

# Literature Study on Algorithms for Pattern Completeness

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# Outline

- 1 Introduction
- 2 Thiemann and Yamada's algorithm
- 3 The complement algorithm
- 4 Conclusion



# Functional Programming Example I/III

Functional programs are written using pattern matching.  
Critical to ensure that these patterns are complete, otherwise:

- Runtime errors
- Untimely termination

Example:

```
1 first :: [Int] -> Maybe Int
2 first (x:_) = Just x
```

Notice the missing case for `[]`.



# Functional Programming Example II/III

Now when we run this:

```
1  main :: IO ()
2  main = do
3      print $ first [1,2,3]
4      print $ first []
```

Our program crashes:

```
$ ./incomplete-pattern
Just 1
incomplete-pattern: incomplete-pattern.hs:2:1-21:
  Non-exhaustive patterns in function first
```



# Functional Programming Example III/III

We can use GHC to identify these cases:

```
incomplete-pattern.hs:2:1: warning: [-Wincomplete-patterns]
  Pattern match(es) are non-exhaustive
  In an equation for 'first':
    Patterns of type '[Int]' not matched: []
|
2 | first (x:xs) = Just x
  | ~~~~~
```

How do we do this algorithmically?



# Term Rewriting I/II

Idea:

- Analyse programs as term-rewrite systems
- Goal: decide when a function  $f$  (like our function `first`) is *pattern complete*

Ingredients of term rewrite systems:

- set of function symbols  $\Sigma$  with arity  $\#$
- set of rewrite rules  $\ell \rightarrow r$
- set variables  $\mathcal{X}$
- terms  $\mathcal{T}(\Sigma, \mathcal{X})$  from function symbols and variables



# Term Rewriting II/II

Example term rewrite system  $\mathcal{R}$ :

- Function symbols
  - Constructors: true, false, 0 (constants), s (unary)
  - Defined symbol: even (unary)
- Rewrite rules:
  - $\text{even}(0) \rightarrow \text{true}$
  - $\text{even}(s(0)) \rightarrow \text{false}$
  - $\text{even}(s(s(x))) \rightarrow \text{even}(x)$

## Example – Reduction

$\text{even}(s(s(s(0)))) \rightarrow \text{even}(s(0)) \rightarrow \text{false}$

$\text{even}(s(s(s(s(0))))) \rightarrow \text{even}(s(s(0))) \rightarrow \text{even}(0) \rightarrow \text{true}$



# Matching I/II

## Definition

*Matching problem:* given terms  $s$  and  $t$ , find substitution  $\sigma$  from  $\mathcal{X}$  to  $\mathcal{T}(\Sigma, \mathcal{X})$  such that  $s\sigma = t$ .

## Example

- Match  $z$  to  $0$ . Take  $\sigma = \{z \mapsto 0\}$
- Match  $\text{even}(z)$  to  $0$ . No such  $\sigma$  exists
- Match  $f(a, b)$  to  $f(x, x)$ . Take  $\sigma = \{a \mapsto x, b \mapsto x\}$
- Match  $f(a, a)$  to  $f(x, s(x))$ . No such  $\sigma$  exists





# Matching II/II

Idea:

- Represent defined function  $f$  as TRS
- Match input term  $f(z_1, \dots, z_n)$  to LHS of TRS (domain of  $f$ ) with  $z_i$  some constructor term
- If for all constructor substitution for  $z_i$  we find a match:  $f$  is pattern complete

## Example

Previous TRS with defined symbol `even`. Matching problems:

- `even(z)` to `even(0)`
- `even(z)` to `even(s(0))`
- `even(z)` to `even(s(s(x)))`



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# Properties

- Algorithm to decide pattern completeness
- **Input:** matching problems  $(f(z), \ell)$ 
  - For each LHS  $\ell$  of TRS from  $f$
  - $z$  some arbitrary constructor term
- **Output:** success or failure
- Flow:
  - Iteratively decompose terms until match/clash
  - If we encounter  $z$  with  $\ell$  not a variable, instantiate  $z$  via  $\sigma = \{z \mapsto c(x_1, \dots, x_n)\}$  for each constructor  $c$



# Example I

Constructors: 0, s, function  $f$ :  $f(0) \rightarrow 0$  and  $f(s(x)) \rightarrow x$

## Algorithm

$(f(z), f(0))$ $(z, 0)$		$(f(z), f(s(x)))$ $(z, s(x))$	
$(0, 0)$ match	$(0, s(x))$ clash	$(s(z), 0)$ clash	$(s(z), s(x))$ $(z, x)$ match $\sigma = \{x \mapsto z\}$

Result: **success**, since each constructor substitution for  $z$  results in **match**



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## Example II – Incomplete pattern

Constructors: 0, s, function  $f$ :  $f(0) \rightarrow 0$  (missing case for  $s(x)$ ).

### Algorithm

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$$\begin{array}{c} (0, 0) \\ \text{match} \end{array}$$
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Result: **failure**, since there's no **match** for substitution  
 $\sigma = \{z \mapsto s(z)\}$





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## Example III – General case

Function  $f$ : with LHS  $f(x, x)$  and  $f(x, y)$

Pattern  $f(x, x)$  is called *non-linear*, due to the repeated variable  $x$

### Algorithm

$(f(a, b), f(x, x))$   
 $(a, x), (b, x)$   
clash

$(f(a, b), f(x, y))$   
 $(a, x), (b, y)$   
match  $\sigma_1 = \{x \mapsto a\} \quad \sigma_2 = \{y \mapsto b\}$

- Result: **success**, since right-side matches both  $a$  and  $b$  (which are arbitrary constructor terms)
- Left side results in clash since we cannot match variable  $x$  to both  $a$  and  $b$



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# Properties

- Due to Lazrek et al.
- Can be used to decide pattern completeness
- **Input:** TRS  $\mathcal{R}$  and defined symbol  $f$
- **Output:** Set of constructors where  $f$  is not defined



# Idea

- Start with set  $M_0$  with LHSs of function  $f$ , set  $N_0 f(z_1, \dots, z_n)$  where  $z_i$  is some constructor term
- Try to unify elements of  $m \in M_i$  and  $n \in N_i$  with substitution  $\sigma$
- Compute *complement* of this substitution  $\rho$
- Replace matched element in  $N_i$  with new elements  $n\rho$
- Repeat until either  $M_{last}$  or  $N_{last}$  is empty, or no further unification is possible
- If  $M_{last}$  is empty but  $N_{last}$  is not empty,  $f$  is not defined on the terms in  $N_{last}$



# Example I - Linear case

Constructors: 0, s, function  $f$ :  $f(0) \rightarrow 0$  and  $f(s(x)) \rightarrow x$

## Algorithm

	M	N	$\sigma$	$\rho$
0	$f(0), f(s(x))$	$f(z)$	$z \mapsto 0$	$z \mapsto s(z)$
1	$f(s(x))$	$f(s(z))$	$z \mapsto x$	
2	$\emptyset$	$\emptyset$		

Result: **success**,  $N_2$  is empty



# Example I - Linear case

Constructors: 0, s, function  $f$ :  $f(0) \rightarrow 0$  and  $f(s(x)) \rightarrow x$

## Algorithm

	M	N	$\sigma$	$\rho$
0	$f(0), f(s(x))$	$f(z)$	$z \mapsto 0$	$z \mapsto s(z)$
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2	$\emptyset$	$\emptyset$		

Result: **success**,  $N_2$  is empty



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1	$f(s(x))$	$f(s(z))$	$z \mapsto x$	
2	$\emptyset$	$\emptyset$		

Result: **success**,  $N_2$  is empty



## Example II - Incomplete pattern

Constructors: 0, s, function  $f$ : LHS  $f(0)$  (missing case for  $s(x)$ ).

### Algorithm

	M	N	$\sigma$	$\rho$
0	$f(s(x))$	$f(z)$	$z \mapsto s(x)$	$z \mapsto 0$
1	$\emptyset$	$f(0)$		

Result: **failure**,  $N_1$  is not empty



## Example II - Incomplete pattern

Constructors: 0, s, function  $f$ : LHS  $f(0)$  (missing case for  $s(x)$ ).

### Algorithm

	M	N	$\sigma$	$\rho$
0	$f(\textcolor{red}{s}(x))$	$f(\textcolor{red}{z})$	$z \mapsto s(x)$	$z \mapsto 0$
1	$\emptyset$	$f(0)$		

Result: **failure**,  $N_1$  is not empty





## Example II - Incomplete pattern

Constructors: 0, s, function  $f$ : LHS  $f(0)$  (missing case for  $s(x)$ ).

### Algorithm

	M	N	$\sigma$	$\rho$
0	$f(\textcolor{red}{s}(x))$	$f(\textcolor{red}{z})$	$z \mapsto s(x)$	$z \mapsto 0$
1	$\emptyset$	$f(0)$		

Result: **failure**,  $N_1$  is not empty



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# Comparison

- Both Thiemann and Yamada's and the complement algorithm can be used to decide pattern completeness
- Complement algorithm's  $N_{last}$  set contains patterns where  $f$  still needs to be defined
- Thiemann and Yamada's algorithm is proven to work for non-linear patterns, whereas complement algorithm might fail
- Complement algorithm has built-in counterexample-generation



# Conclusion

- Literature study to compare algorithms for pattern completeness
- Detailed comparison between Thiemann and Yamada's algorithm and the complement algorithm of Lazrek et al.
- Further research could:
  - Perform more thorough performance comparison between algorithms
  - More analysis as to why Thiemann and Yamada's version outperforms the other variants
  - Suggestion as per Thiemann and Yamada: construct a similar syntax-based algorithm to decide quasi-reducibility



## Further notable work

- Calculus of components by Thiel on which the complement algorithm by Lazrek et al is based on
- Decidability of quasi-reducibility by Kapur et al.
- Aota and Toyama introduce *strong quasi-reducibility*
- Kop derives quasi-reducibility of logically constrained TRSs
- Bouhoula et al. use tree-automata based algorithm to decide sufficient completeness



# References I

- [1] René Thiemann and Akihisa Yamada. “A Verified Algorithm for Deciding Pattern Completeness”. In: *9th International Conference on Formal Structures for Computation and Deduction (FSCD 2024)*. Ed. by Jakob Rehof. Vol. 299. Leibniz International Proceedings in Informatics (LIPIcs). Dagstuhl, Germany: Schloss Dagstuhl – Leibniz-Zentrum für Informatik, 2024, 27:1–27:17. ISBN: 978-3-95977-323-2. DOI: 10.4230/LIPIcs.FSCD.2024.27. URL: <https://drops.dagstuhl.de/entities/document/10.4230/LIPIcs.FSCD.2024.27>.
- [2] Azeddine Lazrek, Pierre Lescanne, and Jean-Jacques Thiel. “Tools for proving inductive equalities, relative completeness, and  $\omega$ -completeness”. *Information and Computation* 84.1 (1990), pp. 47–70. ISSN: 0890-5401. DOI: [https://doi.org/10.1016/0890-5401\(90\)90033-E](https://doi.org/10.1016/0890-5401(90)90033-E). URL: <https://www.sciencedirect.com/science/article/pii/089054019090033E>.
- [3] Jean Jacques Thiel. “Stop losing sleep over incomplete data type specifications”. In: *Proceedings of the 11th ACM SIGACT-SIGPLAN Symposium on Principles of Programming Languages*. POPL '84. Salt Lake City, Utah, USA: Association for Computing Machinery, 1984, pp. 76–82. ISBN: 0897911253. DOI: 10.1145/800017.800518. URL: <https://doi.org/10.1145/800017.800518>.



# References II

- [4] Deepak Kapur, Paliath Narendran, and Hantao Zhang. “On sufficient-completeness and related properties of term rewriting systems”. *Acta Inf.* 24.4 (Aug. 1987), pp. 395–415. ISSN: 0001-5903. DOI: 10.1007/BF00292110. URL: <https://doi.org/10.1007/BF00292110>.
- [5] Cynthia Kop. *Quasi-reductivity of Logically Constrained Term Rewriting Systems*. 2017. arXiv: 1702.02397 [cs.LO]. URL: <https://arxiv.org/abs/1702.02397>.
- [6] Aart Middeldorp, Alexander Lochmann, and Fabian Mitterwallner. “First-Order Theory of Rewriting for Linear Variable-Separated Rewrite Systems: Automation, Formalization, Certification”. 67.2 (Apr. 2023). ISSN: 0168-7433. DOI: 10.1007/s10817-023-09661-7. URL: <https://doi.org/10.1007/s10817-023-09661-7>.



# References III

- [7] Takahito Aoto and Yoshihito Toyama. "Ground Confluence Prover based on Rewriting Induction". In: *1st International Conference on Formal Structures for Computation and Deduction (FSCD 2016)*. Ed. by Delia Kesner and Brigitte Pientka. Vol. 52. Leibniz International Proceedings in Informatics (LIPIcs). Dagstuhl, Germany: Schloss Dagstuhl – Leibniz-Zentrum für Informatik, 2016, 33:1–33:12. ISBN: 978-3-95977-010-1. DOI: 10.4230/LIPIcs.FSCD.2016.33. URL: <https://drops.dagstuhl.de/entities/document/10.4230/LIPIcs.FSCD.2016.33>.
- [8] Adel Bouhoula and Florent Jacquemard. "Sufficient completeness verification for conditional and constrained TRS". *Journal of Applied Logic* 10.1 (2012). Special issue on Automated Specification and Verification of Web Systems, pp. 127–143. ISSN: 1570-8683. DOI: <https://doi.org/10.1016/j.jal.2011.09.001>. URL: <https://www.sciencedirect.com/science/article/pii/S1570868311000413>.

