# Subsumption, Recursive Split and Greedy Pebbling

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### Overview

Introduction

Subsumption algorithms

Recursive Split

Greedy pebbling

# Propopositional Resolution Calculus

#### Literal

ightharpoonup Variable v or negated variable  $\bar{v}$ 

#### Clause

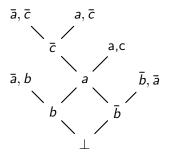
- Disjunction of literals
- Represented as a set

#### Resolution rule

$$\frac{\Gamma \vee \nu \qquad \bar{\nu} \vee \Delta}{\Gamma \vee \Delta} \nu$$

### Proof as a directed acyclic graph (DAG)

▶ node, conclusion, pivot, premise, child



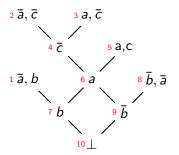
### Proof as sequence

Use topological order

$$ar{a}, b \ ar{a}, ar{c} \ a, ar{c} \ ar{c} \ a, c \ a \ b \ ar{b}, ar{a} \ ar{b} \ otomega$$

### Proof as a directed acyclic graph (DAG)

node, conclusion, pivot, premise, child



#### Proof as sequence

Use topological order

$$\bar{a}, b \ \bar{a}, \bar{c} \ a, \bar{c} \ a, \bar{c} \ a, c \ a, c \ a, \bar{b} \ \bar{b}, \bar{a} \ b \ \perp$$

$$top-down$$

$$bottom-up$$

Introduction

### Subsumption algorithms

Recursive Split

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# Subsumption for Proof Compression

#### Idea

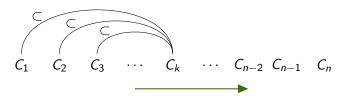
- Subsumption
  - ▶  $C_1$  subsumes  $C_2$  iff  $C_1 \subset C_2$
- Replace subsumed clauses by their subsumers
- ► Fix nodes with changed premises
  - ▶ Pivot in both premises → resolve premises
  - $lackbox{ Pivot missing in a premise } \rightarrow \mbox{ use this premise }$

#### Performance

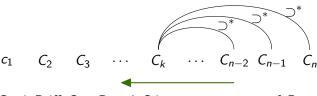
- Worst case quadratic runtime in the proof size
- Use literal-tree structure to store visited nodes and check subsumption

### Top-down vs Bottom-up

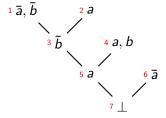
#### Top-down

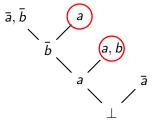


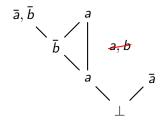
### Bottom-up

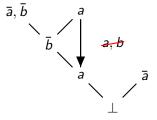


 $C \subset^* D$  iff  $C \subset D$  and C is not an ancestor of D

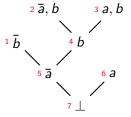


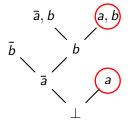


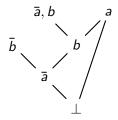


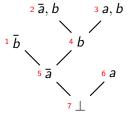


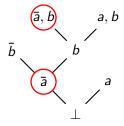


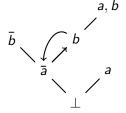












# Problems with Bottom-up Subsumption

#### Performance

Ancestor check is costly

### Copy node issue

- ► Fixing has to be done top-down
- Nodes are replaced bottom-up

### RecycleUnits

#### Omer Bar-Ilan et al., 2009

► IBM Haifa Research Laboratory

### Special case of bottom-up subsumption

- ► Check only for subsuming unit clauses
- Replace subsumption check by comparing units to pivots
- Worst case quadratic runtime in the amount of unit clauses

# Experiments

### Setting

- ▶ 500 proofs, provided by VeriT SMT Solver
- ▶ 659,584 nodes in total
- ► Average 1320 nodes per proof

#### Results

| Algorithm             | Length Compression | Speed        |
|-----------------------|--------------------|--------------|
| Top-down Subsumption  | 3.7 %              | 2.3 nodes/ms |
| Bottom-up Subsumption | 1%                 | 0.4 nodes/ms |
| RecycleUnits          | 2%                 | 1.0 nodes/ms |
| DAGify                | 0.6 %              | 7.3 nodes/ms |

Introduction

Subsumption algorithms

Recursive Split

Greedy pebbling

# Split Algorithm

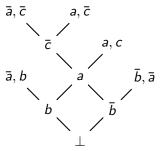
#### Author

Scott Cotton, 2010

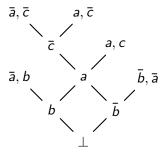
#### Idea

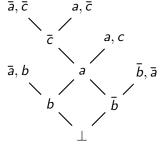
- ▶ Let P be a proof with root clause C
- $\triangleright$  Choose a variable v, occurring in P, heuristically
- ▶ Extract proofs for  $C \lor v$  and  $C \lor \bar{v}$ 
  - By deleting positive/negative branches of nodes with pivot v
  - And fixing nodes like at subsumption algorithms
- Combine proofs by resolving roots

### Split variable a

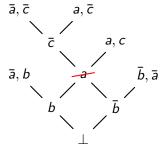


#### Duplicate the proof

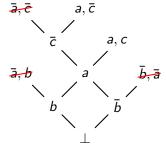




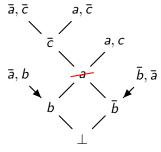
#### Delete positive branch



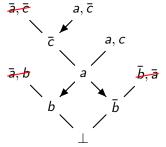
#### Delete negative branch



#### Fix positive branch



#### Fix negative branch



Fix positive branch

$$ar{\mathsf{a}}, ar{\mathsf{b}}$$
  $ar{\mathsf{b}}, ar{\mathsf{a}}$ 

Fix negative branch

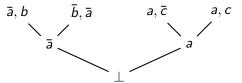
$$a, \bar{c}$$
  $a, \bar{c}$   $a, \bar$ 

Fix positive branch

Fix negative branch

a, 
$$\bar{c}$$
 a,  $c$ 

### Combine branches by resolving



# Iterative Split

#### Idea

Apply split to result of split

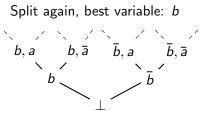
#### Issues

- ▶ Best variables don't end up lowest
- Same variables for positive and negative branches

#### Example

Split once, best variable: a





### Recursive Split

#### Idea

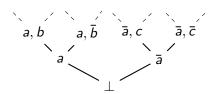
- Apply split to positive and negative branches before combining
- Use stopping criteria (depth or time)

#### Example

Split once, best variable: a



Split positive/negative branches, best variables: b/c;



#### Issue

Equal nodes may be computed in both branches

# Experiments

#### Results

| Algorithm                 | Length Compression | Speed        |
|---------------------------|--------------------|--------------|
| Recursive Split (depth 3) | 2.3%               | 3.0 nodes/ms |
| Recursive Split (depth 5) | 2.0%               | 2.0 nodes/ms |
| Iterative Split (depth 3) | 2.9%               | 3.2 nodes/ms |
| Iterative Split (depth 5) | 3.4%               | 2.3 nodes/ms |

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# Space Compression

#### Space measure

Maximal amount of nodes that have to be kept in memory at once

#### Deletion information

- Extra lines in proof output
- Example: y is the last child of x
  - Read and check node x
    - . . .
  - Read and check node y
  - Delete node x
    - . . .

#### Interesting scenario

Proof checker has much less memory than proof producer

### Black Pebbling Game

#### A pebble is a small stone

#### Rules

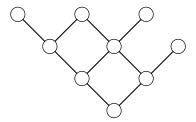
- ▶ If all premises of a node p are pebbled, p may be pebbled
  - ▶ In this case, a pebble may be moved from a premise to p
- Nodes can be unpebbled at any time

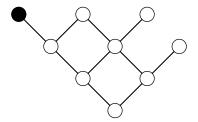
#### Goal

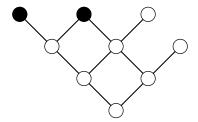
▶ Pebble some node v

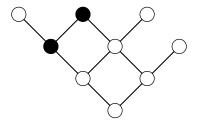
#### Pebbling problem

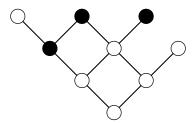
- ► For a given DAG and a node *v*, can *v* be pebbled using no more than *n* pebbles in total?
- ▶ PSPACE-complete (John R. Gilbert et al., 1980)

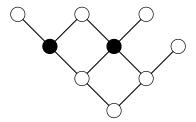


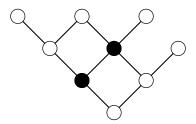


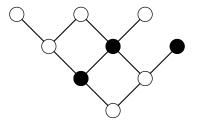


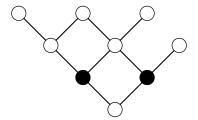


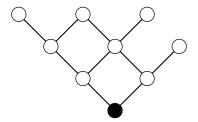












### Greedy Pebbling

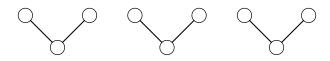
#### Topological Order + Deletion Information

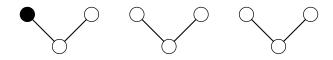
Correspond to a strategy for the pebbling game

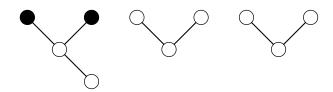
#### Greedy heuristics

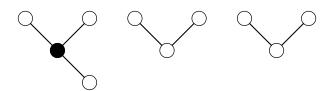
- ► Find better order w.r.t. space measure
- Choose next node w.r.t.:
  - Number of pebbles that can be removed
  - Pebbled premises
  - Children with pebbled premises
  - Number of children
  - ▶ Number of premises, which the node is the last children of
  - ▶ ..

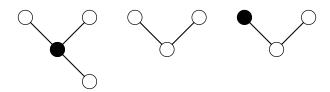
#### Top-down vs Bottom-up

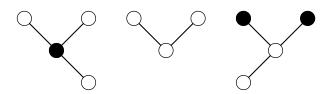


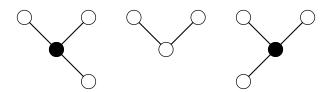


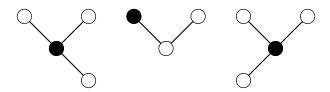


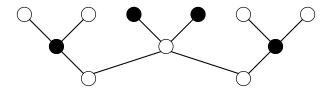


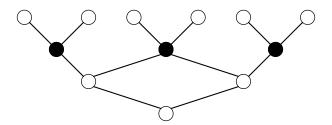


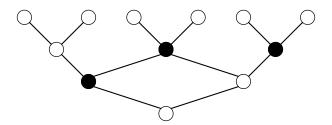


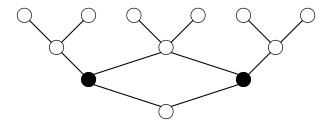


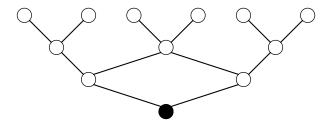


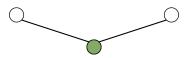


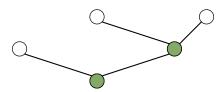


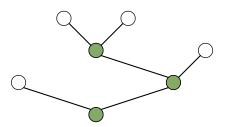


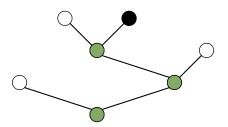


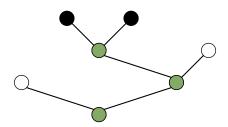


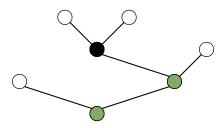


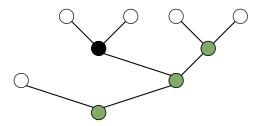


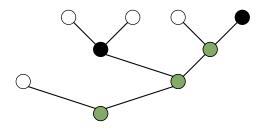


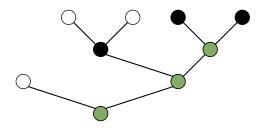


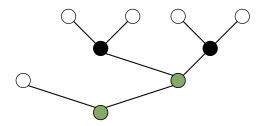


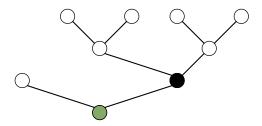


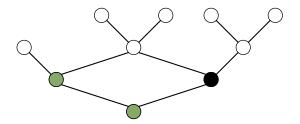


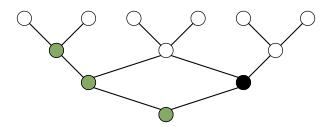


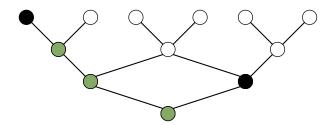


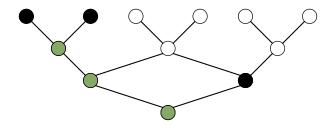


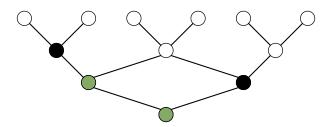


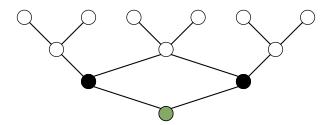


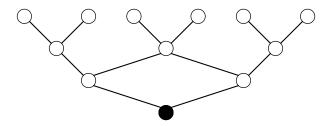












### **Experiments**

#### Results

| Algorithm            | Space Compression | Speed         |
|----------------------|-------------------|---------------|
| Top-down Pebbling*   | -40.4776%         | 1.4 nodes/ms  |
| Bottom-up Pebbling** | 6.8%              | 12.2 nodes/ms |

#### Used heuristics

- \*: removes pebbles > pebbled premises > children with pebbled premises > index in the original proof
- \*\*: last child of a node > number of children > index in the original proof

#### Conclusion & Future Work

#### Subsumption

- ► Top-down-S interesting replacement for DAGification
- ► Bottom-up-S could possibly do much
- ► Boost performance
- Fix problems with Bottom-up-S

#### Recursive Split

- ► Promising Idea
- Still needs some fine tuning

### Greedy Pebbling

- Top-down version is not clever enough
- Bottom-up version shows nice results
- ► Find better heuristics for Bottom-up



#### Special Thanks to:

Google &

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for financial support

Thank you for your attention

Feel free to ask questions

http://github.com/Paradoxika/Skeptik