108	96	
Tambis-full	$\mathcal{SHIN}(\mathcal{D})$	592	497	
University	SOIN(D)	52	44	



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### Results: syntactic vs. semantic LBMs (1)

For 209 out of 242 ontologies, syntactic and semantic LBMs agree, i.e.:

- Given an arbitrary  $\Sigma$ , there is no difference between
  - $\emptyset$ -mod $(\Sigma, \mathcal{O})$  and  $\perp$ -mod $(\Sigma, \mathcal{O})$ , or
  - $\Delta$ -mod $(\Sigma, \mathcal{O})$  and  $\top$ -mod $(\Sigma, \mathcal{O})$ , or
  - $\Delta \emptyset^*$ -mod $(\Sigma, \mathcal{O})$  and  $\top \bot^*$ -mod $(\Sigma, \mathcal{O})$ , or
  - any  $\alpha$  being  $\emptyset$ -local and  $\perp$ -local w.r.t.  $\Sigma$ , or
  - any  $\alpha$  being  $\Delta$ -local and  $\top$ -local w.r.t.  $\Sigma$ ,

at a significance level of 0.05.

- Given any axiom signature sig(a), there is no difference between the syntactic and semantic LBM versions above
- Extracting a Ø-module took up to 5× as long as ⊥-module (outlier: 34× for Galen)

### Results: syntactic vs. semantic LBMs (2)

For 6 of the remaining 33 ontologies, negligible differences:

- Differences are only caused by tautologies:
  - axioms like  $r \equiv (r^-)^-$ , for some role r
  - contained in some BioPortal ontologies (published version is closed under certain entailments)
  - are not syntactically local for r ∈ Σ but semantically local
  - sometimes "pull" other axioms into the module via signature extension
  - are uncritical: can be detected easily

#### $\rightsquigarrow$ No observable differences for 215 out of 242 ontologies

#### And the remaining 27?



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### Results: syntactic vs. semantic LBMs (3)

For the remaining 27 out of 242 ontologies,

- syntactic and semantic modules differ in only 6 cases
- differences between  $\Delta \emptyset^*$ -mod $(\Sigma, \mathcal{O})$  and  $\top \bot^*$ -mod $(\Sigma, \mathcal{O})$ : at most 13 axioms
- larger differences only for  $\Delta$  vs.  $\top$ -modules
- time differences not measurable (few milliseconds per module)
- in the other 21 cases, only locality of single axioms differs
- $\rightsquigarrow$  Relevant module differences only in 6 of 242 ontologies!

Differences are due to 3 patterns of axioms: culprits (next)

Example axiom  $\alpha$ :

$$\mathbb{M} \equiv \underline{\mathbb{S}} \sqcap \forall \underline{\mathbf{c}}.F \sqcap \forall g.\{m\} \sqcap =3 \underline{\mathbf{c}}.\top$$

EquivClasses(M,

S and conly F and g value m and c exactly 3 Thing)  $% \left( {{{\mathbf{F}}_{\mathrm{s}}}} \right)$ 

• Suppose 
$$\Sigma = \{S, c, g\}$$

- $\alpha$  is not  $\perp$ -local because none of its conjuncts is  $\perp$ -equiv.
- $\alpha$  is Ø-local:

after replacing M, F with  $\bot$ , it becomes a tautology in particular,  $\forall c. \bot \Box = 3 c. T$  cannot have any instances

**Q**: How do LBMs compare with **minimal** modules?  $\sim$  Partial answer via MEX possible

**Problem:** MEX only defined for acyclic  $\mathcal{ELI}$ -TBoxes So what can we do?

- Test only ontologies that comply?
   → only 33 of 242 ☺
- Tweak + test ontologies that "almost" comply?
   → only some 60 of 242 ☺
- Test  $\mathcal{ELI}$ -approximation of all ontologies!  $\bigcirc$

### LBMs vs. MEX: $\mathcal{ELI}$ -fication

Reduce every ontology to an acyclic  $\mathcal{E\!L\!I}$  subset, removing

- $\bullet$  all non- ${\cal ELI}$  axioms
- axioms involved in terminological cycles
- This is a rather crude procedure.

#### Amount of reduction

- 33 ontologies are acyclic  $\mathcal{ELI}\text{-terminologies}$
- from 36 ontologies, up to 28 axioms were removed
- from 170 ontologies, 30–12,185 axioms were removed

#### Compare LBMs and MEX for this new corpus

### LBMs vs. MEX: result overview

- $\bullet$  Diffs MEX–LBMs in  $\sim 27\%$  of the preprocessed ontologies
- for these, no diffs syntactic-semantic LBM

Experiment	#ontol.	% tests	avg size	of diffs
	with diffs.	with diffs.	#axs	rel.
Random signatures	66	84%	0 - 26	0 - 13%
Axiom signatures	61	12%	0 - 13	0 - 80%

- Largest differences: Galen with 127 axioms (outlier)
- same differences occur for many seed signatures
   → probably caused by features of the ontology
- **Q**: Do the differences correlate with ontology size, expressivity, or amount of modification ( $\mathcal{ELI}$ -fication)?



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# LBMs vs. MEX: results by ontology measures

Group	#axioms removed	#ontologies	ontology si	ize (avg.)
1 unchanged ontologies $no \text{ diff. } \Delta \emptyset^* \setminus MEX$	0	33 (14%)	19-16,066	(2,176)
2 little-changed ontologies $no$ diff. $\Delta \emptyset^* \setminus MEX$	1-28	36 (15%)	13- 6,587	(466)
3 largely-changed ontologies $no \text{ diff. } \Delta \emptyset^* \setminus MEX$	31–7,836 (avg. 884)	104 (44%)	51 - 13,153	(2,373)
4 largely-changed ontologies with diff. $\Delta \emptyset^* \setminus MEX$ (4)	30–12,185 avg. 1,001)	66 (27%)	42–12,344	(1,843)

#### Differences correlate with

expressivity

(Group 1+2 mostly  $\mathcal{EL}$ ; Group 4 highly expressive, e.g., nominals)

 $\bullet$  amount of  $\mathcal{ELI}\mbox{-fication}$ 

(only "largely-changed" ontologies show differences)

• not with size

**Culprits**: equivalence axioms  $A \equiv C$ 

# Summary of module comparison

- Only 6 out of 242 ontologies showed non-trivial differences between semantic and syntactic LBMs
- These differences are small
- Theoretically hard semantic LBMs are often easy to compute
- $\bullet$  Only 66 out of 242  $\mathcal{ELI}\text{-fied}$  ontologies showed differences between LBMs and MEX
- Many of these differences are rather small

→ Cheap is cheerful!