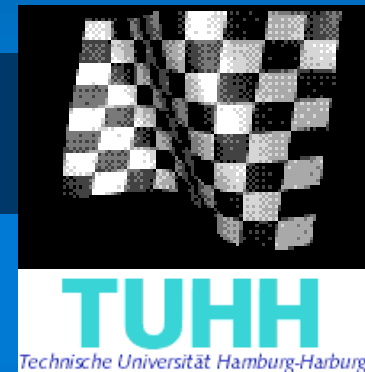


# The Ins and Outs of Racer



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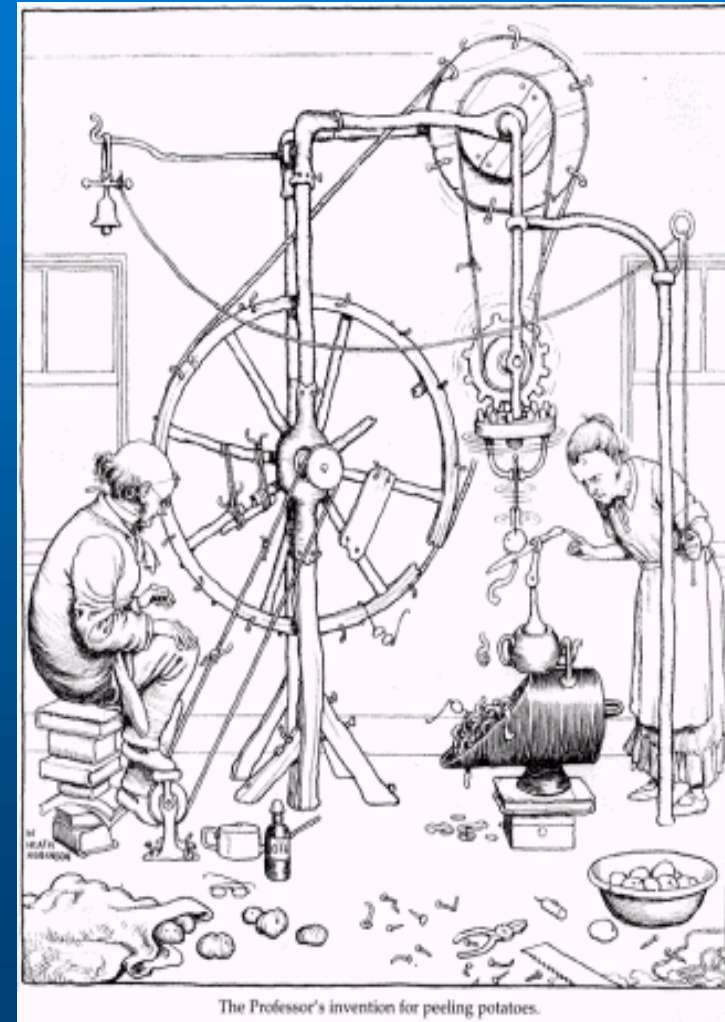
**Concordia University, Montreal**

# Racer

- **Logic SHIQ( $D_n$ )-**
  - ALC, transitive roles, role hierarchies, inverses, qualified number restrictions
  - Concrete domains without feature paths
- **T-boxes (with GCIs)**
- **A-boxes (each associated with a T-box)**
  - Set of assertions of the form
    - $i:C$
    - $(i, j):R$

# Views on the Architecture

- Racer as a tool for ontology management (T-box)
- Racer as a testbed for AI/DB research (T-box, A-box, ...)
- Racer as part of applications (interfaces)



# Inference Problems

- **T-box**

- Parents, Children, Synonyms

- **A-box**

- Consistency

- Instance test  $i :? C$

- Instance retrieval  $\{i \mid i \text{ mentioned in } A, i :? C\}$

# Overview of the Talk

- **The engines under the hood**
- **Supporting classification**
  - E.g. for ontology development
- **Supporting instance retrieval**
  - E.g. for NL interpretation

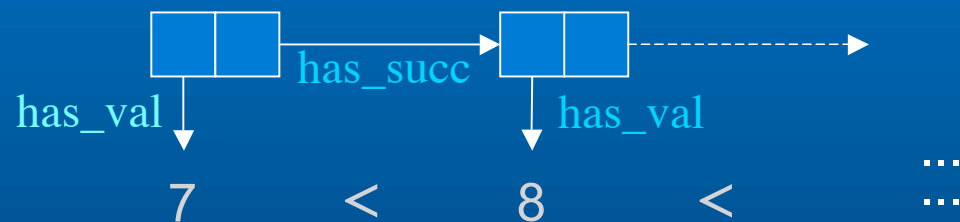
# The Engines Under the Hood ...

- **Tableau prover for deciding A-box consistency for the logic SHIQ( $D_n$ )** [Hor-Sat-Tob, BaHo, HaMo]
- **Additional provers for various algebraic structures and formalisms [...]**

$\mathbb{N}$	linear inequations with order constraints and integer coefficients
$\mathbb{Z}$	interval constraints
$\mathbb{R}$	linear inequations with order constraints and rational coefficients
$\mathbb{C}$	nonlinear multivariate inequations with integer coefficients
Strings	equality and inequality

# Concrete Domains

- What cannot be expressed in Racer at the conceptual level due to syntax restrictions?



- No restrictions on A-box structures

# Natural Numbers (Cardinals)

```
(define-concrete-domain-attribute year :type cardinal)
(define-concrete-domain-attribute days-in-month :type cardinal)

(implies Month (and (>= days-in-month 28) (<= days-in-month 31)))

(equivalent month-inleapyear
  (and Month
    (divisible year 4)
    (or (not-divisible year 100)
        (divisible year 400))))

(equivalent February
  (and Month
    (<= days-in-month 29)
    (or (not month-inleapyear)
        (= days-in-month 29))
    (or month-inleapyear
        (= days-in-month 28))))
```



# Constraints and Queries

```
(instance feb-2003 February)
(constrained feb-2003 year-1 year)
(constrained feb-2003 days-in-feb-2003 days-in-month)
(constraints (= year-1 2003))
```

```
(instance feb-2000 February)
(constrained feb-2000 year-2 year)
(constrained feb-2000 days-in-feb-2000 days-in-month)
(constraints (= year-2 2000))
```

- (concept-instances month-in-leapyear)
- (concept-instances (not month-in-leapyear))
- (constraint-entailed? (= days-in-feb-2000 29))
- (constraint-entailed? (<=> days-in-feb-2003 29))

# There's more to Racer ...

- ... than a collection of optimized (inference) engines
- For many inference problems:
- **Motto: Avoid using the optimized tableaux prover (and the other provers) at all!**
- So, exploit given information,
  - (implies  $a$  (and  $b$   $c$  (some  $r$   $D$ )))
- ... and do not compute anything twice
- Nevertheless: the tableau prover is important

# Some Optimizations

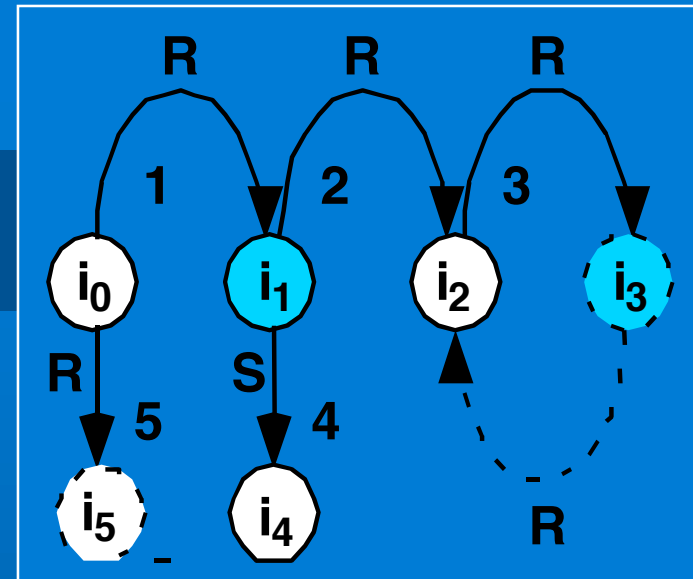
- **Inspired by FaCT [Horrocks]  
(but Racer does it for A-boxes)**
  - **Dependency-directed backtracking**
  - **Semantic branching, BCP**
  - **Caching, model merging**
    - **notion of a pseudo model**
  - **Optimized blocking  
(partially implemented in Racer)**

# Optimizations specific to Racer

- **SAT and ASAT reasoning**
  - Language-adaptive selection of applicable optimization techniques
  - Dependency-directed backtracking (also for concrete domain reasoning)
  - Extended caching (in particular, satisfiable concepts)
  - Process qualified number restrictions with
    - Simplex procedure (concept consistency)
    - Signature calculus
  - Incremental constraint solving (mostly)

# Pitfalls in Caching

- Assume a pseudo model for concept D is cached in step 7, i.e. D is satisfiable
- After step 8 concept C is marked as unsatisfiable
- The cache entry for D is still marked as satisfiable
- After backtracking to step 2, we proceed with step 9 and erroneously cache a pseudo model for concept E, i.e. E is satisfiable
- The cache entry of D depends on C and must be invalidated if C is marked as unsatisfiable



$$E \sqsubseteq (\exists R.C) \sqcup (\exists R.D)$$

$$C \sqsubseteq (\exists R.D) \sqcap (\exists S.X) \sqcap \forall S.(\neg X \sqcap A)$$

$$D \sqsubseteq \exists R.C$$

1.  $\{i_0 : E\}$
2.  $\{i_0 : E, i_0 : \exists R.C\} \vee \{i_0 : E, i_0 : \exists R.D\}$
3.  $\{i_1 : C\}$
4.  $\{i_1 : C, i_1 : \exists R.D, i_1 : \exists S.X, i_1 : \forall S. \neg X \sqcap A\}$
5.  $\{i_2 : D\}$
6.  $\{i_2 : D, i_2 : \exists R.C\}$
7.  $\{i_3 : C\}$
8.  $\{i_4 : X, i_4 : A, i_4 : \neg X\}$
9.  $\{i_5 : D\}$

# Dealing with Qualifying Number Restrictions

- (-> ALCQ [Baader-Hollunder])
- Additional level of nondeterminism
- Basically: for each ( $\leq n R C$ )  
try either  $C$  or  $\sim C$  for each filler of  $R$   
where  $\sim C$  is the negation normal  
form of (not  $C$ )
- Merge fillers as appropriate

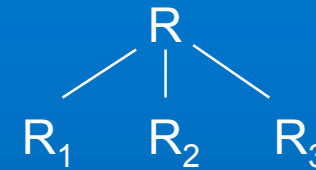
# Standard Tableau Rules

- **At least rule:**  $\Box_{\geq n} R.C$ 
  - if necessary, create  $n$  distinct  $R$ -successors which become members of  $C$
- **At most rule:**  $\Box_{\leq n} R.C$ 
  - if there exist more than  $n$   $R$ -successors which are members of  $C$ , then merge two (non-distinct) of these  $R$ -successors
- **Choose rule:**
  - if there exists an  $R$ -successor whose membership for  $C$  or  $\sim C$  is unknown, determine whether this successor is a member of  $C$  or  $\sim C$

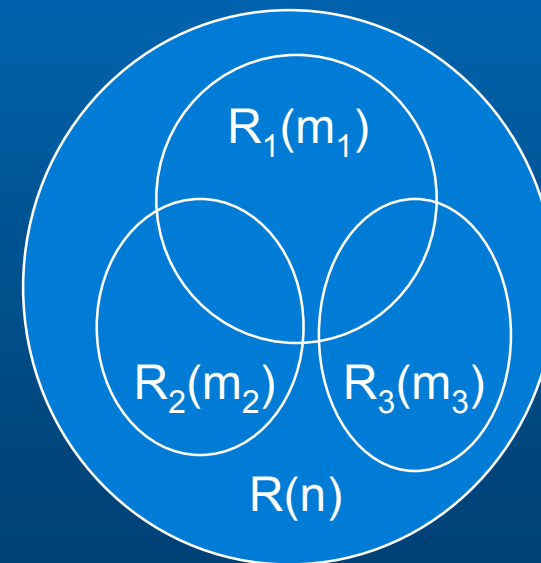
- **Treatment of numbers is highly inefficient**
- **Individual-wise computation of set cardinalities**
- **No representation of sets**
- **Blind search tries to fulfill at least and at most restrictions**

# Standard Tableaux Rules: Example

- Assume  $n=3$ ,  $m_1=2$ ,  $m_2=2$ ,  $m_3=2$
- $(a,b_1):R_1$ ,  $(a,b_2):R_1$ ,  $(a,c_1):R_2$ ,  
 $(a,c_2):R_2$ ,  $(a,d_1):R_3$ ,  $(a,d_2):R_3$ ,  
 $c_1:C$ ,  $c_2:C$ ,  $d_1:\neg C$ ,  $d_2:\neg C$ ,  
 $b_1 \neq b_2$ ,  $c_1 \neq c_2$ ,  $d_1 \neq d_2$
- 6 R-successors, only 3 allowed
- Try to replace  $b_1$  with  $c_1$ , or  $c_2$ , or  
 ...
- After replacing  $b_1$  with  $c_1$ :  
 $(a,c_1):R_1$ ,  $(a,b_2):R_1$ ,  $(a,c_1):R_2$ ,  
 $(a,c_2):R_2$ ,  $(a,d_1):R_3$ ,  $(a,d_2):R_3$ ,  
 $c_1:C$ ,  $c_2:C$ ,  $d_1:\neg C$ ,  $d_2:\neg C$ ,  
 $c_1 \neq b_2$ ,  $c_1 \neq c_2$ ,  $d_1 \neq d_2$
- ...
- Eventually the calculus recognizes the unsatisfiability



$$\exists_{<n} R \sqcap \exists_{>m_1} R_1 \sqcap \exists_{>m_2} R_2 \sqcap \exists_{\geq m_3} R_3 \sqcap \forall R_2 . C \sqcap \forall R_3 . \neg C$$





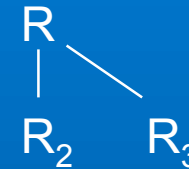
# Idea: Use Gomory Algorithm

- Inspired by work of [Ohlbach]
- Compute system of linear equations
- Integrated into tableau prover for dealing with concept consistency
- Simplex procedure cannot be (naively) applied for deciding full A-box consistency
- Another idea: Use placeholders
  - > Signature Calculus

# Computation with Placeholders...

- ...cannot be done in a simple way:

$$\exists_{\leq n} R \sqcap \exists_{\geq m_2} R_2 \sqcap \exists_{\geq m_3} R_3 \sqcap \forall R_2 . C \sqcap \forall R_3 . \neg C$$



- Automatic generation of required placeholders for subroles

- New kind of constraint:  $(ind_1, ind_2): \langle n, \{R, S, \dots\} \rangle$

- $(i, j): \langle m_2, \{R_2\} \rangle$ ,  $(i, k): \langle m_3, \{R_3\} \rangle$

Signature

- $j:C$ ,  $k:\neg C$

- Signature merge rule:

- $(i, l): \langle 1, \{R_2, R_3\} \rangle$ ,  $(i, j): \langle m_2 - 1, \{R_2\} \rangle$ ,  $(i, k): \langle m_3 - 1, \{R_3\} \rangle$

Eliminated if zero

- or

- $(i, l): \langle p + 1, \{R_2, R_3\} \rangle$ ,  $(i, j): \langle m_2 - 1, \{R_2\} \rangle$ ,  $(i, k): \langle m_3 - 1, \{R_3\} \rangle$

- $l:C$ ,  $l:\neg C$

# Additional Rules

- **Choose rule**
- **Additional clash triggers**

# Dealing with Inverse Roles and A-boxes

- Use of the A-box reasoning kernel to deal with inverse roles
- Blocking (-> see SHIQ-Papers [Horr-Satt-Tob])
  - dynamic blocking, pairwise blocking
- No trace technique, additional role constraints
- If something is "propagated back", all constraints are recomputed (within backtracking context!)
- Caveat: technique relies on caching
- Caching techniques still have to be devised for inverse roles

# Dependencies and Pseudo Models

- If an A-box is consistent, generate a pseudo model for each individual
- If an A-box is inconsistent, collect those assertions that were involved in a clash in all branches of the search tree

# Concrete domain reasoners

- **Simplex algorithm (incremental)**
  - for linear inequations with orders over the reals
  - for min/max restrictions over the integers
- **Gomory algorithm**
  - for linear inequations with orders over cardinals
- **Groebner Bases, Buchberger algorithm**
  - for multivariate non-linear inequations over complex numbers
- **String (in)equation solver**

# Optimizations for Concrete Domains

- Incremental constraint solving for R
- Dependency-directed backtracking
- Keep constraint systems minimal
- Avoiding copies of constraint systems during backtracking
- Use Simplex as preprocessor for N

# Overview of the Talk

- The engines under the hood
- **Supporting classification**
  - E.g. for ontology development
  - Finding synonyms of \*bottom\*
- Supporting instance retrieval

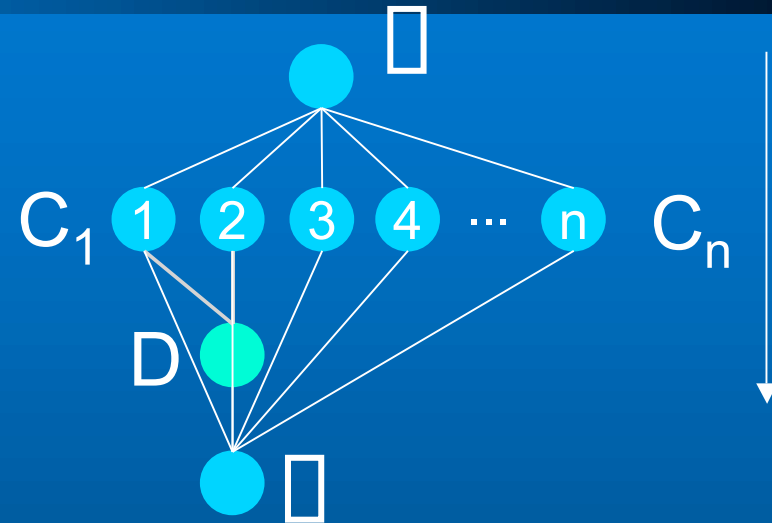


# Ontology Development: T-boxes

- **Optimizations of**
  - KRIS [Baader et al.] (taxonomy, lazy unfolding)
  - FaCT [Horrocks]  
(GCI absorption, model merging)
- **Optimizations specific to Racer:**
  - Different transformation of general axioms
    - domain and range restrictions
    - lazy unfolding of negated atomic concepts
  - Determine classification order  
(topological sorting)
  - Clustering of nodes

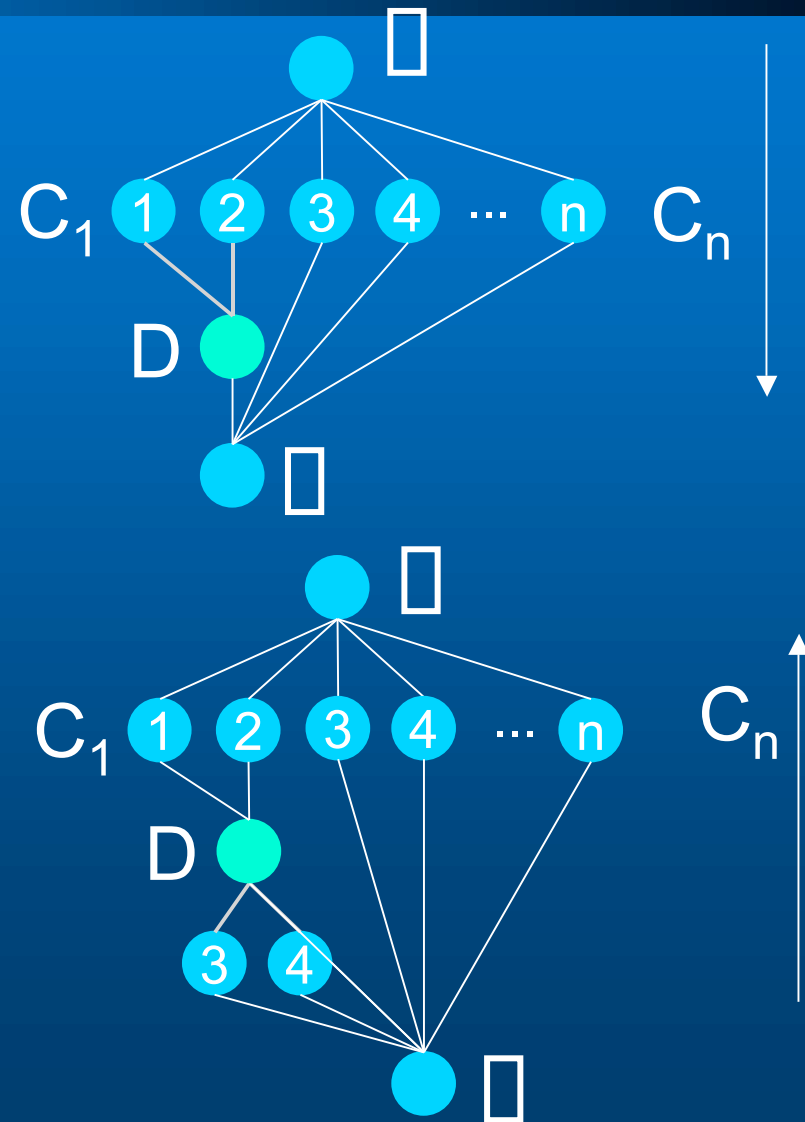
# TBox Classification: Inserting a Concept

- Insert new concept D into existing taxonomy w.r.t subsumption relationship
- 1. Top-search phase
  - traverse from top
  - determine parents of D
    - $C_1$  and  $C_2$
  - $\text{SAT}(\neg C_1 \sqcap D), \dots, \text{SAT}(\neg C_n \sqcap D)$
- 2. Bottom-search phase
  - traverse from bottom
  - determine children of D
    - $C_3$  and  $C_4$
  - $\text{SAT}(C_1 \sqcap \neg D), \dots, \text{SAT}(C_n \sqcap \neg D)$



# TBox Classification: Inserting a Concept

- Insert new concept **D** into existing taxonomy w.r.t subsumption relationship
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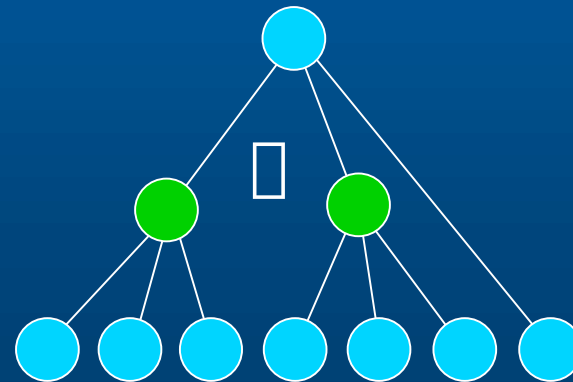
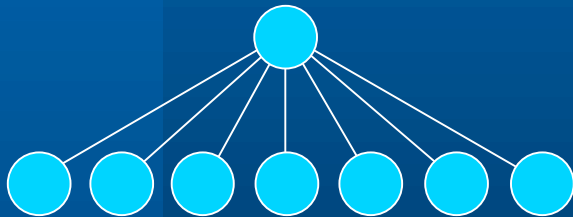


# Topological Sorting

- GCI absorption yields only primitive concept definitions
- Definition order
- Bottom-search phase can be omitted
- But: Beware of cycles
- Refers-to relation
- Sets of concept names
- Quasi definition order
- Serialization of the partial order

# Clustering

- Introduce virtual concepts (buckets)
- Reduce the no. of children
- $\square = 10$  : max no. children without bucket
- $\square = 15$  : max no. of buckets per concept
- Possibly: restructuring necessary



# Domain and Range Restrictions

- $A \sqsubseteq C$  (all  $x . x$ : (or (not A) B))
- Lazy Unfolding:  $A \sqsubseteq C, A = C$
- Generalized Lazy Unfolding:
  - (some R. top)  $\sqsubseteq C$       **domain restriction**
  - top  $\sqsubseteq$  (all R. C)      **range restriction**
- To be considered
  - for model merging
  - for the refers-to relation

# Hard for Racer ...

... and probably other tableau reasoners

- **Qualified domain and range restrictions**
  - (some R. D)  $\sqsubseteq$  C
  - D  $\sqsubseteq$  (all R. C)
- **Cycles**  
(even if no meta constraints remain)
- **Inverse roles**  
(no caching,  
more complex blocking condition)

# Overview of the Talk

- The engines under the hood
- Supporting classification
- **Supporting instance retrieval**
  - E.g. for NL interpretation, Semantic Web, etc.



# Optimizations specific to Racer

- **A-box reasoning**
  - graph transformation
  - fast non-instance test based on pseudo models for concepts and individuals
  - dependency-driven divide-and-conquer for instance checks
  - fast candidate elimination by subsumption-based caching

# Instance retrieval

- Given an A-box  $A$ , a T-box  $T$ , and a concept  $C$ , find those individuals  $i$  mentioned in  $A$  for which it can be shown that  $i \sqsubseteq C$  for all models  $I$  of  $T$ .
- Different types of applications
  - One single "static" A-box  
lots of queries
  - Many A-boxes wrt. a single T-box,  
A-boxes computed on the fly,  
few queries for each A-box, result set small  
(example: NL application)

# Linear instance retrieval

- Collect each  $i$  mentioned in  $A$  s.t.  $\text{instance?}(i,C)$
- $\text{instance?}(i,C) = \neg \text{ASAT}(A \sqcup \{i:\neg C\})$
- "Expensive" ASAT test
- Guards required
  - individual model merging possible,  $\text{individual-concept}(i)$
  - $\text{subsumes?}(\neg C, \text{individual-concept}(i))$
- "Expensive" ASAT test only if guards do not indicate non-instance result for  $i$

# Binary instance retrieval

- **Observation:**
  - One individual considered at a time
- **New idea: consider sets of individuals at a time**
  - Take a set of candidates  $\{i, j, k, \dots\}$  (which are assumed to be instances of  $C$ ) and check the result of  $ASAT(A \sqcup \{i:\neg C, j:\neg C, k:\neg C, \dots\})$
  - If "yes"  $\rightarrow$  all candidates are ruled out
  - If "no"  $\rightarrow$  partition the set of candidates (binary partition) and recurse until a singleton set of candidates is derived

# Dependency-based instance retrieval

- If  $ASAT(A \sqcup \{i:\neg C, j:\neg C, k:\neg C, \dots\})$  returns "no"
- and during all attempts to construct a completion, there is only one individual involved in a clash according to dependency tracking,
  - then this individual can be removed from the set of candidates. It is a member of the result set.
  - else if more than one individual is involved: partition the set of candidates and recurse until a singleton candidate set is derived

# Index-based instance retrieval

- **Index:**

- **associated\_inds:**

- Set of concept names  $\rightarrow$  P(Set of inds)

```
if  $\exists N \in CN : N \in synonyms(C)$  then
  return  $\bigcup_{D \in descendants(C)} associated\_inds(D)$ 
else
  known_results :=  $\bigcup_{D \in descendants(C)} associated\_inds(D)$ 
  candidates :=  $\bigcup_{P \in parents(C)} (\bigcup_{D \in descendants(P)} associated\_inds(D))$ 
  return  $known\_results \cup instance\_retrieval(C, A, candidates \setminus known\_results)$ 
end if
```

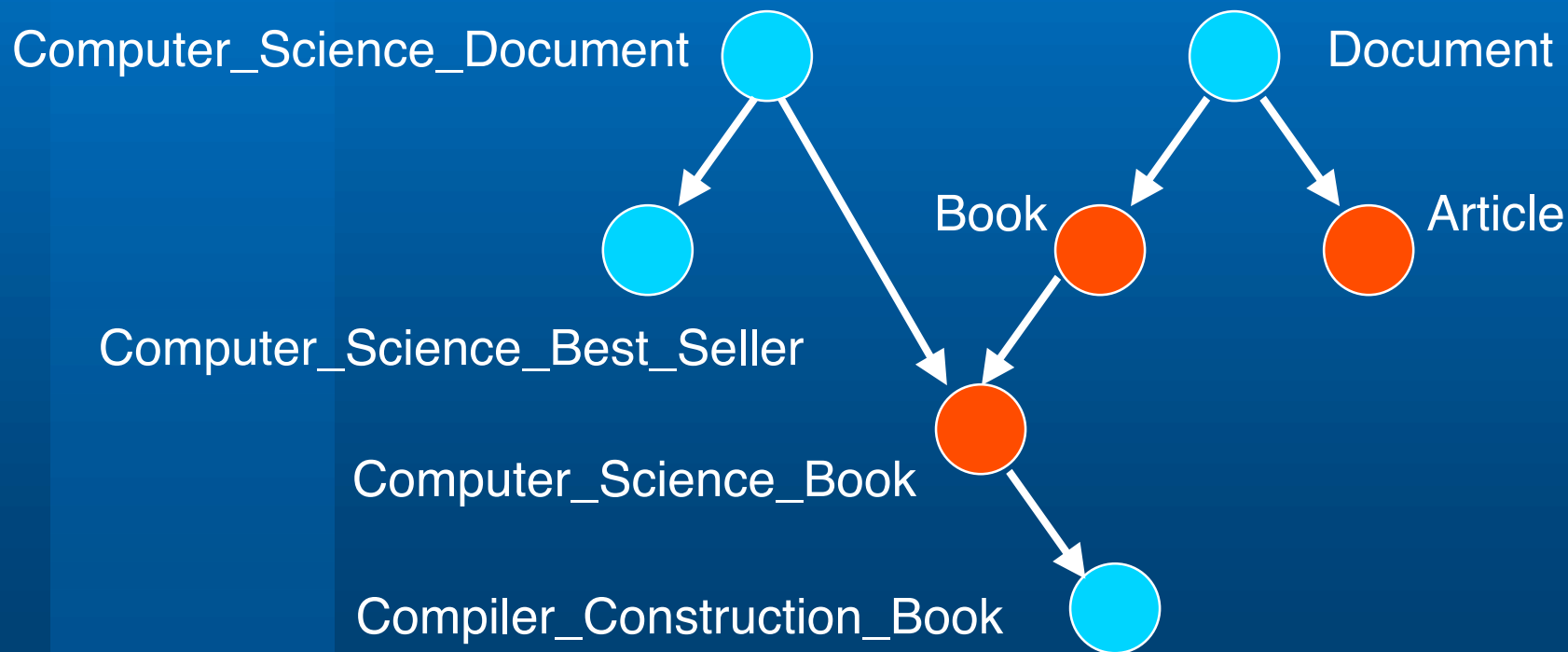
- **Index associated\_inds is expensive to compute**

# Index computation:

- **One-individual-at-a-time approach**
- **Sets-of-individuals-at-a-time approach**

# Partial Indexing

- Racer Server running with **subsumption-based instance retrieval** enabled





# Partial Indexing

- **Index computation** from
  - Initial A-box instance assertions
  - Previous instance retrieval queries
  - Previous queries for the direct types of an individual

# Retrieval: Exploiting the Index

- Find **known results**
  - Collect individuals from descendants
- Find **candidates**
  - Collect individuals from ancestors
- Find **non-candidates**
  - Collect those candidates for which the direct-types are known and less specific than query concept C
  - Collect those candidates that previously did not qualify to to instances of an ancestor concept

# Conclusions

---

- **Racer is more than a tableau prover**
- **Tableau prover returns more than "satisfiable" or "not-satisfiable"**
- **Dealing with A-boxes causes overhead for pure concept consistency**
- **Many optimizations:  
No single trick does the job!**
- **Extensions become harder and harder...**

# Future Work



- Optimizations for filler retrieval
- Feature chains in predicate exists restrictions (with restr. on GCIs)
- UNA optional
- Nominals
- Incremental A-box reasoning
- Output of models
- Acyclic role axioms