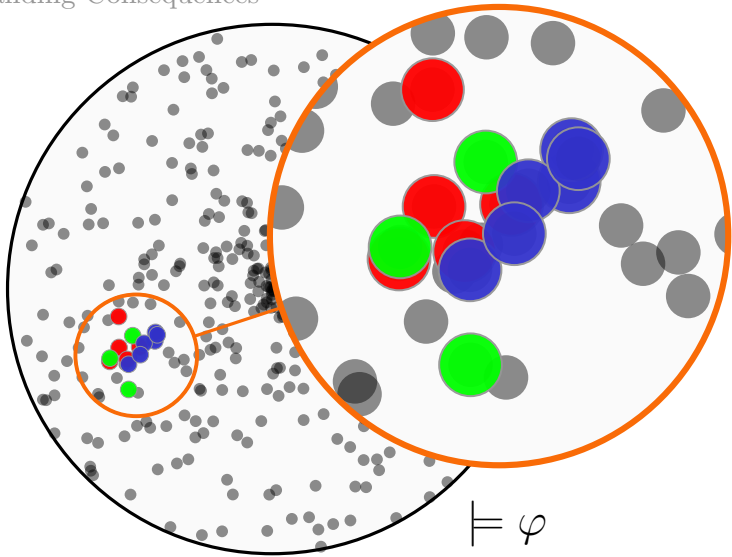


Lean Kernels in Description Logics

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Understanding Consequences

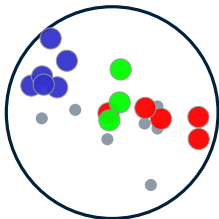


$$\mathbb{F} \varphi$$

Desiderata

Find sub-ontology \mathcal{K} such that:

- all (minimal) causes for φ are in \mathcal{K} (MinA preserving)
- is as small as possible (minimal irrelevance)
- efficiently computable



Propositional Logic

In propositional logic:

- **ontology**: set of clauses
- φ : unsatisfiability (empty clause)
- **MinA**: MUS

lean kernels approximate union of MUSes

Lean Kernels

Resolution combines two clauses to produce a new one
(entailed)

$$\left. \begin{array}{l} x_1 \vee x_2 \vee \neg x_3 \\ \neg x_2 \vee x_4 \vee \neg x_5 \end{array} \right\} \rightsquigarrow x_1 \vee \neg x_3 \vee x_4 \vee \neg x_5$$

Lean kernel of a (derived) clause c :
set of all clauses appearing in some derivation proof for c
(in particular, for empty clause)

Lean Kernels are Good

In propositional logic, LKs

- are fast to compute
- (over-)approximate the union of MUSes well

Generalize this idea to description logics?

Consequence-based Reasoning

Consequence-based methods make relevant consequences
explicit

Rules: $(\mathcal{B}_0, \mathcal{S}) \rightarrow \mathcal{B}_1$

take explicit knowledge (\mathcal{B}_0) and axioms (\mathcal{S})

produce more explicit knowledge (\mathcal{B}_1)

Subsumption in \mathcal{ALC}

\mathcal{ALC} Concepts:

$$C, D ::= A \mid \neg C \mid C \sqcap D \mid C \sqcup D \mid \exists r.C \mid \forall r.C$$

Ontology (in normal form): finite set of GCIs

$$A_1 \sqcap \dots \sqcap A_n \sqsubseteq B$$

$$A \sqsubseteq B_1 \sqcup \dots \sqcup B_n$$

$$\exists r.A \sqsubseteq B$$

$$A \sqsubseteq \exists r.B$$

$$A \sqsubseteq \forall r.B$$

Consequence-based Rules for \mathcal{ALC}

\mathcal{B}_0	\mathcal{S}	\mathcal{B}_1
$(H \sqcap \neg A, N \sqcup A)$	\emptyset	(H, N)
$(H, N_1 \sqcup A_1), \dots, (H, N_n \sqcup A_n)$	$A_1 \sqcap \dots \sqcap A_n \sqsubseteq B$	$(H, \bigsqcup_{i=1}^n N_i \sqcup B)$
$(H, N \sqcup A)$	$A \sqsubseteq \exists r.B$	(H, N, r, B)
$(H, M, r, K), (K, N \sqcup A)$	$\exists r.A \sqsubseteq B$	$(H, M \sqcup B, r, K \sqcap \neg A)$
$(H, M, r, K), (K, \perp)$	\emptyset	(H, M)
$(H, M, r, K), (H, N \sqcup A)$	$A \sqsubseteq \forall r.B$	$(H, M \sqcup N, r, K \sqcap B)$

H, K conjunctions of literals M, N disjunctions of literals

$$(H, M) \rightsquigarrow H \sqsubseteq_{\mathcal{T}} M$$

$$(H, N, r, K) \rightsquigarrow H \sqsubseteq_{\mathcal{T}} N \sqcup \exists r.K$$

Lean Kernels for Consequence-based Algorithms

Given

consequence-based algorithm C

ontology \mathcal{T}

consequence φ

Lean kernel of φ w.r.t. \mathcal{T} , C :

set of all axioms of \mathcal{T} appearing in some C -proof of φ

Example

\mathcal{B}_0	\mathcal{S}	\mathcal{B}_1
$(H, N_1 \sqcup A_1), \dots, (H, N_n \sqcup A_n)$	$A_1 \sqcap \dots \sqcap A_n \sqsubseteq B$	$(H, \bigsqcup_{i=1}^n N_i \sqcup B)$
$(H, N \sqcup A)$	$A \sqsubseteq \exists r.B$	(H, N, r, B)
$(H, M, r, K), (K, N \sqcup A)$	$\exists r.A \sqsubseteq B$	$(H, M \sqcup B, r, K \sqcap \neg A)$
$(H, M, r, K), (K, \perp)$	\emptyset	(H, M)

$$\text{ax}_1 = A \sqsubseteq B$$

$$\text{ax}_2 = A \sqsubseteq \exists r.A$$

$$\text{ax}_3 = \exists r.B \sqsubseteq B$$

$$\text{ax}_4 = B \sqsubseteq C$$

$$\text{ax}_5 = A \sqsubseteq \exists s.C$$

$$\text{ax}_6 = \exists s.A \sqsubseteq B$$

R_1	(A, A)	$A \sqsubseteq B$	(A, B)
R_2	(A, A)	$A \sqsubseteq \exists r.A$	(A, \emptyset, r, A)
R_3	$(A, \emptyset, r, A), (A, B)$	$\exists r.B \sqsubseteq B$	$(A, B, r, A \sqcap \neg B)$
R_4	$(A, B, r, A \sqcap \neg B), (A \sqcap \neg B, \perp)$	\emptyset	(A, B)
R_5	(A, B)	$B \sqsubseteq C$	(A, C)

LK Extensions

CB algorithms can be extended to compute LKs:

- attach derived consequences with set of axioms used
- apply rules until saturation
- update set of repeated consequences

Properties:

- produce LKs for **all** relevant consequences
- only a **linear** overhead
- MinA preserving

Example

1	(A, A)	$A \sqsubseteq B$	(A, B)	$\{1\}$
2	(A, A)	$A \sqsubseteq \exists r.A$	(A, \emptyset, r, A)	$\{2\}$
3	$(A, \emptyset, r, A), (A, B)$	$\exists r.B \sqsubseteq B$	$(A, B, r, A \sqcap \neg B)$	$\{1, 2, 3\}$
4	$(A, B, r, A \sqcap \neg B), (A \sqcap \neg B, \perp)$	\emptyset	(A, B)	$\{1, 2, 3\}$
5	(A, B)	$B \sqsubseteq C$	(A, C)	$\{1, \dots, 4\}$
6	(A, A)	$A \sqsubseteq \exists s.C$	(A, \emptyset, s, C)	$\{5\}$

Evaluation

Computed the LKs for **all** atomic subsumptions from
five well-known \mathcal{EL}^+ ontologies:

\mathcal{T}	# axioms	$ \text{class}(\mathcal{T}) $
GENE	20466	164743
NCI	46800	252519
NOT-GALEN	4379	27980
FULL-GALEN	36544	453674
SNOMED-CT	307704	5333580

Total: more than 6M LKs

Good Approximation?

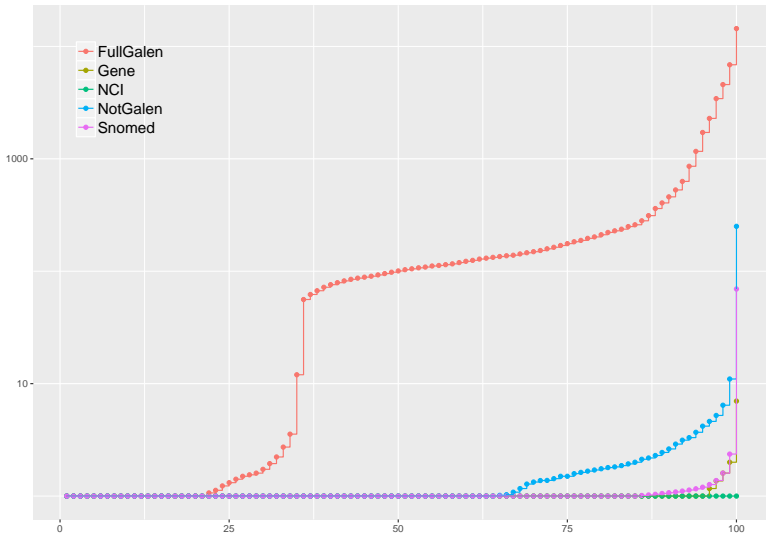
Compare to **locality-based modules** (MinA preserving)

Formally:

$$\text{UMinAs} \subseteq \text{LK} \subseteq \perp T^* \subseteq \perp$$

In practice?

Proportional Improvement vs. Star-module

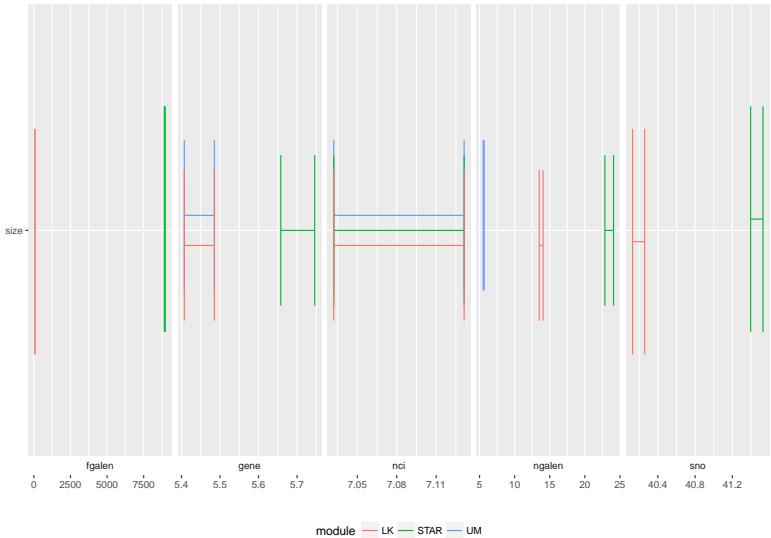


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LKs in DLs

16

99.9% Confidence Intervals Do Not Overlap



Efficiently Computable?

\mathcal{T}	LKs	\perp			$\perp\mathcal{T}^*$		
		Min	Avg	Max	Min	Avg	Max
GENE	1.98	0.00	0.01	0.04	0.00	0.01	0.06
NCI	3.79	0.00	0.01	0.10	0.01	0.02	0.13
NGALEN	4.22	0.00	0.01	0.02	0.00	0.01	0.03
FGALEN	461.03	0.00	0.36	1.12	0.02	2.46	8.06
SNOMED	11200.53	0.11	0.65	5.34	0.26	3.91	28.92

For **5.3 M** consequences!

Conclusions

Lean Kernels approximate union of MinAs

can be effectively computed for **all** consequences
(linear overhead)

Want a more goal directed approach?
compute LK from \perp -module

Questions?