

# Preservation of Recognizability for Weighted Extended Top-down Tree Transducers

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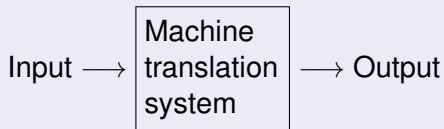
# Collaborators

## reporting joint work with

- JOOST ENGELFRIET (LIACS, Leiden, The Netherlands)
- ZOLTÁN FÜLÖP (U Szeged, Hungary)
- ERIC LILIN (U Lille, France)
- GIORGIO SATTÀ (U Padua, Italy)
- HEIKO VOGLER (TU Dresden, Germany)

# Machine Translation — Unweighted Setup

## Schema



## Question

What are the translations of sentence  $f$ ?

## Answer

- take recognizable language  $\{f\}$
- parse  $f$  giving a recognizable tree language  $L$  such that  $L \subseteq \{t \mid \text{yield}(t) = f\}$
- compute forward application  $M(L)$

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## Problem

$M(L)$  is not necessarily recognizable

## Answer

- in many cases it fortunately is

model	$M(L)$ recognizable?	$M^{-1}(L)$ recognizable?
In-XTOP	✓	✓
I-XTOP	✓	✓
XTOP	✗	✓
In-MBOT	✗	✓
I-MBOT	✗	✓
MBOT	✗	✓
In-STSSG	✗	✗

# Machine Translation — Unweighted Setup

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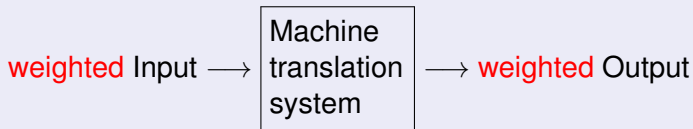
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# Machine Translation — Weighted Setup

## Schema



## Question

What are the translations of sentence  $f$ ?

## Answer

- take recognizable language  $\{f\}$
- parse  $f$  giving a recognizable **weighted** tree language  $L$  such that  $\text{supp}(L) \subseteq \{t \mid \text{yield}(t) = f\}$
- compute forward application  $M(L)$

# Machine Translation — Weighted Setup

## Schema



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# Contents

- 1 Motivation
- 2 Recognizable Weighted Tree Language
- 3 Weighted Extended Top-down Tree Transducer
- 4 Preservation of Recognizability
- 5 Nonpreservation of Recognizability



# Weight structure

## Definition

**Commutative semiring**  $(C, +, \cdot, 0, 1)$  if

- $(C, +, 0)$  and  $(C, \cdot, 1)$  commutative monoids
- $\cdot$  distributes over finite (incl. empty) sums

**Idempotent** if  $c + c = c$

## Example

- BOOLEAN semiring  $(\{0, 1\}, \max, \min, 0, 1)$  (idempotent)
- Semiring  $(\mathbb{N}, +, \cdot, 0, 1)$  of natural numbers
- Tropical semiring  $(\mathbb{N} \cup \{\infty\}, \min, +, \infty, 0)$  (idempotent)
- Any field, ring, etc.

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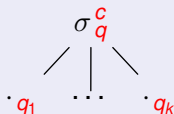
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- **BOOLEAN** semiring  $(\{0, 1\}, \max, \min, 0, 1)$  (idempotent)
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# Weighted tree automaton

Definition (BERSTEL, REUTENAUER 1982)

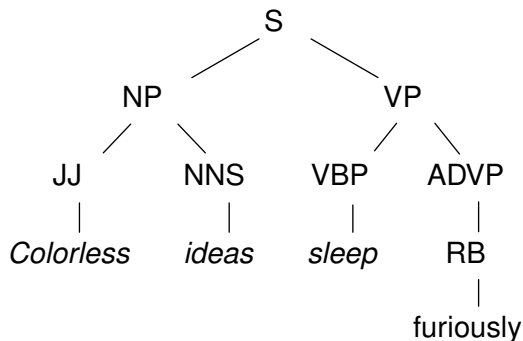
**Weighted tree automaton** (WTA)  $A = (Q, \Sigma, F, \delta)$  with rules



- states  $q, q_1, \dots, q_k \in Q$
- rule weight  $c \in \mathcal{C}$
- $k$ -ary input symbol  $\sigma \in \Sigma_k$

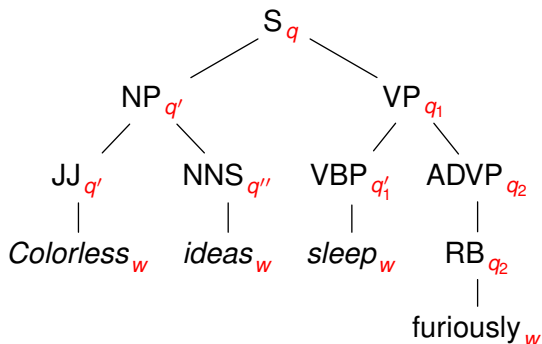
[BERSTEL, REUTENAUER: Recognizable formal power series on trees. Theor. Comput. Sci. 1982]

# Run



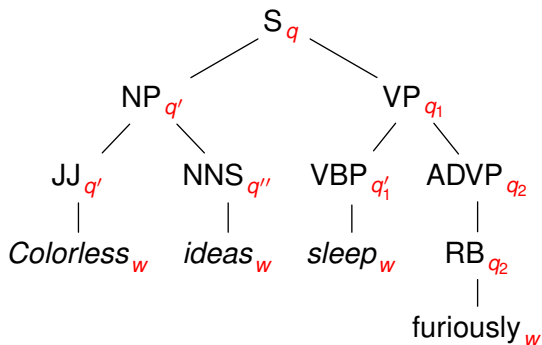
- 1 arbitrarily assign states
- 2 look-up rule weights

# Run

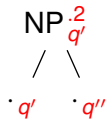


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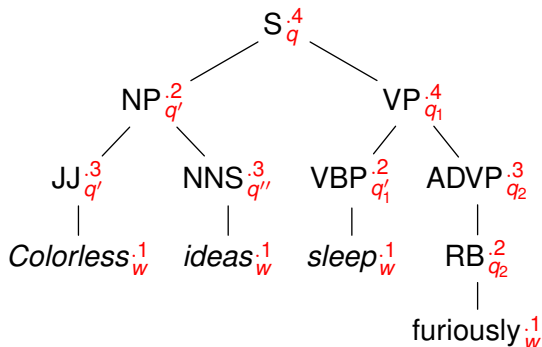
# Run



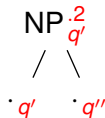
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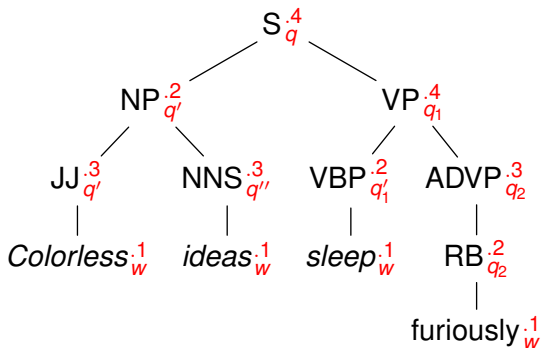
# Run



- 1 arbitrarily assign states
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# Run

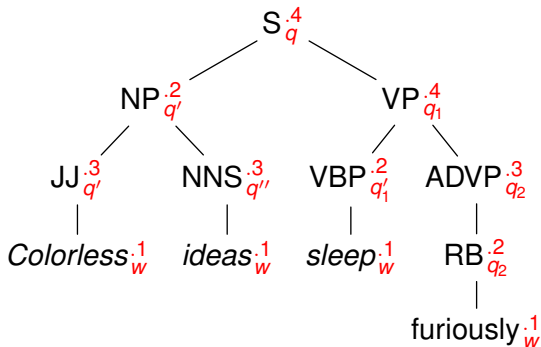


## Definition

**Weight**  $\text{wt}(r)$  of run  $r$  = product of its weights



# Run



## Definition

**Weight**  $wt(r)$  of run  $r$  = product of its weights

## Example (Weight of the run)

$$wt(r) = 0.4 \cdot 0.2 \cdot 0.3 \cdot 0.1 \cdot 0.3 \cdot 0.1 \cdot 0.4 \cdot 0.2 \cdot 0.1 \cdot 0.3 \cdot 0.2 \cdot 0.1$$

# Semantics

## Definition

**Weight**  $A(t)$  of tree  $t$  = sum of weights of runs scaled by final weight

$$A(t) = \sum_{r \text{ run on } t} \text{wt}(r) \cdot F(\text{root}(r))$$

## Definition

Weighted tree language **recognizable** if computable by WTA

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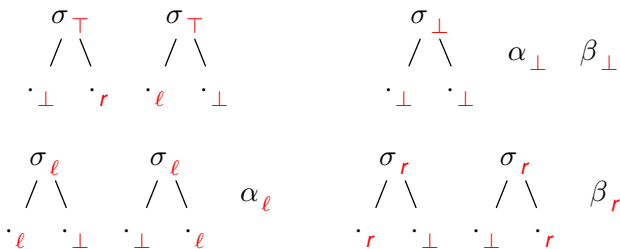
## Definition

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# Unweighted example

## Example

$A = (\{l, r, \top, \perp\}, \Sigma, \{\top\}, \delta)$  with  $\Sigma = \{\sigma^{(2)}, \alpha^{(0)}, \beta^{(0)}\}$

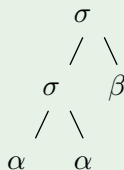


- $\top$  reached on  $l$  or  $r$  in left or right subtree
- $\perp$  can accept any tree
- $l$  and  $r$  accept  $\alpha$  and  $\beta$  and propagate

# Unweighted example

## Example

Input tree



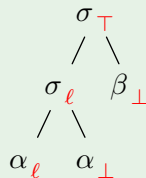
Recognized language

$$A = \{\sigma(t_1, t_2) \mid |t_1|_\alpha \neq 0 \text{ or } |t_2|_\beta \neq 0\}$$

# Unweighted example

## Example

Accepting run



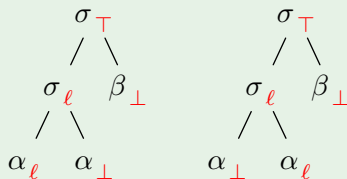
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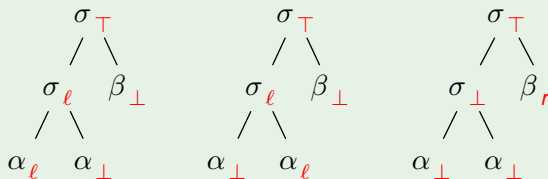
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Recognized language

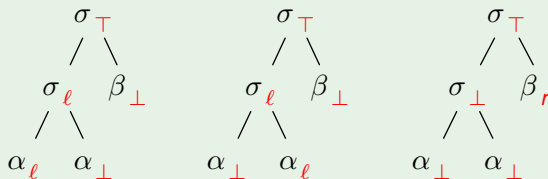
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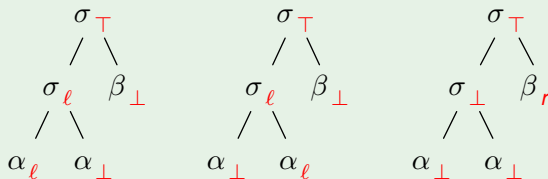
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## Recognized language

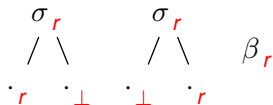
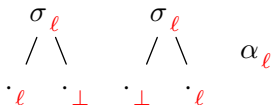
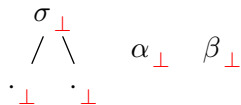
$$\begin{aligned} A &= \{\sigma(t_1, t_2) \mid |t_1|_\alpha \neq 0 \text{ or } |t_2|_\beta \neq 0\} \\ &= \{\sigma(t_1, t_2) \mid |t_1|_\alpha + |t_2|_\beta \neq 0\} \end{aligned}$$

# Weighted example

## Example

$A = (\{l, r, \top, \perp\}, \Sigma, F, \delta)$  over the field  $(\mathbb{R}, +, \cdot, 0, 1)$  of reals

- $F(\top) = 1$  and  $F(q) = 0$  otherwise
- $\Sigma = \{\sigma^{(2)}, \alpha^{(0)}, \beta^{(0)}\}$



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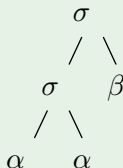
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$$\begin{array}{cccc}
 \begin{array}{c} \sigma_{\top}^1 \\ / \quad \backslash \\ \cdot_{\perp} \quad \cdot_r \end{array} & \begin{array}{c} \sigma_{\top}^1 \\ / \quad \backslash \\ \cdot_l \quad \cdot_{\perp} \end{array} & & \begin{array}{c} \sigma_{\perp}^1 \\ / \quad \backslash \\ \cdot_{\perp} \quad \cdot_{\perp} \end{array} \quad \alpha_{\perp}^1 \quad \beta_{\perp}^1 \\
 \\
 \begin{array}{c} \sigma_l^1 \\ / \quad \backslash \\ \cdot_l \quad \cdot_{\perp} \end{array} & \begin{array}{c} \sigma_l^1 \\ / \quad \backslash \\ \cdot_{\perp} \quad \cdot_l \end{array} & \alpha_l^1 & \begin{array}{c} \sigma_r^1 \\ / \quad \backslash \\ \cdot_r \quad \cdot_{\perp} \end{array} \quad \begin{array}{c} \sigma_r^1 \\ / \quad \backslash \\ \cdot_{\perp} \quad \cdot_r \end{array} \quad \beta_r^{-1}
 \end{array}$$

# Weighted example

## Example

Input tree



Recognized weighted language

$$A(\sigma(t_1, t_2)) = |t_1|_\alpha - |t_2|_\beta$$

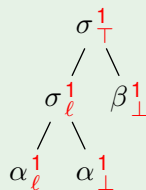
## Note

Support  $\text{supp}(A) = \{\sigma(t_1, t_2) \mid |t_1|_\alpha \neq |t_2|_\beta\}$  is not recognizable!  
(i.e., language of non-zero weighted trees)

# Weighted example

## Example

Non-zero weighted run



## Recognized weighted language

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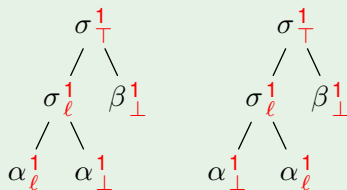
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## Example

### Non-zero weighted run



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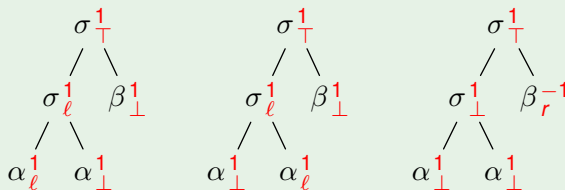
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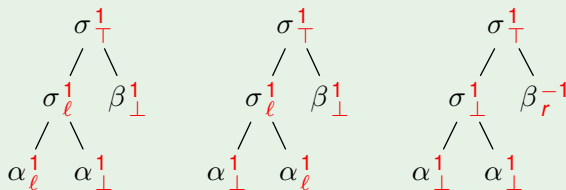
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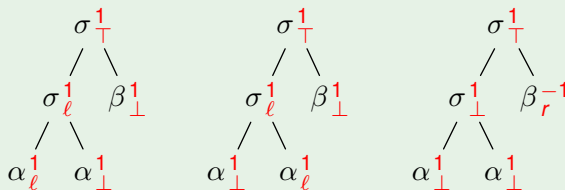
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## Recognized weighted language

$$A(\sigma(t_1, t_2)) = |t_1|_{\alpha} - |t_2|_{\beta}$$

## Note

Support  $\text{supp}(A) = \{\sigma(t_1, t_2) \mid |t_1|_{\alpha} \neq |t_2|_{\beta}\}$  is not recognizable!  
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# Contents

1 Motivation

2 Recognizable Weighted Tree Language

**3 Weighted Extended Top-down Tree Transducer**

4 Preservation of Recognizability

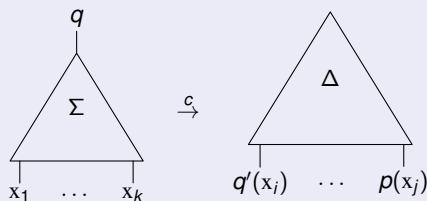
5 Nonpreservation of Recognizability

# Syntax

Definition (ARNOLD, DAUCHET 1976, GRAEHL, KNIGHT 2004)

**Weighted extended top-down tree transducer (WXTT)**

$M = (Q, \Sigma, \Delta, I, R)$  with finitely many rules



- states  $q, q', p \in Q$
- variable indices  $i, j \in \{1, \dots, k\}$

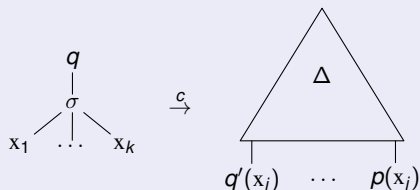
[ARNOLD, DAUCHET: *Bi-transductions de forêts*. Proc. ICALP 1976]

[GRAEHL, KNIGHT: *Training tree transducers*. Proc. NAACL 2004]

# Syntax

Definition (ROUNDS 1970, THATCHER 1970)

Weighted top-down tree transducer (WTT) if all rules



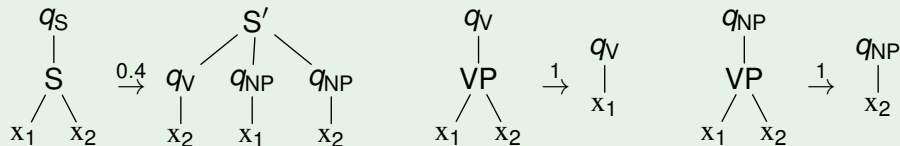
[ROUNDS: *Mappings and grammars on trees*. Math. Syst. Theory, 1970]

[THATCHER: *Generalized sequential machine maps*. J. Comput. Syst. Sci., 1970]

# Semantics

## Example

States  $\{q_S, q_V, q_{NP}\}$  of which only  $q_S$  has non-zero initial weight

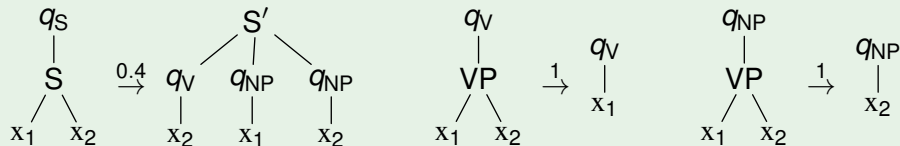


## Derivation

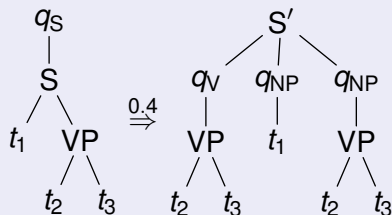
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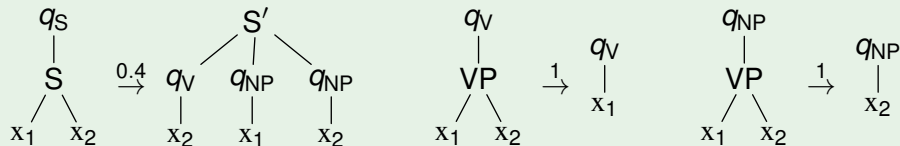
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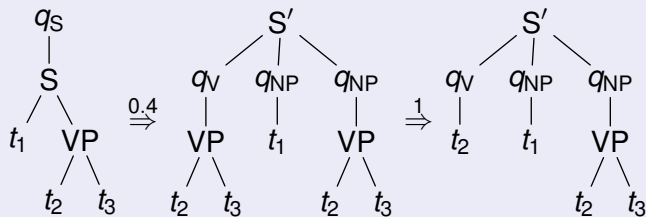
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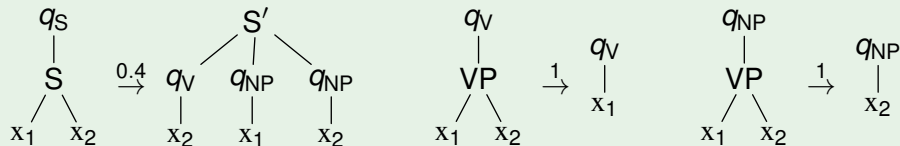




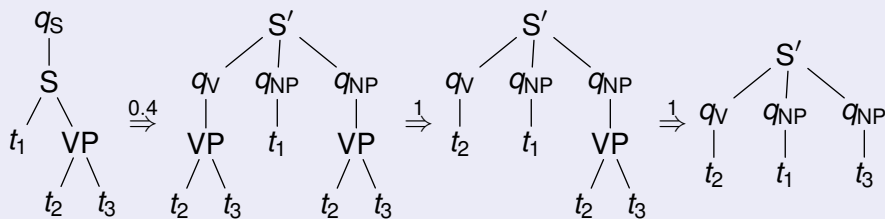
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## Example

States  $\{q_S, q_V, q_{NP}\}$  of which only  $q_S$  has non-zero initial weight



## Derivation



## Definition

**Computed transformation** ( $t \in T_\Sigma$  and  $u \in T_\Delta$ ):

$$M(t, u) = \sum_{\substack{q \in Q \\ q(t) \xrightarrow{c_1} \dots \xrightarrow{c_n} u \\ \text{left-most derivation}}} I(q) \cdot c_1 \cdot \dots \cdot c_n$$

# Contents

- 1 Motivation
- 2 Recognizable Weighted Tree Language
- 3 Weighted Extended Top-down Tree Transducer
- 4 Preservation of Recognizability**
- 5 Nonpreservation of Recognizability

# Preservation of recognizability

## Definition (Forward application)

$M: T_{\Sigma} \times T_{\Delta} \rightarrow C$  and  $A: T_{\Sigma} \rightarrow C$

$$[M(A)](u) = \sum_{t \in T_{\Sigma}} A(t) \cdot M(t, u)$$

## Approach

- 1 Input (or output) product followed by projection
- 2 Direct construction

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- 1 Input (or output) product followed by projection
- 2 Direct construction

## Input product + projection

Definition (Forward application)

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Definition (Input product)

**Input product** of WTA  $A$  and WXTT  $M$  is WXTT  ${}_A M$  with

$${}_A M(t, u) = A(t) \cdot M(t, u)$$

Definition (Range projection)

WXTT  $M$

$$[\text{ran}(M)](u) = \sum_{t \in T_{\Sigma}} M(t, u)$$

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$$M(A) = \text{ran}({}_A M)$$

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$$[\text{ran}(M)](u) = \sum_{t \in T_{\Sigma}} M(t, u)$$



# Product + projection

## positive

- two simple generic constructions
  - ▶ BAR-HILLEL construction
  - ▶ projection
- reusable
- explain most known cases

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- two simple generic constructions
  - ▶ BAR-HILLEL construction
  - ▶ projection
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- explain most known cases

## negative

- requirements of two constructions
- inefficiencies

# Product + projection

## Requirement

model	input product	range projection	output product	domain projection
In-XTOP	✓	✓	✓	✓
I-XTOP	✗	✓/✗	✓	✓
XTOP	✗	✗	✓	✗
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## Conclusion

Nondeletion essential for input product!

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model	input product		range projection	output product		domain projection
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XTOP	✗	(✗)	✗	✓	(✗)	✗
In-MBOT	✓	(✗)	✗	✓	(✓)	✓
I-MBOT	✓	(✗)	✗	✓	(✓)	✓
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Nondeletion essential for input product!

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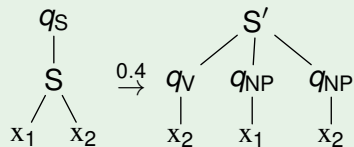
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## Conclusion

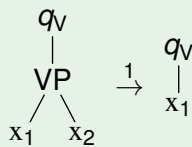
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# Nondeletion

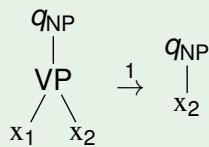
## Example



nondeleting



linear



linear

## Definition

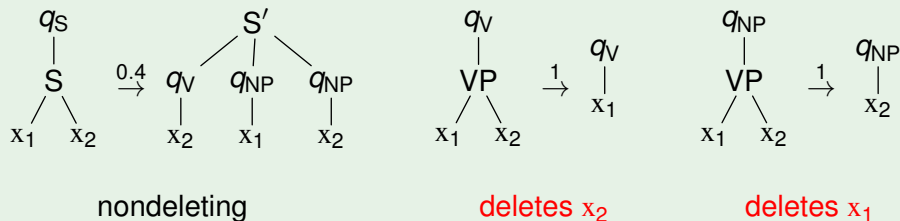
WXTT  $M$  is

- **nondeleting** if  $\text{var}(l) = \text{var}(r)$  for all rules  $l \rightarrow r$
- **linear** if no variable appears twice in  $r$  for all rules  $l \rightarrow r$



# Nondeletion

## Example

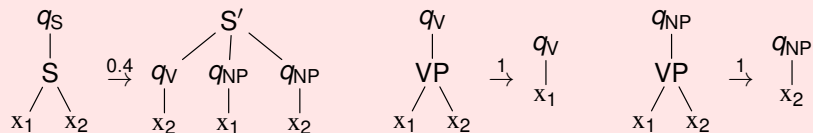


## Definition

- **all-copies nondeleting** = nondeleting  
= every copy of an input subtree is fully explored
- **some-copy nondeleting**  
= one copy of each input subtree is fully explored

# Nondeletion

## Example



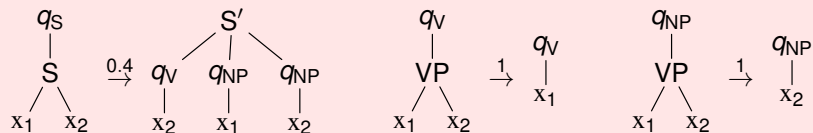
is **not** some-copy nondeleting

## Example (Derivation)



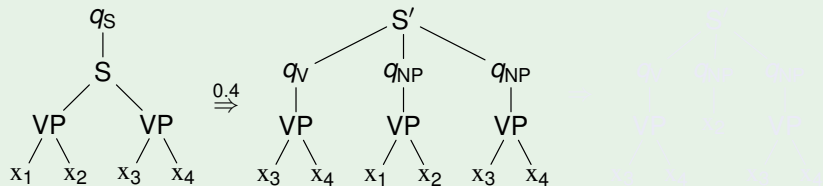
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## Example



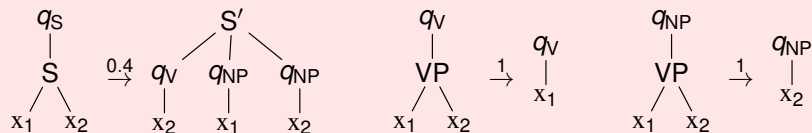
is **not** some-copy nondeleting

## Example (Derivation)



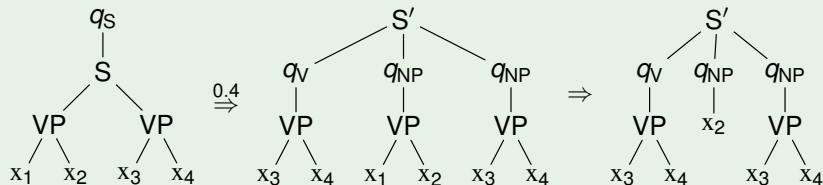
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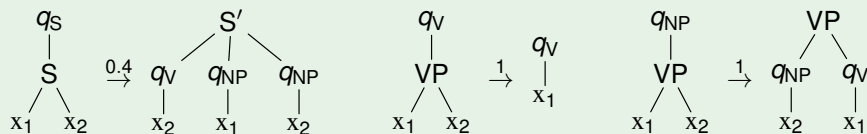
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## Example (Derivation)



# Nondeletion

## Example



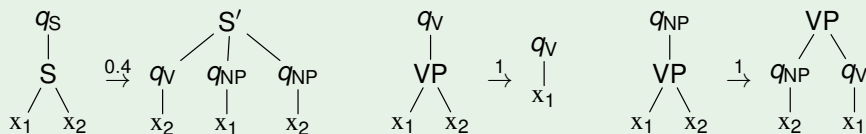
can be some-copy nondeleting

## Example (Derivation)



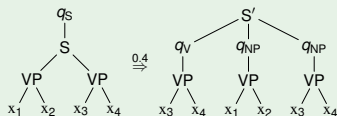
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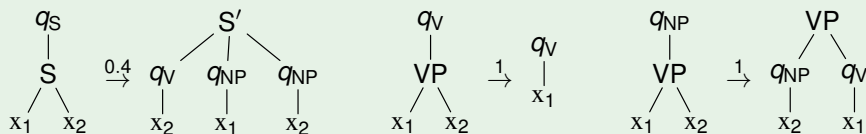
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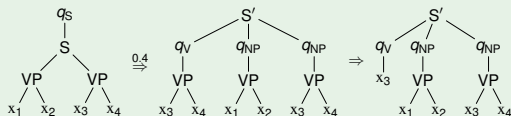
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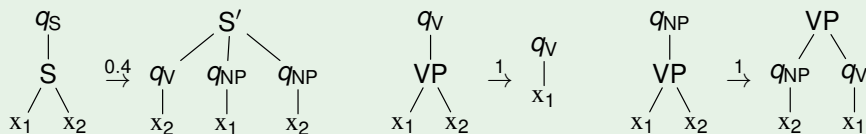
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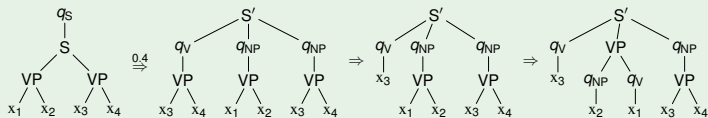
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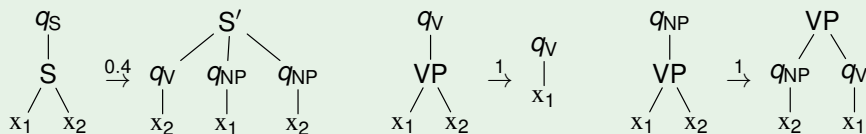
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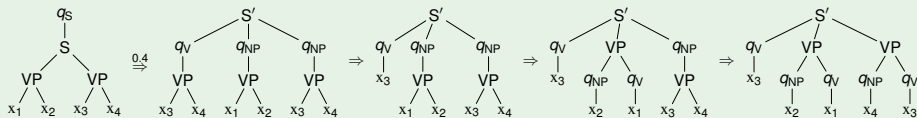
# Nondeletion

## Example



can be some-copy nondeleting

## Example (Derivation)

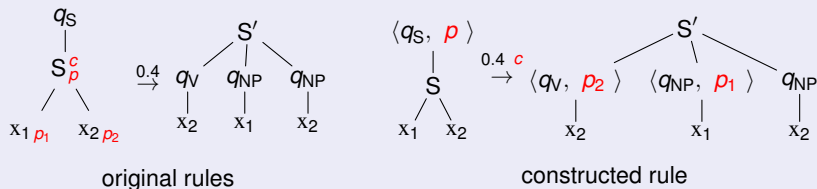


# Scenario 1

## Theorem (ENGELFRIET 1977)

For nondeleting WXTT  $M$  and WTA  $A$  we can construct  $A_M$

## Proof.



- for original nondeleting rules construct new rules
- mark one state for each variable; one possibility
- $x_2 a \ x_1 b \ x_2 d \rightarrow \boxed{x_2}^e_a \ \boxed{x_1}^f_b \ x_2 d$

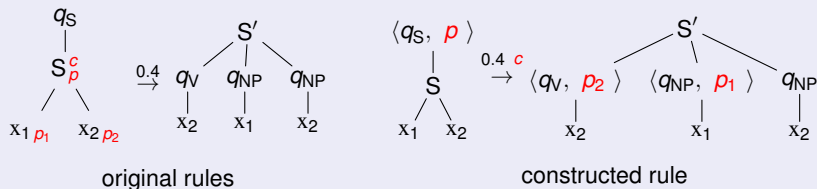


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## Scenario 2

### Theorem ( $\sim$ 2010)

For *some-copy nondeleting* WXTT  $M$  and WTA  $A$  over *idempotent* semiring we can construct  ${}_A M$

### Proof.

- for original nondeleting rules construct new rules
- mark one state for each variable; **all** possibilities

$$x_2 a \quad x_1 b \quad x_2 d \quad \rightarrow \quad \boxed{x_2}^e_a \quad \boxed{x_1}^f_b \quad x_2 d \quad | \quad x_2 a \quad \boxed{x_1}^f_b \quad \boxed{x_2}^e_d$$

- at least one exploration will succeed (some-copy nondeletion)
- $aebfd + abfde = abdef$  if several succeed (idempotency)



## Scenario 2

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For some-copy nondeleting WXTT  $M$  and WTA  $A$  over idempotent semiring we can construct  ${}_A M$

### Proof.

- for original nondeleting rules construct new rules
- mark one state for each variable; **all** possibilities

$$x_2 a \quad x_1 b \quad x_2 d \quad \rightarrow \quad \boxed{x_2} \begin{matrix} e \\ a \end{matrix} \quad \boxed{x_1} \begin{matrix} f \\ b \end{matrix} \quad x_2 d \quad | \quad x_2 a \quad \boxed{x_1} \begin{matrix} f \\ b \end{matrix} \quad \boxed{x_2} \begin{matrix} e \\ d \end{matrix}$$

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## Scenario 2

### Theorem (~ 2010)

For *some-copy nondeleting* WXTT  $M$  and WTA  $A$  over *idempotent* semiring we can construct  ${}_A M$

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## Scenario 3

### Theorem ( $\sim$ 2010)

For *some-copy nondeleting* WXTT  $M$  and WTA  $A$  over *ring* we can construct  ${}_A M$

### Proof.

- for original nondeleting rules construct several new rules
- mark states according to *elimination scheme*
- $x_{2a} x_{1b} x_{2d} \rightarrow$

$$\boxed{x_2}_a^e \boxed{x_1}_b^f x_{2d} \mid x_{2a} \boxed{x_1}_b^f \boxed{x_2}_d^e \mid \boxed{x_2}_a^e \boxed{x_1}_b^f \boxed{x_2}_d^{-1}$$

- at least one exploration will succeed



## Scenario 3

### Theorem ( $\sim 2010$ )

For some-copy nondeleting WXTT  $M$  and WTA  $A$  over ring we can construct  ${}_A M$

### Proof.

- for original nondeleting rules construct several new rules
- mark states according to **elimination scheme**
- $x_2 a \ x_1 b \ x_2 d \rightarrow$

$$\boxed{x_2} \begin{matrix} e \\ a \end{matrix} \quad \boxed{x_1} \begin{matrix} f \\ b \end{matrix} \quad x_2 d \quad | \quad x_2 a \quad \boxed{x_1} \begin{matrix} f \\ b \end{matrix} \quad \boxed{x_2} \begin{matrix} e \\ d \end{matrix} \quad | \quad \boxed{x_2} \begin{matrix} e \\ a \end{matrix} \quad \boxed{x_1} \begin{matrix} f \\ b \end{matrix} \quad \boxed{x_2} \begin{matrix} -1 \\ d \end{matrix}$$

- at least one exploration will succeed





## Scenario 3

### Theorem ( $\sim 2010$ )

For some-copy nondeleting WXTT  $M$  and WTA  $A$  over ring we can construct  ${}_A M$

### Proof.

- if several succeed, then

$$\begin{array}{ccc|ccc|ccc} \boxed{x_2}^e & \boxed{x_1}^f & x_2 d & x_2 a & \boxed{x_1}^f & \boxed{x_2}^e & \boxed{x_2}^e & \boxed{x_1}^f & \boxed{x_2}^{-1} \\ \boxed{a} & \boxed{b} & & & \boxed{b} & \boxed{d} & \boxed{a} & \boxed{b} & \boxed{d} \\ \\ aebfd & & & 0 & & & 0 & & \\ & 0 & & abfd & & & 0 & & \\ aebfd & & & abfd & & & -aebfd & & \end{array}$$



# Elimination schemes

## Question

Do elimination schemes exist?

## Answer

	001	010	100	011	101	110	111	$\Sigma$
	+	+	+	-	-	-	+	
001	$a$	0	0	0	0	0	0	$a$
010	0	$a$	0	0	0	0	0	$a$
100	0	0	$a$	0	0	0	0	$a$
011	$a$	$a$	0	$-a$	0	0	0	$a$
101	$a$	0	$a$	0	$-a$	0	0	$a$
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<b>011</b>	<b><math>a</math></b>	<b><math>a</math></b>	<b>0</b>	<b><math>-a</math></b>	<b>0</b>	<b>0</b>	<b>0</b>	<b><math>a</math></b>
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# Direct construction

## Applicability

- here only I-XTOP (product + projection fails)

## Failure

- input product fails  
because it cannot attach weights to deleted subtrees
- but range projection disregards input trees

## Solution

- assign aggregate weight to transitions deleting subtrees

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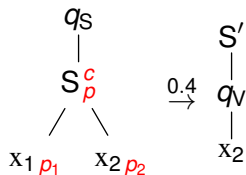
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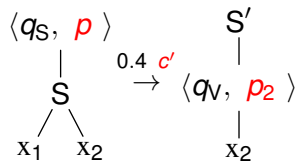
- assign aggregate weight to transitions deleting subtrees



## Bonus scenario



original rules



constructed rule

where  $c' = c \cdot \text{in}(p_1)$

### Inside weight of $p$

$$\text{in}(p) = \sum_{\substack{t \in T_\Sigma \\ r \text{ run on } t \\ \text{root}(r)=p}} \text{wt}(r)$$

## Bonus scenario

### Theorem

*For linear WXTT  $M$  and WTA  $A$  we can construct  ${}_A M$   
if inside weights of  $A$  can be computed*

### Computation of inside weights

- trivial in BOOLEAN semiring
  - typically simple in extremal semirings (VITERBI algorithms)
  - possible in  $\mathbb{N}$  (deciding finiteness of support)
- possible in many interesting cases
- approximation possible for  $\mathbb{R}$  (NEWTON method)

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## Limitation

- no coverage of unweighted failures
- only backward application of XTOP!  
(same phenomenon for MBOT)

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In-STSSG	✗	✗

## Limitation

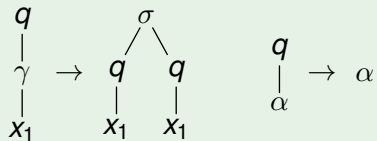
- no coverage of unweighted failures
- only backward application of XTOP!  
(same phenomenon for MBOT)



# Counterexample

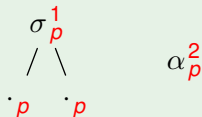
WXTT  $M$

Example



WTA  $A$

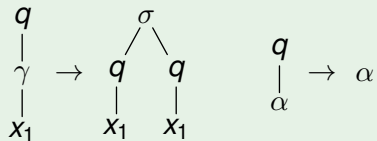
Example



# Counterexample

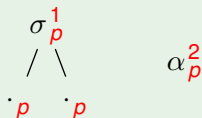
WXTT  $M$

## Example

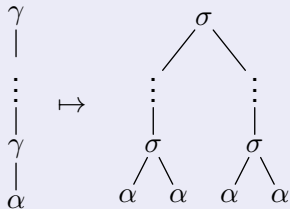


WTA  $A$

## Example



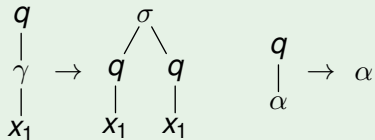
## Transformation



# Counterexample

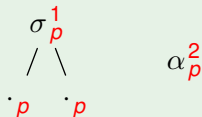
WXTT  $M$

## Example

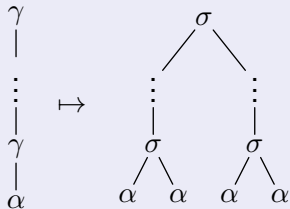


WTA  $A$

## Example



## Transformation

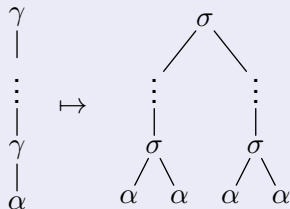


## Weighted tree language

$$A(u) = 2^{|u|_\alpha}$$

# Counterexample

## Transformation $M$



$$|u|_{\alpha} = 2^{|\gamma|}$$

## Weighted tree language $A$

$$A(u) = 2^{|u|_{\alpha}}$$

## Backward application

$$[M^{-1}(A)](t) = 2^{(2^{|\gamma|}t)}$$

## Theorem

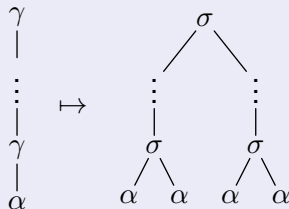
For every WTA  $A$  over  $\mathbb{N}$  there exists  $n \in \mathbb{N}$  such that  $\forall t \in T_{\Sigma}$

$$A(t) \leq n^{|t|+1}$$

[FÜLÖP, ~, VOGLER: *Weighted extended tree transducers*. Fundam. Inform. 2011]

# Counterexample

## Transformation $M$



$$|u|_\alpha = 2^{|t|_\gamma}$$

## Weighted tree language $A$

$$A(u) = 2^{|u|_\alpha}$$

## Backward application

$$[M^{-1}(A)](t) = 2^{(2^{|t|_\gamma})}$$

## Theorem

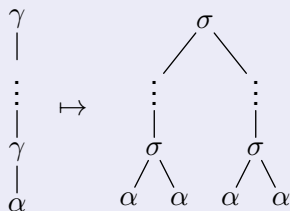
For every WTA  $A$  over  $\mathbb{N}$  there exists  $n \in \mathbb{N}$  such that  $\forall t \in T_\Sigma$

$$A(t) \leq n^{|t|+1}$$

[FÜLÖP, ~, VOGLER: *Weighted extended tree transducers*. Fundam. Inform. 2011]

# Counterexample

## Transformation $M$



$$|u|_\alpha = 2^{2^l}$$

## Weighted tree language $A$

$$A(u) = 2^{|u|_\alpha}$$

## Backward application

$$[M^{-1}(A)](t) = 2^{(2^{2^l})}$$

## Theorem

For every WTA  $A$  over  $\mathbb{N}$  there exists  $n \in \mathbb{N}$  such that  $\forall t \in T_\Sigma$

$$A(t) \leq n^{|t|+1}$$

[FÜLÖP, ~, VOGLER: *Weighted extended tree transducers*. Fundam. Inform. 2011]

# Overview

model	$M(L)$ recognizable?	$M^{-1}(L)$ recognizable?
In-XTOP	✓	✓
I-XTOP	✓/✗ (✓)	✓
XTOP	✗	✗ (✓)
In-MBOT	✗	✓
I-MBOT	✗	✓ (✓)
MBOT	✗	✗ (✓)
In-STSSG	✗	✗

That's all, folks!

Thank you for your attention!



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