Search for More Declarativity

Backward Reasoning for Rule Languages Reconsidered

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25 October 2009



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 - What is the problem?
 - How is the problem solved?
- Built-in problem-solving
 - ⇒ Allows to concentrate on problem-specification
- Add and modify rules easily
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- Finding solutions where no explicit algorithm is known
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- a search method which
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- forward vs. backward reasoning
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 - Forward reasoning approaches with some goal guidance

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Desiderata for Search Methods

Completeness on finite and infinite search trees.

Every node in the search space is visited after a finite number of steps.

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Polynomial space complexity O(d^c)
c = constant
d = maximum depth reached so far
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Incomplete on infinite trees

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Exponential space-complexity in the depth of the tree

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Frequent re-evaluation

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Sensible Compromise? (Prolog)

- Use D-search
- Give rule authors some control to avoid infinite dead ends (e.g. ordering of the rules, ...)

Declarativity gets lost

Rule Languages & Declarativity Rule Languages & Search Desiderata for Search Methods Search & Declarativity

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Search & Declarativity

Term Representation for Natural Numbers

- zero represents 0
- succ(X,Y) can provide the predecessor X to any Y representing a nonzero natural number

Program

Problem 1 – Incomplete Enumerations

Program

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\begin{array}{lll} \mathtt{nat}(\mathtt{zero}) & \leftarrow \\ \mathtt{nat}(\mathtt{Y}) & \leftarrow & \mathtt{succ}(\mathtt{X},\mathtt{Y}) \ \land \ \mathtt{nat}(\mathtt{X}) \\ \mathtt{nat}_2(\mathtt{X},\mathtt{Y}) & \leftarrow & \mathtt{nat}(\mathtt{X}) \ \land \ \mathtt{nat}(\mathtt{Y}) \\ \mathtt{less}(\mathtt{X},\mathtt{Y}) & \leftarrow & \textit{"reasonably defined"} \end{array}
```

Queries

- $0 \leftarrow nat(X)$
- $2 \leftarrow nat_2(X,Y)$

Expected Results

- Enumeration of N
- \bigcirc Enumeration of $\mathbb{N} \times \mathbb{N}$

- Enumeration of N
- 2 Enumeration of $\{0\} \times \mathbb{N}$



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Queries

(Assume Single-Answer-Mode)

- $2 \leftarrow nat_2(X,Y) \land less(zero,X)$

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- No answer (does not terminate)

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Reason – Incomplete Search

SLD-resolution is fine

Perfectly sound and complete with any literal selection function.

Problem: Incompleteness of D-searchlems would not arise with a complete search method

Choose iterative deepening?

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\leftarrow constant(X) \land even(X)
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constant(X) binds X to some fixed, large number $n \in \mathbb{N}$.

Expected Runtime

linear, O(n)

Runtime with Iterative-Deepening



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- Integrates D-search and B-search
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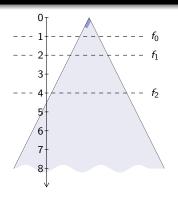


Overview

- D&B-search
- Search & Partial Ordering
- 3 Conclusion

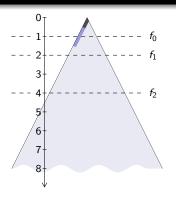
D&B-search

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 - The Basic Algorithm
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- Search & Partial Ordering
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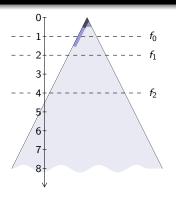


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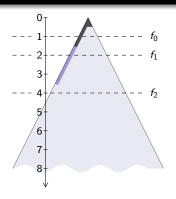
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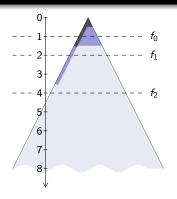
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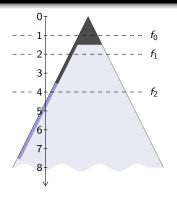
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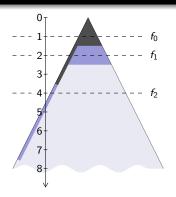
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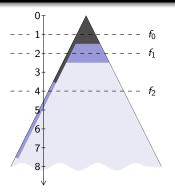
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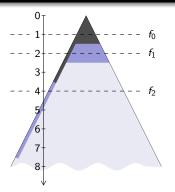
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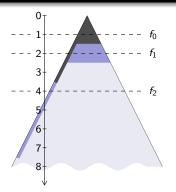
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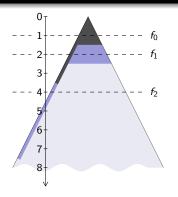
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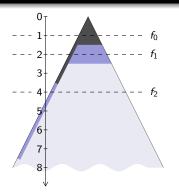


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- The number of nodes to be stored is only polynomial in the maximum depth (if f_i is exponential in i)



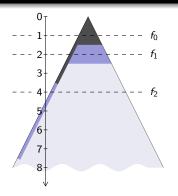


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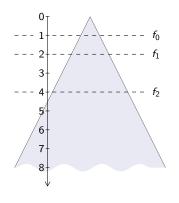
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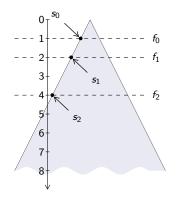


D&B-search - Idea

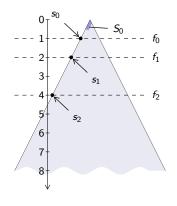
- Alternate D-search with B-search
- Rotation is controlled by a sequence f_0, f_1, f_2, \ldots of depth bounds
 - Defined by a function $\mathbb{N} \to \mathbb{N}$, $i \mapsto f_i$
 - $i < f_i < f_{i+1}$
 - $f_i = 2^i$ for the examples



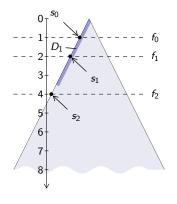
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- Inter-pivot-set $S_{i+1} = (D_i \cup B_i) \setminus X_i$ is expanded in-between s_i and s_{i+1}
- $\bullet \ X_i = S_0 \cup s_0 \cup \ldots \cup S_i \cup s_i$
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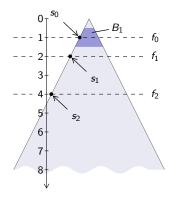
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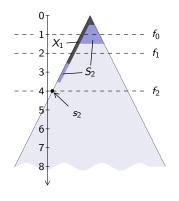
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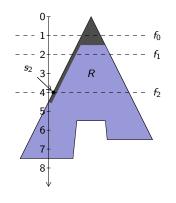
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- Inter-pivot-set $S_{i+1} = (D_i \cup B_i) \setminus X_i$ is expanded in-between s_i and s_{i+1}
- $\bullet \ X_i = S_0 \cup s_0 \cup \ldots \cup S_i \cup s_i$
- *Post-pivot-set R* : the rest of the nodes



- Pivot-node s_i : earliest node at depth f_i
- Pre-pivot-set S_0 : nodes earlier than s_0
- D_i : nodes earlier than s_{i+1}
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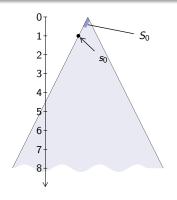


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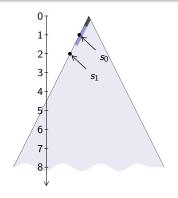


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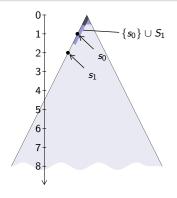
D&B-search – Complete Infinite Tree



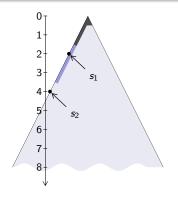
- D-search expands all nodes in S_0
- D-search passes s_0
- S_1 is finished
- D-search passes s₁
- B-search expands the rest of B_1
- S_2 is finished
- D-search passes s₂
- B-search expands the rest of B_2
- S_3 is finished



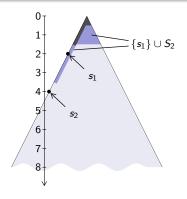
- D-search expands all nodes in S_0
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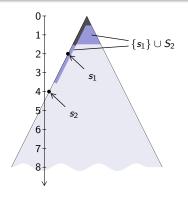
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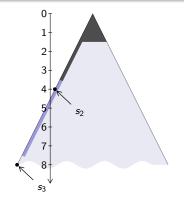
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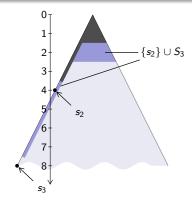
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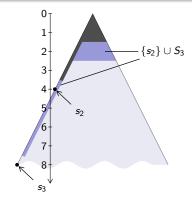
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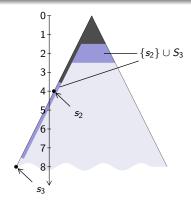
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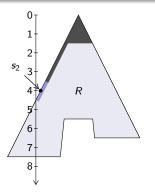


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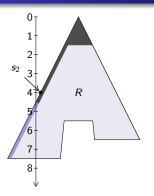
Observation

D&B-search expands the nodes in the order

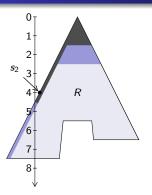
$$S_0, s_0, S_1, s_1, \ldots, S_i, s_i, \ldots, R$$



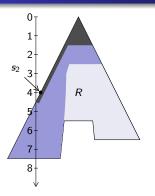
- S_2 is finished
- D-search expands s_2
- D-search reaches the max. depth in R
 (no s₃ in this tree)
- B-search may complete B_2
- D-search continues R
- D-search continues R
- D-search finishes R
- Search is finished



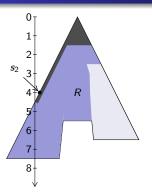
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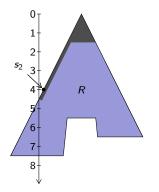
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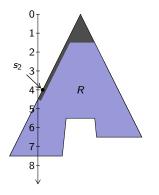
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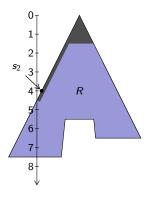
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- Most of the tree is expanded by D-search

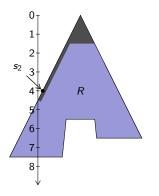




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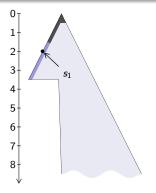
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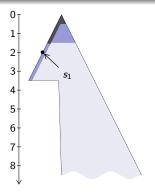


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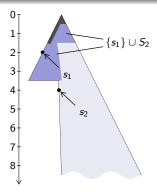
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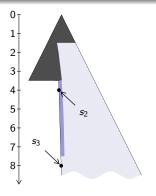
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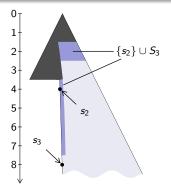
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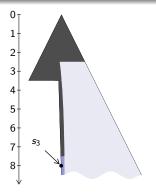
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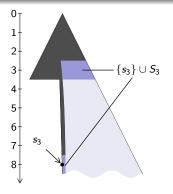
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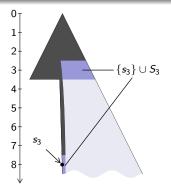
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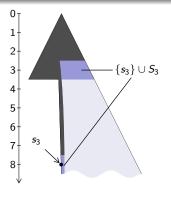


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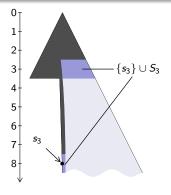
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D&B-Search

- behaves almost like D-search on finite trees
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- ⇒ has a kind of built-in adaptivity behaves like the "best" uninformed search method for the tree

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Assume that the tree's branching factor is bounded by $b \in \mathbb{N}$

- Parameterise the function f_i with $c \in \mathbb{N} \cup \{\infty\}$
- Idea: $f_{c,i} := \lfloor b^{\frac{i}{c}} \rfloor$
- To get monotonicity: $f_{c,i} := \lfloor b^{\frac{t}{c}} \rfloor + i$

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Properties

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- For $1 \le c < \infty$ its space complexity is $O(d^c)$
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- 1 D&B-search
- Search & Partial Ordering
- 3 Conclusion

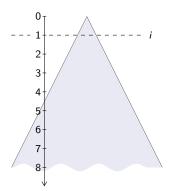
- Transforms problems on search algorithms to problems on partial orderings
- Idea: Nodes ordered by their first occurrence
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 - precise notation
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- Powerful characterization of completeness
- Finite and infinte trees are covered uniformly

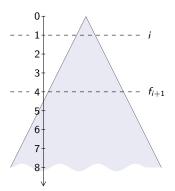
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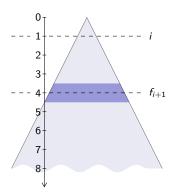
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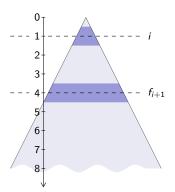
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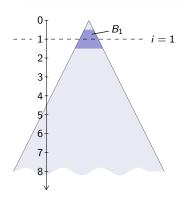






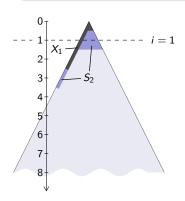


A search algorithm is complete iff for each depth i there is a depth $f_{i+1} > i$ so that none of the nodes at depth f_{i+1} is expanded before every node at depth i has been expanded.



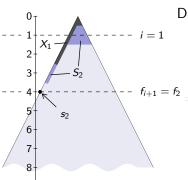
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- ⇒ D&B-search is complete

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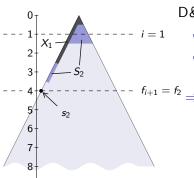


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Conclusion

- 1 D&B-search
- Search & Partial Ordering
- 3 Conclusion

- Novel Search method: Integrating D-search and B-search
- Ratio of D-search and B-search balanced by a parameter
- Family of algorithms in parameter c
 - D-search and B-Search as borderline cases
 - Complete in all non-borderline cases
 - Non-repetitive, i.e. time complexity is linear in size
 - Space complexity is polynomial in depth. Polynomial depends on parameter *c*
- Formal proofs of these properties
- Built-in adaption to the searched tree
- Better than running D-Search and B-Search in parallel
- Implementation in form of detailed pseudo-code
 - → only simple datastructures needed



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Theoretical-Framework

- Based on partial orderings
- Covers finite and infinite trees uniformly
- High analytic power, concise and precise proofs

Future work

- Combine D-search and iterative deepening to D&I-search by the same principle
 - Behaves (almost) like D-search on finite trees
 - Behaves (almost) like iterative-deepening on infinite trees
 - ullet Achieved by the same depth bounds f_i as for D&B-search
- Same for other combinations
- Prototype implementation
- Empirical comparison to other uninformed search methods
 - → Focus: Logic programming applications using backward reasoning approaches with and without memorization

Thank You