



Aalto University  
School of Science

# Improving the Normalization of Weight Rules in Answer Set Programs

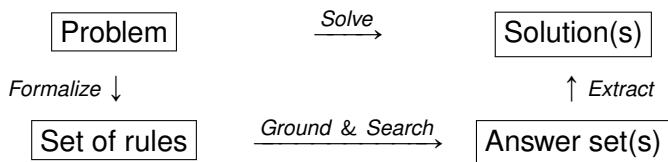
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# Background

- ▶ Answer set programming (ASP) features a **rule-based** syntax subject to **answer-set semantics**.



# Different Types of Rules

We consider propositional answer set programs containing:

- ▶ Normal rules:

$$a \leftarrow b, c, \text{not } d, \text{not } e$$

- ▶ Cardinality rules:

$$a \leftarrow 3 \leq \{b, c, d, \text{not } e, \text{not } f\}$$

- ▶ Weight rules:

$$a \leftarrow 6 \leq [b = 2, c = 4, d = 3, e = 3, f = 1, g = 4]$$

Objectives:

- ▶ Rewrite weight rules using normal rules
- ▶ Complement back-ends lacking weight rule support
- ▶ Improve efficiency of nogood recording

# Example of Normalization

$$a \leftarrow 3 \leq \{b, c, d, \text{not } e, \text{not } f\}$$



$$a \leftarrow b, c, d.$$

$$a \leftarrow b, c, \text{not } e.$$

$$a \leftarrow b, c, \text{not } f.$$

$$a \leftarrow b, d, \text{not } e.$$

$$a \leftarrow b, d, \text{not } f.$$

$$a \leftarrow b, \text{not } e, \text{not } f.$$

$$a \leftarrow c, d, \text{not } e.$$

$$a \leftarrow c, d, \text{not } f.$$

$$a \leftarrow c, \text{not } e, \text{not } f.$$

$$a \leftarrow d, \text{not } e, \text{not } f.$$

## Related Work

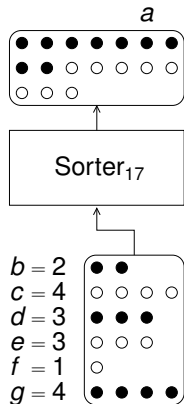
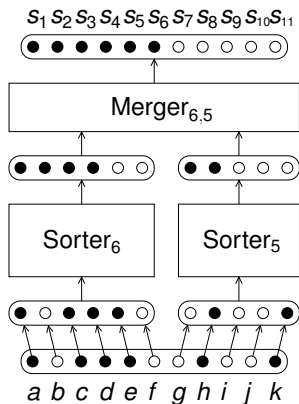
- ▶ Eén and Sörensson, JSAT'06
  - Translation of Pseudo-Boolean to **sorting networks** to SAT
- ▶ Bailleux, Boufkhad, and Roussel, SAT'09
  - Polynomial Watchdog translation using **tares**
- ▶ Codish, Fekete, Fuhs, and Schneider-Kamp, TACAS'11
  - **Optimal base** problem and algorithm(s)
- ▶ Bomanson and Janhunen, LPNMR'13
  - Merging and sorting for normalizing **cardinality** rules

# Outline

1. Primitives: Merging and Sorting Programs
2. Arithmetics Behind the Translation
3. Encoding the Summation
4. Enhancements
5. Experiments
6. Conclusions

# 1. Primitives: Merging and Sorting Programs

- ▶ We illustrate normalization designs using **circuits**
- ▶ Merging and sorting circuits have **normal rule** encodings
- ▶ **Weight rules** can be normalized using these primitives



## 2. Arithmetics Behind the Translation

- ▶ Suppose we have a weight rule of the form

$$a \leftarrow 31 \leq \langle b = 13, c = 7, d = 1, e = 11, f = 19, \\ g = 19, h = 10, \text{not } i = 13, \text{not } j = 6, \\ \text{not } k = 13, \text{not } l = 3, \text{not } m = 4 \rangle$$

- ▶ ... and an answer set  $M = \{a, c, d, e, i, k, \dots\}$
- ▶ Summing the weights of **satisfied body literals** gives

$$7 + 1 + 11 + 6 + 3 + 4 = 32$$

- ▶ **Question:** How to do this with circuits?



# Summing in Mixed-Radix Bases

- Using the mixed-radix base  $B = 3, 2, \infty$ :

	6	3	1
$c = 7$	•		•
$d = 1$			•
$e = 11$	•	•	••
not $j = 6$	•		
not $l = 3$		•	
not $m = 4$		•	•
$\Sigma = 32$	•••	•••	•••••
$\Sigma = 32$	•••	••••	••
$\Sigma = 32$	•••••		••
<i>bound</i> = 31	•••••		•

- Eén and Sörensson, JSAT'06

# Simplifying Bound Checking with Tares

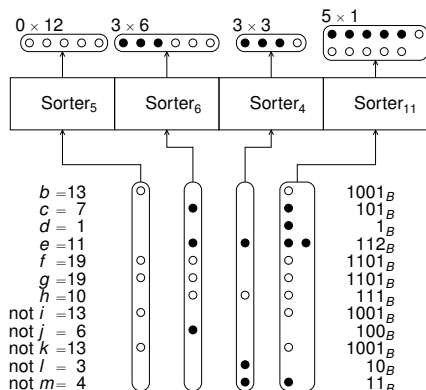
- Using the mixed-radix base  $B = 3, 2, \infty$  and tare  $t = 5$ :

	6	3	1
$\Sigma = 32$	•••	•••	•••••
$t = 5$		•	••
$\Sigma + t = 37$	•••	••••	•••••••
$\Sigma + t = 37$	•••	•••••••	*
$\Sigma + t = 37$	••••••	*	*
$bound + t = 36$	••••••		

- Lexicographical comparison becomes trivial
- It suffices to know the most significant digit of the sum
- Bailleux, Boufkhad, and Roussel, SAT'09

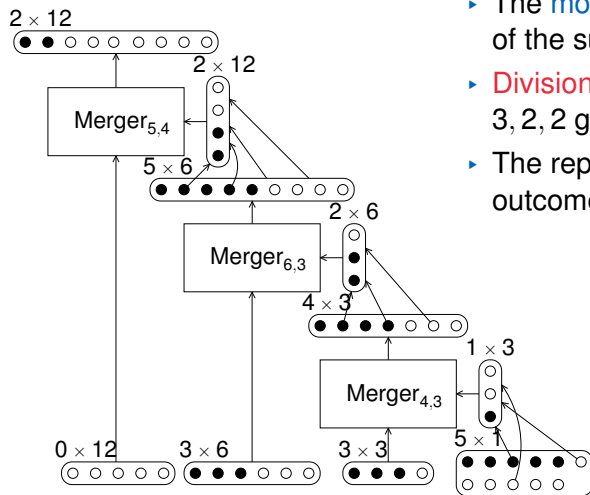
# Digit-wise Summing

Normalization of  $a \leftarrow 31 \leq [b = 13, c = 7, \dots, \text{not } m = 4]$



Base  $B = 3, 2, 2, \infty$  and answer set  $M = \{a, c, d, e, i, k, \dots\}$

# Carry Propagation



- ▶ The most significant digit of the sum is computed
- ▶ Divisions by base radices 3, 2, 2 give carries
- ▶ The representation of the outcome becomes unique

## 4. Enhancements

- ▶ Several aspects of the translation can be adjusted
- ▶ Choices can be made between
  - types of **mergers**
  - mixed-radix **bases**
  - **input arrangement** in merge-sorting
- ▶ These choices affect translation size directly and through impacts on **shared structure**

# Mixed-Radix Base Selection

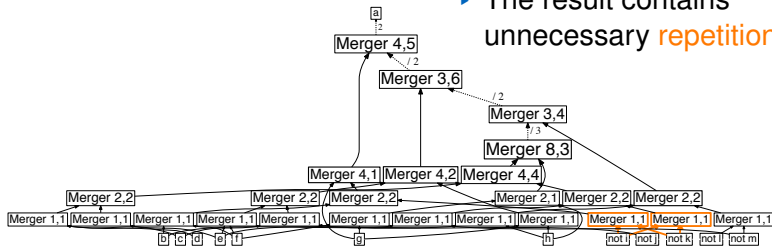
- ▶ Eén and Sörensson, JSAT'06
  - Enumerating bases consisting of primes  $< 20$
- ▶ Bailleux, Boufkhad, and Roussel, SAT'09
  - Using binary bases
- ▶ Codish, Fekete, Fuhs, and Schneider-Kamp, TACAS'11
  - Searching optimal bases with sophisticated algorithms
- ▶ Our approach:
  - Radices are selected from **least to most significant**
  - **Prime numbers** are considered as candidates
  - Effects on translation size are **heuristically** estimated
  - The **most promising** prime is chosen

← repeat

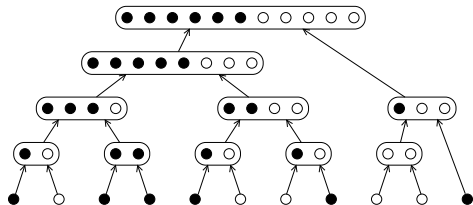
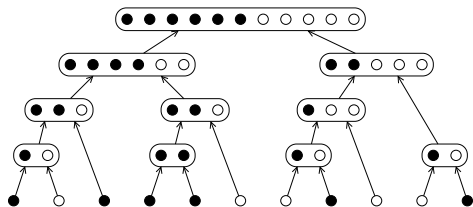
# Implementation without Structure Sharing

- ▶ Normalization of  $a \leftarrow 31 \leq [b = 13, c = 7, \dots, \text{not } m = 4]$

- ▶ Sorters are implemented via merge-sorting
- ▶ The result contains unnecessary repetition



# Restructuring Merge-Sorters



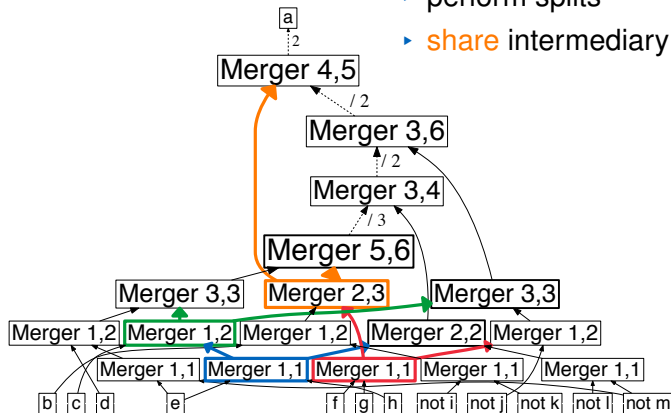
- ▶ Input can be arranged and **divided** freely
- ▶ Different choices lead to different structure
- ▶ With the right choices, shared input between sorters leads to **common structure**



# Structure Sharing Result

We use a greedy algorithm to:

- ▶ perform splits
- ▶ **share** intermediary results



## 5. Experiments

- ▶ The translation is implemented in LP2NORMAL2 with configurable choices of bases and sharing
- ▶ For selected benchmarks, the proposed translation improves on the **runtime** of CLASP

Benchmark	Native	Mixed		Binary		SWC
		Shared	Independent	Shared	Independent	
Bayes-Find	202	<b>30</b>	164	246	165	1,721
Bayes-Prove	1,391	<b>492</b>	1,316	631	890	2,587
Markov-Find	2,426	2,770	<b>1,845</b>	2,682	2,966	5,224
Markov-Prove	<b>2,251</b>	3,294	3,428	3,255	3,229	5,402
Fastfood	<b>10,277</b>	12,843	14,156	13,756	13,479	17,867
Inc-Scheduling	<b>257</b>	1,340	1,330	1,481	1,581	
Nomystery	4,907	4,236	<b>3,332</b>	4,290	3,512	4,739
Summary	<b>21,715</b>	25,009	25,576	26,345	25,827	

## 6. Conclusions

We propose new ways to normalize weight rules, incorporating:

- ▶ **Mixed-radix** bases for concise representation of weights
- ▶ **Tares** for simplified bound checking
- ▶ Efficient **primitives** for digit-wise operations

Contributions:

- ▶ **Structure sharing** algorithm
- ▶ Base selection **heuristic**
- ▶ **Generalization** of cardinality translations for weight rules
- ▶ Selective and **automated configuration** of mergers