# **Automated Reasoning**

Week 10. Termination

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Fall 2024

# Recall: Term Rewriting Systems

```
\begin{array}{lll} \operatorname{add}(x,s(y)) & \Rightarrow & \operatorname{s}(\operatorname{add}(x,y)) \\ \operatorname{add}(x,p(y)) & \Rightarrow & \operatorname{p}(\operatorname{add}(x,y)) \\ \operatorname{add}(x,0) & \Rightarrow & x \\ \operatorname{s}(\operatorname{p}(x)) & \Rightarrow & x \\ \operatorname{p}(\operatorname{s}(x)) & \Rightarrow & x \end{array}
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\operatorname{rev}(\operatorname{nil}) & \Rightarrow & \operatorname{nil} \\ \operatorname{rev}(a:x) & \Rightarrow & \operatorname{conc}(\operatorname{rev}(x),a:\operatorname{nil}) \\ \operatorname{conc}(\operatorname{nil},x) & \Rightarrow & x \\ \operatorname{conc}(a:x,y) & \Rightarrow & a:\operatorname{conc}(x,y) \end{array}
```

Last week: LPO

Overview



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- Simple
- Powerful
- Commonly used in, e.g., completion and superposition.

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This lecture: monotonic algebras and dependency pairs.

Dependency pairs

# Basic intuition of monotonic algebras

Find a weight function W from terms to natural numbers in such a way that W(u) > W(v) for all terms u, vsatisfying  $u \Rightarrow_{\mathcal{R}} v$ .



Monotonic algebras

### Rules:

$$add(0,y) \rightarrow y$$
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- $\bullet \ W(\mathrm{add}(t,u)) = 2W(t) + W(u)$

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### Then:

```
\begin{array}{lll} W(\operatorname{add}(s(0),0)) & = & 2*W(s(0)) + W(0) = 2*2 + 1 = 5 \\ W(s(\operatorname{add}(0,0))) & = & W(\operatorname{add}(0,0)) + 1 = (2*1+1) + 1 = 4 \\ W(s(0)) & = & W(0) + 1 = 1 + 1 = 2 \end{array}
```

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Then it suffices to prove  $\ell > r$  for all the rules.

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Side bonus: no restriction to  $\mathbb{N}$ .

Monotonic algebras

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For every function symbol  $\underline{f}$  of arity n, we choose a **monotonic** function  $[\underline{f}]: A^n \to A$ .

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#### Here **monotonic** means:

Monotonic algebras 

if for all  $a_i, b_i \in \mathcal{A}$  for i = 1, ..., n with  $a_i > b_i$  for some iand  $a_i \geq b_i$  for all  $j \neq i$  then

$$[f](a_1,\ldots,a_n) > [f](b_1,\ldots,b_n)$$

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$$[f](a_1,\ldots,a_n) > [f](b_1,\ldots,b_n)$$

	monotonic	not monotonic
Examples:	$\lambda x. x$	$\lambda x. 2$
	$\lambda x. x + 1$	$\lambda x, y. \ x + 1$ $\lambda x, y. \ x * y$ $\lambda x, y. \ \max(x, y)$
	$\lambda x. \ 2 * x$	$\lambda x, y. \ x * y$
	$\lambda x, y. x + y$	$\lambda x, y$ . max $(x, y)$
	$\lambda x, y. \ 2 * x + y + 1$	

# Definition (continued)

### Define:

• W(x) = x for a variable

Monotonic algebras 

•  $W(f(s_1,...,s_n)) = [f](W(s_1),...,W(s_n))$ 

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#### **Theorem**

The relation ≻ defined by:

 $s \succ t$  if and only if  $\forall \vec{x}[W(s) \succ W(t)],$ where  $\{\vec{x}\}\$  is the set of variables occurring in s,t

is a reduction ordering.

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**Proof idea.** Stability follows from the  $\forall \vec{x}$ , monotonicity from monotonicity of all [f] interpretation functions, and well-foundedness from well-foundedness of > in  $\mathcal{A}$ .  $\square$ 

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Now indeed for all x, y we have:

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and:

$$W(\text{add}(s(x), y) = 2 * (x + 1) + y = 2 * x + y + 2$$
  
> 2 \* x + y + 1 =  $W(s(\text{add}(x, y)))$ 

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Monotonic algebras 

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#### Another example

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Hence proving termination of  $\mathcal{R}$ .

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So monotonicity really is essential.

Dependency pairs

# Automating monotonic algebras

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Challenge: specify "an interpretation" in (basic) SMT!

#### Parametric interpretations

Idea: assign to function symbol f of arity n a parametric interpretation function of a specific shape; for instance

[0] = 
$$\underline{n}$$
  
[s] =  $\lambda x.\underline{s_0} + \underline{s_1} * x$   
[add] =  $\lambda x, y.a_0 + a_1 * x + a_2 * y$ 

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Monotonic algebras

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Compute the resulting requirements for the rules:

$$W(\text{add}(0,y)) = \underline{a_0} + \underline{a_1} * \underline{n} + \underline{a_2} * y$$

$$W(y) = y$$

$$W(\text{add}(s(x),y)) = \underline{a_0} + \underline{a_1} * (\underline{s_0} + \underline{s_1} * x) + \underline{a_2} * y$$

$$= \underline{a_0} + \underline{a_1} * \underline{s_0} + \underline{a_1} * \underline{s_1} * x + \underline{a_2} * y$$

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We now have to solve a problem of the shape:

find parameters such that:

- all [f] are monotonic functions, and
- for all rules  $\ell \to r$ , all  $\vec{x}$ :  $W(\ell) \succ W(r)$ .

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Requiring monotonicity in our example is not hard:

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Monotonic algebras

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We require that:  $s_1 \geq 1$ ,  $a_1 \geq 1$ ,  $a_2 \geq 1$ .

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For the second requirement, we use absolute positiveness.

# Absolute positiveness

Goal: a *sufficient condition* to compare two polynomials

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$$a_0 + a_1 * x_1 + \dots + a_m * x_m > b_0 + b_1 * x_1 + \dots + b_m * x_m$$

certainly holds if:

Monotonic algebras 

- $a_0 > b_0$
- each  $a_i > b_i$

#### We must show that:

```
W(\operatorname{add}(0,y)) = a_0 + a_1 * \underline{n} + a_2 * y
                      = W(v)
W(add(s(x), y)) = a_0 + a_1 * s_0 + a_1 * s_1 * x + a_2 * y
                      > s_0 + s_1 * a_0 + s_1 * a_1 * x + s_1 * a_2 * y
                      = (s(add(x, y)))
```

We must show that:

$$W(\text{add}(0,y)) = \underline{a_0} + \underline{a_1} * \underline{n} + \underline{a_2} * y$$
> y
= W(y)
$$W(\text{add}(s(x),y)) = \underline{a_0} + \underline{a_1} * \underline{s_0} + \underline{a_1} * \underline{s_1} * x + \underline{a_2} * y$$
>  $\underline{s_0} + \underline{s_1} * \underline{a_0} + \underline{s_1} * \underline{a_1} * x + \underline{s_1} * \underline{a_2} * y$ 
=  $(s(\text{add}(x,y)))$ 

That is:

$$\left(\underline{a_0} + \underline{a_1} * \underline{n}\right) + \underline{a_2} * y > y$$

and

$$(\underline{a_0} + \underline{a_1} * \underline{s_0}) + (\underline{a_1} * \underline{s_1}) * x + \underline{a_2} * y > (\underline{s_0} + \underline{s_1} * \underline{a_0}) + (\underline{s_1} * \underline{a_1}) * x + (\underline{s_1} * \underline{a_2}) * y$$

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Using absolute positiveness, it suffices if:

Monotonic algebras

#### Completing the example

# Completing the example

$$\underline{a_0} + \underline{a_1} * \underline{n} > 0 \qquad \underline{a_0} + \underline{a_1} * \underline{s_0} > \underline{s_0} + \underline{s_1} * \underline{a_0} \qquad \underline{s_1} \geq 1 
\underline{a_1} * \underline{s_1} \geq \underline{s_1} * \underline{a_1} \qquad \underline{a_1} \geq 1 
\underline{a_2} \geq 1 \qquad \underline{a_2} \geq \underline{s_1} * \underline{a_2} \qquad \underline{a_2} \geq 1$$

An SMT solver will for instance yield

$$\underline{n} = 1, \ \underline{s_0} = 1, \ \underline{s_1} = 1, \ \underline{a_0} = 0, \ \underline{a_1} = 2, \ \underline{a_2} = 1$$

giving the same interpretations we had before:

# Completing the example

$$\underline{a_0} + \underline{a_1} * \underline{n} > 0 \qquad \underline{a_0} + \underline{a_1} * \underline{s_0} > \underline{s_0} + \underline{s_1} * \underline{a_0} \qquad \underline{s_1} \geq 1 
\underline{a_1} * \underline{s_1} \geq \underline{s_1} * \underline{a_1} \qquad \underline{a_1} \geq 1 
\underline{a_2} \geq 1 \qquad \underline{a_2} \geq \underline{s_1} * \underline{a_2} \qquad \underline{a_2} \geq 1$$

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giving the same interpretations we had before:

Many other interpretations are also possible.

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giving the same interpretations we had before:

Many other interpretations are also possible.

In practice:  $\{0, 1, 2, 3\}$  usually suffice.

Absolute positiveness also works with combinations of variables, e.g.,

$$\underline{a} + \underline{b}y + \underline{c}xy + \underline{d}x^2y > \underline{e}x + \underline{d}y + \underline{f}xy$$
 if  $\underline{a} > 0 \land 0 \ge \underline{e} \land \underline{b} \ge \underline{d} \land \underline{c} \ge f \land \underline{d} \ge 0$ .

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Warning: this is not a complete method!

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Monotonic algebras 000000**000000000**0000

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Warning: this is not a complete method!

- absolute positiveness does not capture all inequalities; e.g.,  $x^2 > x$
- we might not guess the right interpretation shape

$$\operatorname{mul}(\operatorname{s}(x),y) \to \operatorname{add}(y,\operatorname{mul}(x,y))$$

$$\operatorname{mul}(s(x), y) \to \operatorname{add}(y, \operatorname{mul}(x, y))$$

Interpretation shape:

$$[f] = \lambda x_1, \dots, x_n \cdot \underline{a_0} + \sum_{i=1}^n \underline{a_i} * x_i$$

Result: FAIL

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Needed: a **quadratic** interpretation function:

$$[\underline{\mathtt{f}}] = \lambda x_1, \dots, x_n.\underline{a} + \sum_{i=1}^n \underline{b_i} * x_i + \sum_{i=1}^n \sum_{j=i}^n c_{ij} * x_i * x_j$$

$$\operatorname{mul}(s(x), y) \to \operatorname{add}(y, \operatorname{mul}(x, y))$$

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Monotonic algebras

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Downside: more sophisticated shape = more complex SMT problem

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Example:  $A = \mathbb{N}^2$ , and  $(x_1, y_1) > (x_2, y_2)$  if  $x_1 > x_2$  and  $y_1 \ge y_2$ .

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### Typical uses:

matrix interpretations

Monotonic algebras

Note: A is not **required** to be  $\mathbb{N}$ . Any well-founded set will do.

Example:  $A = \mathbb{N}^2$ , and  $(x_1, y_1) > (x_2, y_2)$  if  $x_1 > x_2$  and  $y_1 \ge y_2$ .

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$$[0] = \langle 0, 0 \rangle$$

$$[s] = \lambda \langle x_1, x_2 \rangle. \langle x_1, x_2 + 1 \rangle$$

$$[p] = \lambda \langle x_1, x_2 \rangle. \langle x_1, \max(x_2 - 1, 0) \rangle$$

$$[f] = \lambda \langle x_1, x_2 \rangle. \langle x_1 + x_2, 0 \rangle$$

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we may choose:

$$\begin{array}{lll} [\mathtt{0}] &=& \langle 0,0 \rangle \\ [\mathtt{s}] &=& \lambda \langle x_1,x_2 \rangle. \langle x_1,x_2+1 \rangle \\ [\mathtt{add}] &=& \lambda \langle x_1,x_2 \rangle, \langle y_1,y_2 \rangle. \langle x_1+x_2+y_1,x_2+y_2 \rangle \\ \end{array}$$

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This is also valuable in **complexity analysis** of programs.

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- integer numbers above some bound, e.g.,  $\{k, k+1, \dots\}$ , where k may be positive or negative
- sets of terms terminating under some different well-founded ordering ≻

Dependency pairs

### Subterm property

### **Definition**

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### The good:

- intuitive: a term is bigger than its subterms
- essential property for instance in the soundness proof of superposition

### The bad:

Not all TRSs can be ordered this way!

```
minus(x,0) \Rightarrow x
minus(s(x), s(y)) \Rightarrow minus(x, y)
    quot(0, s(y)) \Rightarrow 0
 quot(s(x), s(y)) \Rightarrow s(quot(minus(x, y), s(y)))
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If minus(x, y) \succ y and s(a) \succ a, then:
       s(quot(minus(x, y), s(y))) \succ s(quot(y, s(y)))
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If minus(x, y) \succ y and s(a) \succ a, then:
       s(quot(minus(x, y), s(y))) > s(quot(y, s(y)))
                                        \succ quot(y, s(y))
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Hence, if the last rule is oriented with  $\succ$ , then by stability:

```
quot(s(x), s(s(x))) \succ s(quot(minus(x, s(x)), s(s(x))))
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If minus(x, y)  $\succ y$  and  $s(a) \succ a$ , then:

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quot(s(x), s(s(x))) \succ s(quot(minus(x, s(x)), s(s(x))))
                      \succ quot(s(x), s(s(x)))
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Hence, this system **cannot** be ordered using any recursive path ordering, or an interpretation to  $\mathbb{N}$ .

## Secondary motivation

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Problem: finding an ordering for all at once is computationally difficult.

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Wish: split a termination problem into multiple smaller problems.

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Monotonic algebras

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The core idea of dependency pairs is to look at function calls.

Idea: a **general** framework for termination analysis:

- in principle applicable to all TRSs; no subterm property limitation
- several building blocks, incuding reduction orderings
- both for termination and non-termination

The core idea of dependency pairs is to look at **function calls**.

To start, split functions in constructors and defined symbols.

# Identifying function calls

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minus(x, 0) \Rightarrow x
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```

We isolate the calls from one defined symbol to another:

```
\min us^{\sharp}(s(x), s(y)) \Rightarrow \min us^{\sharp}(x, y)
  quot^{\sharp}(s(x), s(y)) \Rightarrow quot^{\sharp}(minus(x, y), s(y))
  quot^{\sharp}(s(x), s(y)) \Rightarrow minus^{\sharp}(x, y)
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### Dependency pair chains

We can prove the following result:

#### **Theorem**

For a given set of rules R, let DP be the corresponding set of dependency pairs.

 $\Rightarrow_{\mathcal{R}}$  is terminating if and only if there is no infinite (DP, R)**chain**: a reduction  $s_1 \Rightarrow_{\mathbb{DP}} \Rightarrow_{\mathcal{R}}^* s_2 \Rightarrow_{\mathbb{DP}} \Rightarrow_{\mathcal{R}}^* s_3 \dots$ 

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So  $\Rightarrow_{\mathcal{R}}$  is terminating iff there is no infinite sequence where:

- the steps using ⇒<sub>DP</sub> occur at the root of the term;
- the steps using ⇒<sub>R</sub> do not occur at the root of the term;
- there are infinitely many steps using ⇒<sub>DP</sub>.

## Example: an infinite DP chain

$$R = \left\{ \begin{array}{ccc} f(0,x) & \to & g(f(g(x),x)) \\ g(x) & \to & x \end{array} \right\}$$

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### Infinite chain:

$$\underline{f^{\sharp}(0,0)} \Rightarrow_{DP} f^{\sharp}(\underline{g(0)},0) \Rightarrow_{\mathcal{R}} \underline{f^{\sharp}(0,0)} \Rightarrow_{DP} f^{\sharp}(\underline{g(0)},0) \Rightarrow_{\mathcal{R}} \dots$$

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If:

•  $\ell \succ r$  for all dependency pairs  $\ell \Rightarrow r \in DP$ ,

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### **Theorem**

- $\ell \succ r$  for all dependency pairs  $\ell \Rightarrow r \in DP$ ,
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- $\ell \succ r$  for all dependency pairs  $\ell \Rightarrow r \in DP$ ,
- $\ell \succ r$  for all rules  $\ell \rightarrow r \in R$ ,
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Dependency pairs

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- $\ell \succ r$  for all rules  $\ell \rightarrow r \in R$ ,
- is well-founded and stable.
- is stable and monotonic.
- and  $s \succ t \succ u$  implies  $s \succ u$ ,

then there is no infinite (DP, R)-chain!

### **Proof idea.** By these requirements:

- If  $s \Rightarrow_{DP} t$  (by a step at the root), then s > t.
- If  $s \Rightarrow_{\mathcal{R}} t$  then  $s \succ t$ .
- Hence, if  $s \Rightarrow_{DP} \cdot \Rightarrow_{\mathcal{R}}^* t$ , then  $s \succ \cdot \succeq^* t$ , and therefore  $s \succ t$ .

# Quot/minus: ordering requirements

```
minus(x, 0) \succeq x
minus(s(x), s(y)) \succeq minus(x, y)
      quot(0, s(y)) \succeq 0
  quot(s(x), s(y)) \succeq s(quot(minus(x, y), s(y)))
\min us^{\sharp}(s(x), s(y)) \succ \min us^{\sharp}(x, y)
 quot^{\sharp}(s(x), s(y)) \succ quot^{\sharp}(minus(x, y), s(y))
 quot^{\sharp}(s(x), s(y)) \succ minus^{\sharp}(x, y)
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Dependency pairs

# Weakly monotonic algebras

Like monotonic algebras, but [f] only needs to be weakly monotonic.

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Monotonic algebras

if 
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# Weakly monotonic algebras

Like monotonic algebras, but [f] only needs to be **weakly** monotonic.

if 
$$s \ge t$$
, then  $[f](\ldots, s, \ldots) \ge [f](\ldots, t, \ldots)$ .

Many functions that are not monotonic, are still weakly monotonic; for example:

- functions that ignore arguments:  $\lambda x, y. x$
- min / max functions:  $\lambda x, y$ . min(x, y) or  $\lambda x$ . max(x 1, 0)

Back to our example!

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minus^{\sharp}(s(x), s(y)) \succ minus^{\sharp}(x, y)
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```

### This is satisfied by choosing:

```
[0] = 0 [\text{minus}] = \lambda x, y, x [\text{minus}^{\sharp}] = \lambda x, y, x
[s] = \lambda x. x + 1 [quot] = \lambda x. y. x [quot^{\sharp}] = \lambda x. y. x
```

### Back to our example!

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[0] = 0 [minus] = 
$$\lambda x, y, x$$
 [minus<sup>‡</sup>] =  $\lambda x, y, x$   
[s] =  $\lambda x, x + 1$  [quot] =  $\lambda x, y, x$  [quot<sup>‡</sup>] =  $\lambda x, y, x$ 

Hence, we clearly gained something!

Challenge: dealing with large systems.

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Idea: split large problems into smaller sub-problems.

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### Example:

```
Rules:
                        minus(x,0) \Rightarrow x
                \min(s(x), s(y)) \Rightarrow \min(x, y)
                     quot(0, s(y)) \Rightarrow 0
                  quot(s(x), s(y)) \Rightarrow s(quot(minus(x, y), s(y)))
          A minus^{\sharp}(s(x), s(y)) \Rightarrow \text{minus}^{\sharp}(x, y)
DPs:
           B quot (s(x), s(y)) \Rightarrow quot (minus(x, y), s(y))
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Question: what does an infinite chain look like?

Challenge: dealing with large systems.

Idea: split large problems into smaller sub-problems.

### Example:

```
Rules: \min(x,0) \Rightarrow x

\min(s(x),s(y)) \Rightarrow \min(x,y)

\gcd(0,s(y)) \Rightarrow 0

\gcd(s(x),s(y)) \Rightarrow s(\gcd(\min(x,y),s(y)))

DPs: A \min(s(x),s(y)) \Rightarrow \min(x,y)

B \gcd(s(x),s(y)) \Rightarrow \gcd(\min(x,y),s(y))

C \gcd(s(x),s(y)) \Rightarrow \min(x,y)
```

Question: what does an infinite chain look like?

We conclude: split DP into  $\{A\}$  and  $\{C\}$ !

# Mandatory material ends here

The material before this slide is expected knowledge, and you should be able to use monotonic algebras, and dependency pairs with weakly monotonic algebras, on the exam. You should also know the overall idea of the DP framework.

The following slides are optional material. However, you are allowed to use it on the exam; for example to answer a question "prove termination of this system", which can often be done much faster using the dependency pair framework with the graph and subterm criterion (see subsequent slides).

Dependency pairs

Idea: Graph with DPs as nodes, edges between nodes if one can follow another in a chain.

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### Example:

```
A. \min s^{\sharp}(s(x), s(y)) \Rightarrow \min s^{\sharp}(x, y)
B. \operatorname{quot}^{\sharp}(s(x), s(y)) \Rightarrow \min s^{\sharp}(x, y)
```

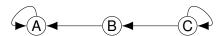
B. 
$$quot^{\sharp}(s(x), s(y)) \Rightarrow minus^{\sharp}(x, y)$$

C. quot
$$\sharp(s(x), s(y)) \Rightarrow \text{quot}\sharp(\text{minus}(x, y), s(y))$$

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### Example:

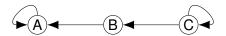
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- C. quot  $\sharp(s(x), s(y)) \Rightarrow quot \sharp(minus(x, y), s(y))$



Observation: each strongly connected component may be considered separately.

# Dependency graph processor – another example

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Hence, we can remove dependency pair A.

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Hence, we can remove dependency pair A.

Note: not always easy to see if one DP can follow another, but we can use approximations.

# Dependency graph processor

Formally:

# Dependency graph processor

#### Formally:

#### **Definition**

Let  $(\mathcal{D},R)$  be a DP problem, and G a graph whose nodes are the elements of  $\mathcal{D}$ , and which has an edge from  $\rho$  to  $\mu$  if it is possible for  $\rho$  to be followed by  $\mu$  in a  $(\mathcal{D},R)$ -chain (there may be more edges than this).

Suppose  $A_1, \ldots, A_n$  are the **strongly connected components** of G.

Then the dependency graph processor maps  $(\mathcal{D}, R)$  to  $\{(A_1, R), \dots, (A_n, R)\}.$ 

```
\exp^{\sharp}(s(x),y) \Rightarrow \text{double}^{\sharp}(x,y,0)
```

- B. double  $(x, 0, z) \Rightarrow \exp^{\sharp}(x, z)$
- C. double  $(x, 0, z) \Rightarrow \text{double}(x, y, s(s(z)))$

```
\exp^{\sharp}(\mathbf{s}(x), y) \Rightarrow \text{double}^{\sharp}(x, y, 0)
```

B. double 
$$(x, 0, z) \Rightarrow \exp^{\sharp}(x, z)$$

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$$(x, 0, z) \Rightarrow \text{double}(x, y, s(s(z)))$$

Idea: consider the first argument of each side of the dependency pairs.

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Idea: consider the first argument of each side of the dependency pairs.

Then we can remove the dependency pairs where the chosen argument becomes smaller (in this case A).

## The subterm criterion processor

#### **Definition**

For all marked symbols  $f^{\sharp}$ , let  $\nu(f^{\sharp}) \in \{1, \dots, arity(f)\}$ .

Let  $(\mathcal{D}, R)$  be a DP problem, and write  $\mathcal{D} = \mathcal{D}_1 \cup \mathcal{D}_2$ .

### Suppose:

- $\ell_{
  u(\mathfrak{g}^{\sharp})} = r_{
  u(\mathfrak{g}^{\sharp})}$  for all  $\mathfrak{f}^{\sharp}(\ell_1, \ldots, \ell_n) \Rightarrow \mathfrak{g}^{\sharp}(r_1, \ldots, r_m) \in \mathcal{D}_1$
- $r_{\nu(f^{\sharp})}$  is a subterm of  $\ell_{\nu(g^{\sharp})}$  for all  $f^{\sharp}(\ell_1,\ldots,\ell_n)\Rightarrow g^{\sharp}(r_1,\ldots,r_m)\in \mathcal{D}_2$

Then the subterm criterion processor maps  $(\mathcal{D}, R)$  $\{(\mathcal{D}_1,R)\}.$ 

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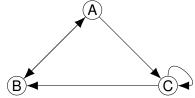
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Then the subterm criterion processor maps  $(\mathcal{D}, R)$  to  $\{(\mathcal{D}_1, R)\}.$ 

Implementation: a simple SMT implementation using integer variables  $\nu(f^{\sharp})$ , and boolean variables strict<sub>o</sub>.

```
\exp(0,y) \Rightarrow y
\exp(s(x),y) \Rightarrow \text{double}(0,x,y)
\text{double}(r,x,0) \Rightarrow \exp(x,r)
\text{double}(r,x,s(y)) \Rightarrow \text{double}(s(s(r)),x,y)
```

```
\exp(0, y) \Rightarrow y
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A. \qquad \exp^{\sharp}(s(x),y) \qquad \Rightarrow \text{ double}^{\sharp}(0,x,y)
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```

# Reduction pair processor

We can also reformulate reduction pairs as a processor:

#### **Definition**

Let  $\succ$  be a well-founded, stable ordering and  $\succeq$  a stable monotonic quasi-ordering on terms, such that  $\succeq \succeq \subseteq \succeq$ .

Let  $(\mathcal{D}, R)$  be a DP problem, and write  $\mathcal{D} = \mathcal{D}_1 \cup \mathcal{D}_2$ .

#### Suppose:

- $\ell \succ r$  for all  $\ell \rightarrow r \in R$
- $\ell \succ r$  for all  $\ell \Rightarrow r \in \mathcal{D}_1$ , and
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- $\ell \succ r$  for all  $\ell \Rightarrow r \in \mathcal{D}_1$ , and
- $\ell \succ r$  for all  $\ell \Rightarrow r \in \mathcal{D}_2$ .

Then the reduction pair processor maps  $(\mathcal{D}, R)$  to  $\{(\mathcal{D}_1, R)\}$ .

That is, we can use a reduction pair, and remove all dependency pairs that were ordered with  $\succ$ .

```
append(nil,z) \rightarrow z
append(cons(x, y), z) \rightarrow cons(x, append(y, z))
                rev(nil) \rightarrow nil
        rev(cons(x, y)) \rightarrow append(rev(y), cons(x, nil))
append^{\sharp}(cons(x,y),z) \Rightarrow append^{\sharp}(y,z)
       rev^{\sharp}(cons(x,y)) \Rightarrow rev^{\sharp}(y)
       rev^{\sharp}(cons(x,y)) \Rightarrow append^{\sharp}(rev(y),cons(x,nil))
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       rev^{\sharp}(cons(x,y)) \Rightarrow append^{\sharp}(rev(y),cons(x,nil))
```

#### We choose:

```
[nil] = 0
                                   [append] = \lambda x, y. x + y
[cons] = \lambda x, y, y + 1
                                    [rev] = \lambda x. x
                                  [append^{\sharp}] = \lambda x, y. x + y
                                       [rev^{\sharp}] = \lambda x. x
```

$$\begin{array}{cccc}
z & \geq & z \\
(y+1)+z & \geq & (y+z)+1 \\
0 & \geq & 0 \\
y+1 & \geq & y+(0+1) \\
(y+1)+z & > & y+z \\
y+1 & > & y \\
y+1 & \geq & y+(0+1)
\end{array}$$

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y+1 & \geq & y+(0+1)
\end{array}$$

Hence, we can remove all but the last dependency pair, and continue with:

```
(\{\operatorname{rev}^{\sharp}(\operatorname{cons}(x,y))\Rightarrow\operatorname{append}^{\sharp}(\operatorname{rev}(y),\operatorname{cons}(x,\operatorname{nil}))\},R)
```

Idea: remove arguments before using a reduction ordering

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```
minus(x, 0) \succeq x
minus(s(x), s(y)) \succeq minus(x, y)
      quot(0,s(y)) \succeq 0
  quot(s(x), s(y)) \succeq s(quot(minus(x, y), s(y)))
\min s^{\sharp}(s(x), s(y)) \succ \min s^{\sharp}(x, y)
 quot^{\sharp}(s(x), s(y)) \succ quot^{\sharp}(minus(x, y), s(y))
 quot(^{\sharp}s(x), s(y)) \succ minus^{\sharp}(x, y)
```

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```

Replace minus(x, y) by minus'(x).

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```
minus'(x) \succeq x
      minus'(s(x)) \succeq minus'(x)
      quot(0, s(y)) \succeq 0
  quot(s(x), s(y)) \succeq s(quot(minus'(x), s(y)))
\min s^{\sharp}(s(x), s(y)) \succ \min s^{\sharp}(x, y)
 quot^{\sharp}(s(x), s(y)) \succ quot^{\sharp}(minus'(x), s(y))
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This can be handled using LPO with  $s \triangleright minus'$ .

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Searching a filter can be included in the SAT encoding of LPO.

```
quot^{\sharp}(s(x), s(y)) \succ quot^{\sharp}(minus(x, y), s(y))
      minus(x, 0) \succeq x
\min(s(x), s(y)) \succeq \min(x, y)
    quot(0, s(y)) \succeq 0
 quot(s(x), s(y)) \succeq s(quot(minus(x, y), s(y)))
```

```
quot^{\sharp}(s(x), s(y)) \succ quot^{\sharp}(minus(x, y), s(y))
      minus(x, 0) \succeq x
minus(s(x), s(y)) \succeq minus(x, y)
    quot(0, s(y)) \succeq 0
 quot(s(x), s(y)) \succeq s(quot(minus(x, y), s(y)))
```

```
quot^{\sharp}(s(x), s(y)) \succ quot^{\sharp}(minus(x, y), s(y))
      minus(x, 0) \succeq x
minus(s(x), s(y)) \succeq minus(x, y)
    quot(0, s(y)) \succeq \overline{0}
 quot(s(x), s(y)) \succeq s(quot(minus(x, y), s(y)))
```

Monotonic algebras

## Usable rules

$$quot^{\sharp}(s(x), s(y)) \succ quot^{\sharp}(minus(x, y), s(y))$$

$$minus(x, 0) \succeq x$$

$$minus(s(x), s(y)) \succeq minus(x, y)$$

When considering only a small number of dependency pairs, we might not need all the rules anymore.

$$quot^{\sharp}(s(x), s(y)) \succ quot^{\sharp}(minus(x, y), s(y))$$

$$minus(x, 0) \succeq x$$

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We do get two extra requirements,  $c(x, y) \succeq x$  and  $c(x, y) \succeq y$ .

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We do get two extra requirements,  $c(x, y) \succeq x$  and  $c(x, y) \succeq y$ . Finding usable rules is a very simple reachability algorithm. More complex (but powerful!): combining usable rules with an argument filtering and a reduction pair.

## Quiz

1. Prove termination of the following TRS using a monotonic algebra to  $\mathbb{N}$ :

append(nil,z) 
$$\rightarrow$$
 z  
append(cons(x,y),z)  $\rightarrow$  cons(x,append(y,z))

- give (linear) parametric interpretations for all symbols
- compute the requirements (monotonicity and rule orientation)
- use absolute positiveness to find SMT requirements
- solve them by hand and give the resulting inteprretation functions, and check your result!
- 2. Determine the dependency pairs of:

$$f(h(x), y) \rightarrow g(x, f(x, h(y)))$$
  
 $g(x, h(y)) \rightarrow g(h(x), y)$ 

3. Split these dependency pairs up into one or more groups of DPs that can be analysed separately.