

Characterizations of subregular tree languages

Andreas Maletti

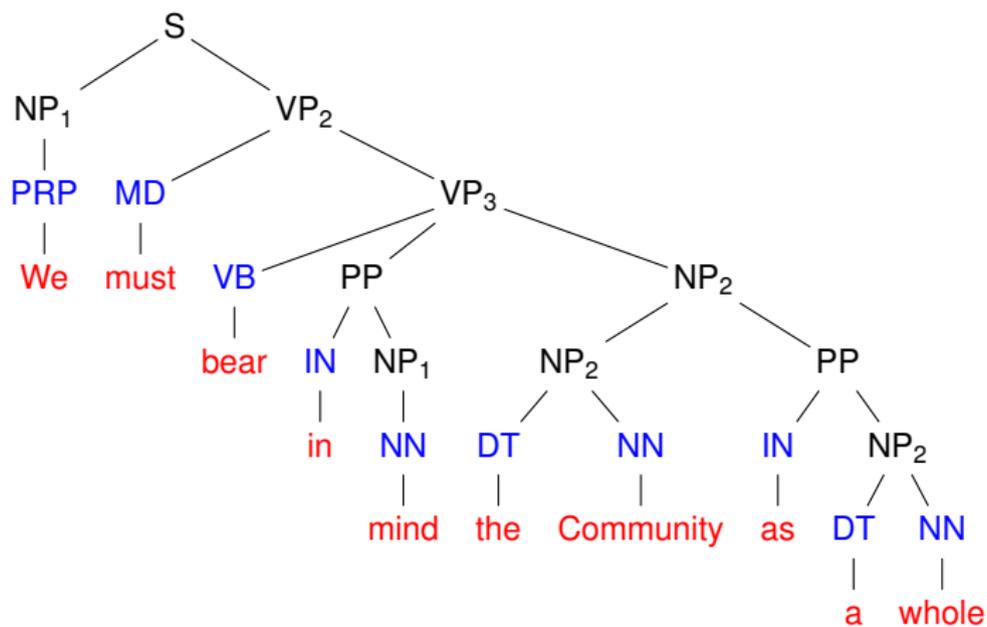
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Constituent Syntax Tree

Syntax tree for **We must bear in mind the Community as a whole**



Constituent Syntax Tree

Tree

$T_{\Sigma}(V)$ for sets Σ and V is least set T of **trees** s.t.

- 1 Variables: $V \subseteq T$
- 2 Top concatenation: $\sigma(t_1, \dots, t_k) \in T$ for $k \in \mathbb{N}$, $\sigma \in \Sigma$, $t_1, \dots, t_k \in T$

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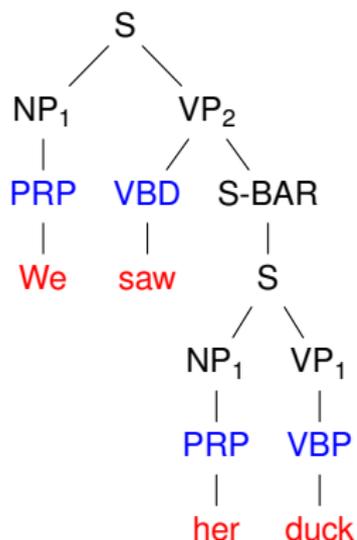
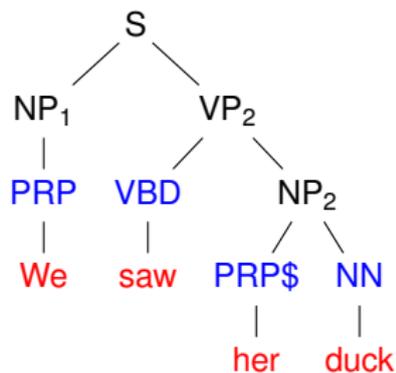
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- **tree language** = set of trees

Constituent Syntax Trees

Syntax tree is not unique

(weights are used for disambiguation)



Representations

- enumeration

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- enumeration
- proof trees of combinatory categorial grammars
- local tree languages
- tree substitution languages
- regular tree languages

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- **regular tree languages**

Regular tree language

$L \subseteq T_{\Sigma}(\emptyset)$ **regular** iff \exists congruence \cong (top-concatenation) on $T_{\Sigma}(\emptyset)$ s.t.

- 1 \cong has finite index (finitely many equiv. classes)
- 2 \cong saturates L ; i.e. $L = \bigcup_{t \in L} [t]_{\cong}$

Regular Tree Languages

Examples for $\Sigma = \{\sigma, \delta, \alpha\}$:

- 2 equivalence classes (L and $T_\Sigma(\emptyset) \setminus L$)

$$L = \{t \in T_\Sigma(\emptyset) \mid t \text{ contains odd number of } \alpha\}$$

Regular Tree Languages

Examples for $\Sigma = \{\sigma, \delta, \alpha\}$:

- 2 equivalence classes (L and $T_\Sigma(\emptyset) \setminus L$)

$$L = \{t \in T_\Sigma(\emptyset) \mid t \text{ contains odd number of } \alpha\}$$

- 3 equivalence classes (“no σ ”, “some σ , but legal”, illegal)

$$L' = \{t \in T_\Sigma(\emptyset) \mid \sigma \text{ never below } \delta\}$$

Regular Tree Languages

Regular tree grammar [Brainerd, 1969]

$$G = (Q, \Sigma, I, P)$$

- alphabet Q of nonterminals and initial nonterminals $I \subseteq Q$
- alphabet of terminals Σ
- finite set of productions $P \subseteq T_{\Sigma}(Q) \times Q$
(we write $r \rightarrow q$ for productions (r, q))

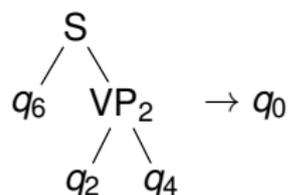
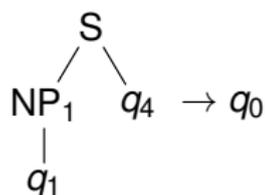
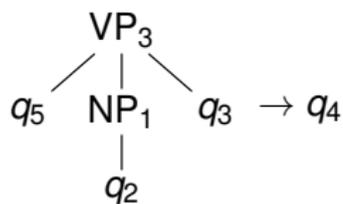
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Example productions

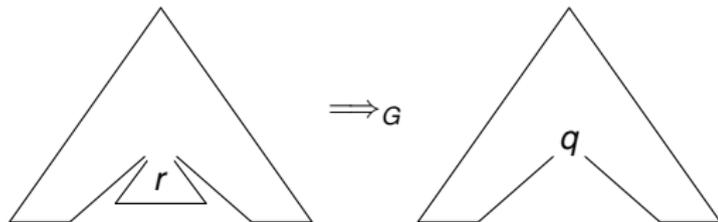


Regular Tree Languages

Derivation semantics and recognized tree language

Regular tree grammar $G = (Q, \Sigma, l, P)$

- for each production $r \rightarrow q \in P$

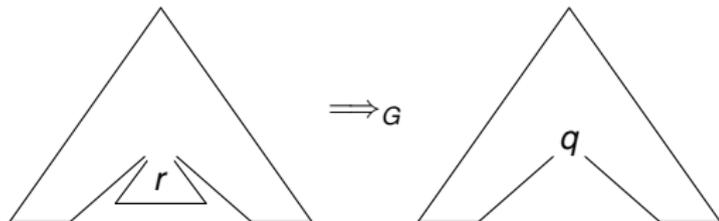


Regular Tree Languages

Derivation semantics and recognized tree language

Regular tree grammar $G = (Q, \Sigma, I, P)$

- for each production $r \rightarrow q \in P$



- generated tree language

$$L(G) = \{t \in T_{\Sigma}(\emptyset) \mid \exists q \in I: t \Rightarrow_G^* q\}$$

Regular Tree Languages

Recall 3 equivalence classes (“no σ ”, “some σ , but legal”, illegal)

$$L' = \{t \in T_{\Sigma}(\emptyset) \mid \sigma \text{ never below } \delta\}$$

$$\mathcal{C}_1 = [\alpha]$$

$$\mathcal{C}_2 = [\sigma(\alpha, \alpha)]$$

$$\mathcal{C}_3 = [\delta(\sigma(\alpha, \alpha), \alpha)]$$

Regular Tree Languages

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Productions with nonterminals $\mathcal{C}_1, \mathcal{C}_2, \mathcal{C}_3$

$$\alpha \rightarrow \mathcal{C}_1 \quad \delta(\mathcal{C}_1, \mathcal{C}_1) \rightarrow \mathcal{C}_1$$

$$\sigma(\mathcal{C}_1, \mathcal{C}_1) \rightarrow \mathcal{C}_2 \quad \sigma(\mathcal{C}_1, \mathcal{C}_2) \rightarrow \mathcal{C}_2 \quad \sigma(\mathcal{C}_2, \mathcal{C}_1) \rightarrow \mathcal{C}_2 \quad \sigma(\mathcal{C}_2, \mathcal{C}_2) \rightarrow \mathcal{C}_2$$

$$\delta(\mathcal{C}_1, \mathcal{C}_2) \rightarrow \mathcal{C}_3 \quad \delta(\mathcal{C}_1, \mathcal{C}_3) \rightarrow \mathcal{C}_3 \quad \delta(\mathcal{C}_2, \mathcal{C}_1) \rightarrow \mathcal{C}_3 \quad \delta(\mathcal{C}_2, \mathcal{C}_2) \rightarrow \mathcal{C}_3$$

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$$\sigma(\mathcal{C}_3, \mathcal{C}_3) \rightarrow \mathcal{C}_3$$

Regular Tree Languages

Properties

- ✓ simple
- ✓ most expressive class we consider
- ✗ ambiguity, (several explanations for a generated tree)
but can be removed
- ✓ closed under all Boolean operations
(union/intersection/complement: ✓/✓/✓)
- ✓ all relevant properties decidable (emptiness, inclusion, ...)

Characterizations

- finite index congruences
- regular tree grammars
- (deterministic) tree automata
- regular tree expressions
- monadic second-order formulas
- ...

Representations

- enumeration
- proof trees of combinatory categorial grammars
- local tree languages
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Categories

- **category** = tree of $T_S(A)$ with $S = \{/, \backslash\}$ and atomic categories A
- e.g. $D/E/E\backslash C$ corresponds to $\backslash(/(/(D, E), E), C)$

Combinatory Categorical Grammars

Combinators (Compositions)

Composition rules of degree k are

$$ax/c, cy \rightarrow axy \quad (\text{forward rule})$$

$$cy, ax \setminus c \rightarrow axy \quad (\text{backward rule})$$

with $y = |_1c_1|_2 \cdots |_kc_k$

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Examples:

$$\underbrace{\frac{C \quad D/E/D \setminus C}{D/E/D}}_{\text{degree 0}}$$

$$\underbrace{\frac{D/E/D \quad D/E \setminus C}{D/E/E \setminus C}}_{\text{degree 2}}$$

Combinatory Categorical Grammar (CCG)

(Σ, A, k, I, L)

- terminal alphabet Σ and atomic categories A
- maximal degree $k \in \mathbb{N} \cup \{\infty\}$ of composition rules
- initial categories $I \subseteq A$
- lexicon $L \subseteq \Sigma \times \mathcal{C}(A)$ with $\mathcal{C}(A)$ categories over A

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Notes:

- always all rules up to the given degree k allowed
- **k -CCG** = CCG using all composition rules up to degree k

Combinatory Categorical Grammars

$$\begin{array}{cccccc}
 c & c & d & d & e & e \\
 \vdots & \vdots & \vdots & \vdots & \vdots & \vdots \\
 \vdots & C & D/E/D \setminus C & \vdots & \vdots & \vdots \\
 \vdots & \frac{C}{D/E/D} & D/E \setminus C & \vdots & \vdots & \vdots \\
 C & \frac{D/E/D}{D/E/E \setminus C} & \vdots & \vdots & \vdots & \vdots \\
 \hline
 & D/E/E & E & \vdots & \vdots & \vdots \\
 \hline
 & \frac{D/E/E}{D/E} & E & \vdots & \vdots & \vdots \\
 \hline
 & & D & & E & \\
 \hline
 & & & & & D
 \end{array}$$

2-CCG generates string language \mathcal{L} with $\mathcal{L} \cap c^+d^+e^+ = \{c^i d^i e^i \mid i \geq 1\}$
 for initial categories $\{D\}$

$$L(c) = \{C\}$$

$$L(d) = \{D/E \setminus C, D/E/D \setminus C\}$$

$$L(e) = \{E\}$$

Combinatory Categorical Grammars

- allow (deterministic) relabeling (to allow arbitrary labels)
- tree t **min-height bounded by k**
if the minimal distance from each node to a leaf is at most k

Theorem

(Under relabeling) Class of proof trees of 0-CCGs
= class of min-height bounded binary regular tree languages

joint work with Marco Kuhlmann

Combinatory Categorical Grammars

Theorem

(Under relabeling) Class of proof trees of 1-CCGs
 \subsetneq class of binary regular tree languages

Combinatory Categorical Grammars

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Theorem

(Under relabeling*) Class of proof trees of ∞ -CCGs
 \subsetneq class of simple context-free tree languages

joint work with Marco Kuhlmann

Combinatory Categorical Grammars

$$\frac{\frac{ax/(by) \quad by\alpha/c}{ax\alpha/c} \quad c}{ax\alpha} \xrightarrow{R1} \frac{ax/(by) \quad \frac{by\alpha/c \quad c}{by\alpha}}{ax\alpha}$$

$$\frac{c \quad \frac{by\alpha \setminus c \quad ax \setminus (by)}{ax\alpha \setminus c}}{ax\alpha} \xrightarrow{R2} \frac{c \quad \frac{by\alpha \setminus c}{by\alpha}}{ax\alpha} \quad ax \setminus (by)$$

$$\frac{c \quad \frac{ax/(by) \quad by\alpha \setminus c}{ax\alpha \setminus c}}{ax\alpha} \xrightarrow{R3} \frac{ax/(by) \quad \frac{c \quad by\alpha \setminus c}{by\alpha}}{ax\alpha}$$

$$\frac{\frac{by\alpha/c \quad ax \setminus (by)}{ax\alpha/c} \quad c}{ax\alpha} \xrightarrow{R4} \frac{\frac{by\alpha/c \quad c}{by\alpha}}{ax\alpha} \quad ax \setminus (by)$$

Combinatory Categorical Grammars

Properties

- ✓ simple
- ✗ ambiguity (several explanations for each recognized tree)
- ✗ not closed under Boolean operations
(union/intersection/complement: ✓/?/✗*)
- ✓ closed under (non-injective) relabelings
- ? decidability of membership for subregular classes (0-CCG & 1-CCG) of a regular tree language

Tree Languages

Representations

- enumerate trees
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Local tree grammar [Gécseg, Steinby 1984]

Local tree grammar = finite set of legal branchings
(together with a set of root labels)

$$G = (\Sigma, I, P) \text{ with } I \subseteq \Sigma \text{ and } P \subseteq \bigcup_{k \in \mathbb{N}} \Sigma \times \Sigma^k$$

Local Tree Languages

Example (with root label S)

$$S \rightarrow NP_1 VP_2$$
$$NP_2 \rightarrow NP_2 PP$$
$$MD \rightarrow \text{must}$$
$$VP_2 \rightarrow MD VP_3$$
$$VP_3 \rightarrow VB PP NP_2$$

...

Local Tree Languages

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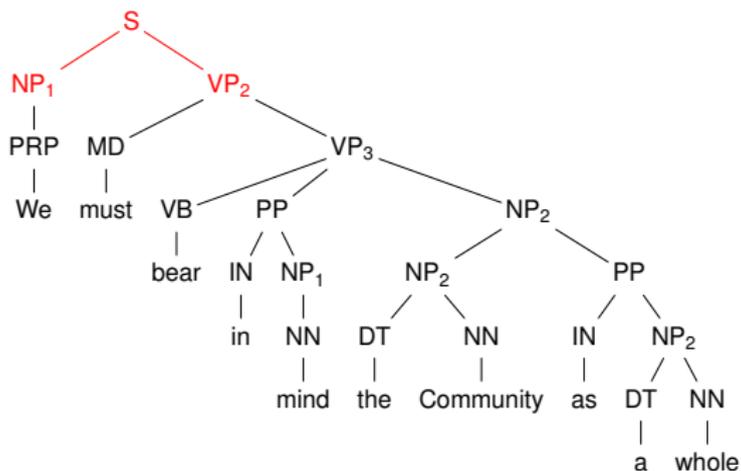
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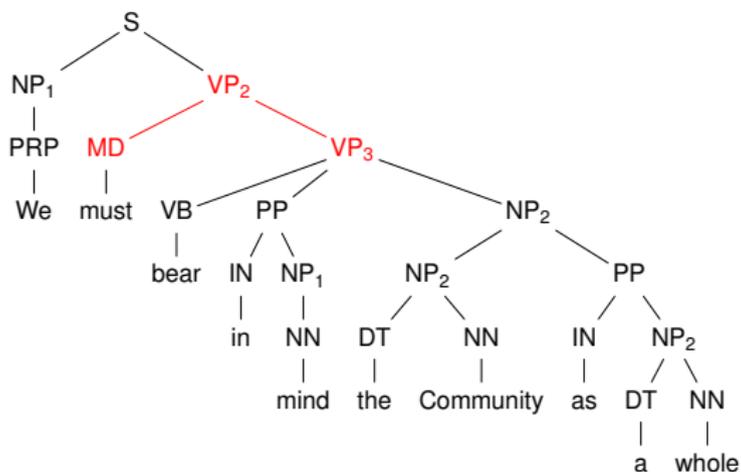
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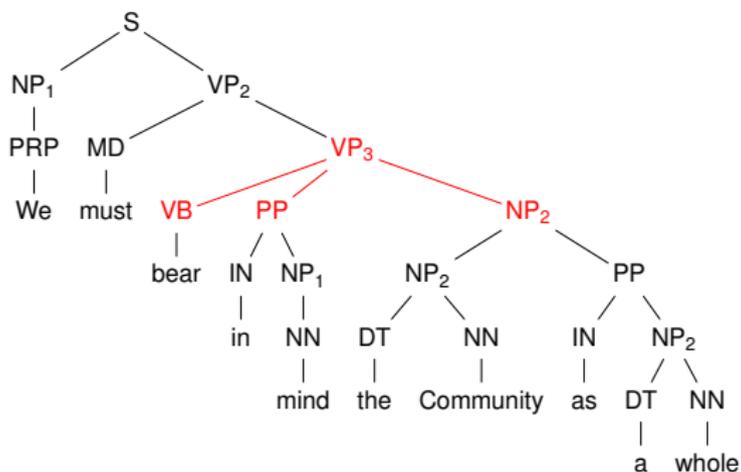
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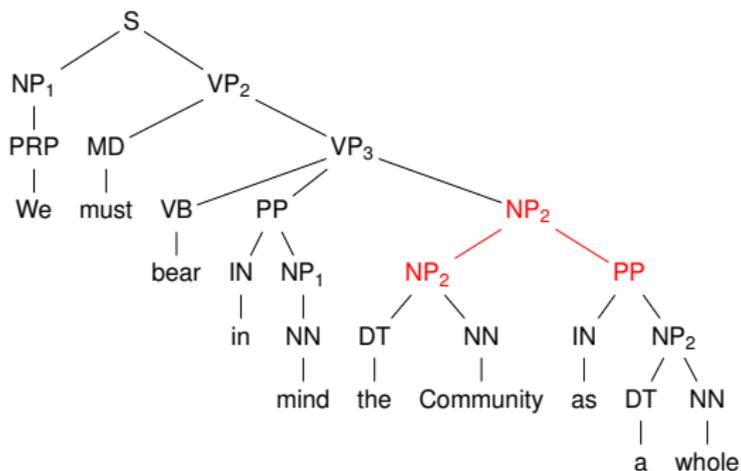
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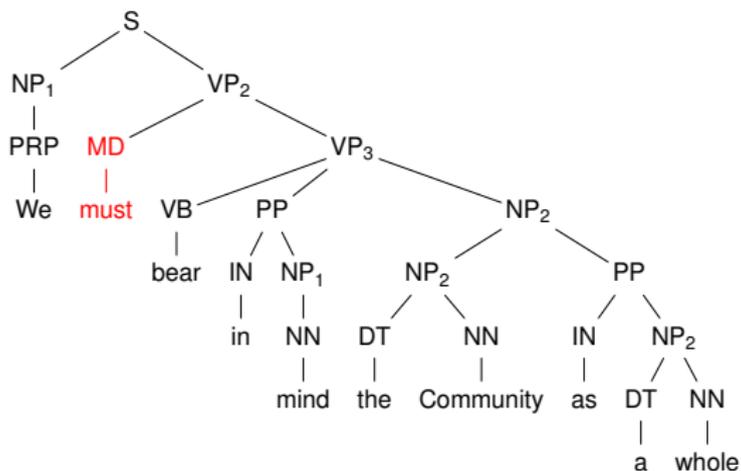
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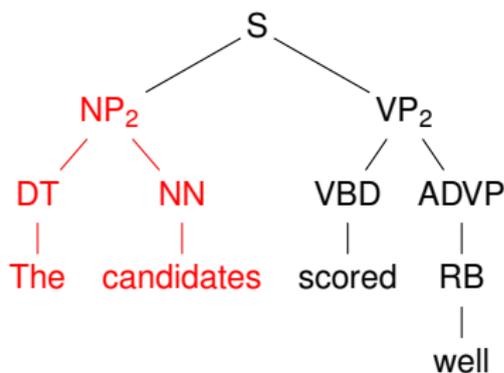
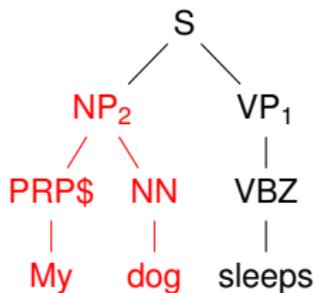
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Local Tree Languages

not closed under union

- these singletons are local

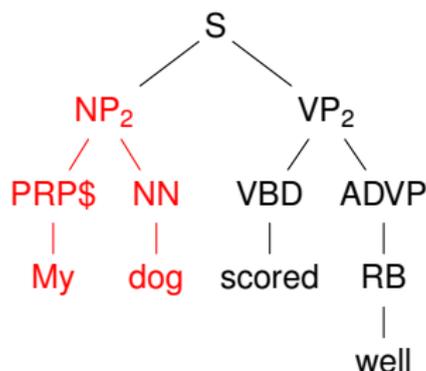
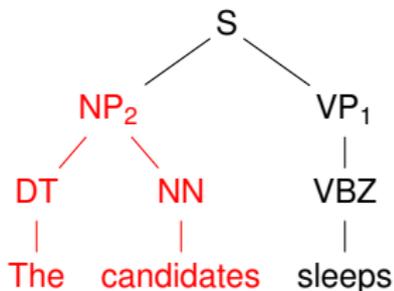


- but their union cannot be local

Local Tree Languages

not closed under union

- these singletons are local



- but their union cannot be local
(as we also generate these trees — overgeneralization)

Local Tree Languages

Properties

- ✓ simple
- ✓ no ambiguity (unique explanation for each recognized tree)
- ✗ not closed under Boolean operations
(union/intersection/complement: ✗/✓/✗)
- ✗ not closed under (non-injective) relabelings
- ✓ locality of a regular tree language decidable

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Tree substitution grammar [Joshi, Schabes 1997]

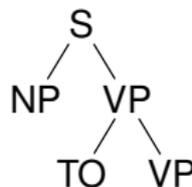
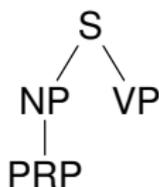
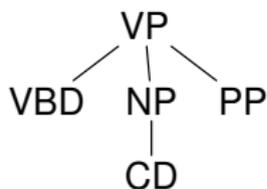
Tree substitution grammar = finite set of legal fragments
(together with a set of root labels)

$G = (\Sigma, I, P)$ with $I \subseteq \Sigma$ and finite $P \subseteq T_{\Sigma}(\Sigma)$

Tree Substitution Languages

Typical fragments

[Post 2011]



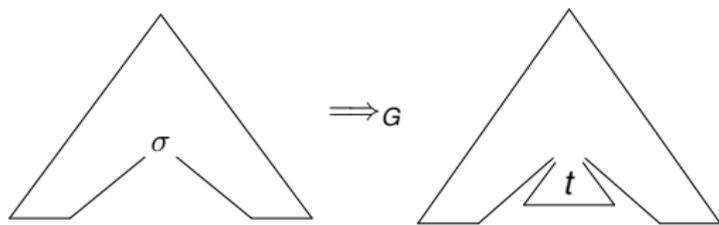
Derivation step $\xi \Rightarrow_G \zeta$

- $\xi = c[\text{root}(t)]$ and $\zeta = c[t]$ for some context c and fragment $t \in P$

Tree Substitution Languages

Tree substitution grammar $G = (\Sigma, I, P)$

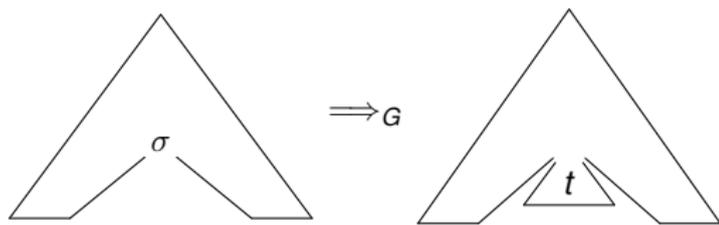
- for each fragment $t \in P$ with root label σ



Tree Substitution Languages

Tree substitution grammar $G = (\Sigma, I, P)$

- for each fragment $t \in P$ with root label σ



- generated tree language

$$L(G) = \{t \in T_{\Sigma}(\emptyset) \mid \exists \sigma \in I: \sigma \Rightarrow_G^* t\}$$

Tree Substitution Languages

Fragments

$S(NP_1(\text{PRP}), VP_2)$

$VP_2(\text{MD}, VP_3(\text{VB}, \text{PP}, NP_2))$

$\text{PRP}(\text{We})$

$\text{MD}(\text{must})$

Derivation

S

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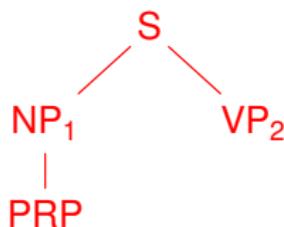
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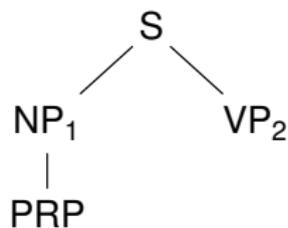
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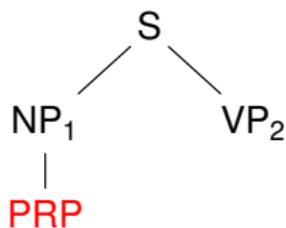
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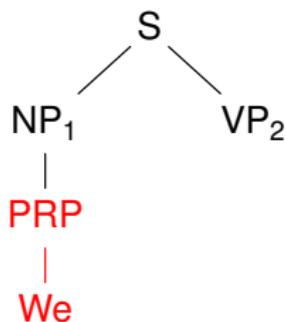
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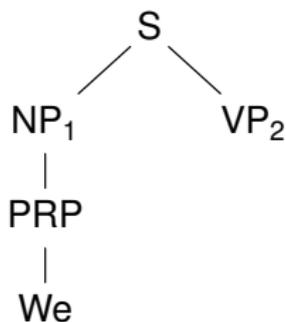
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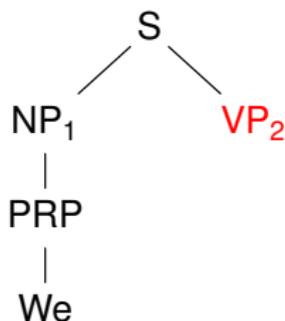
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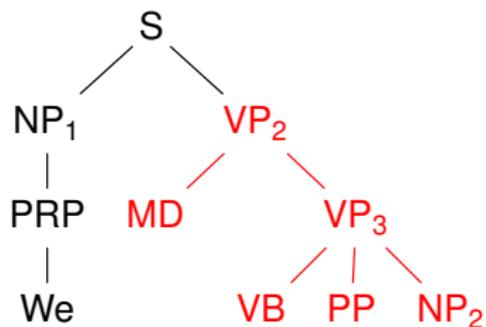
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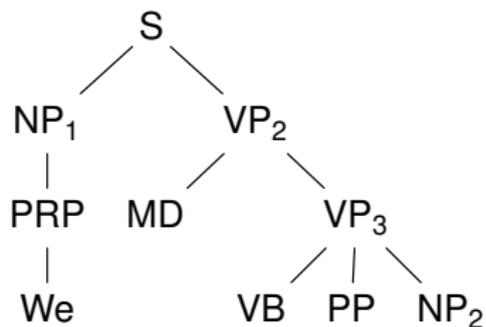
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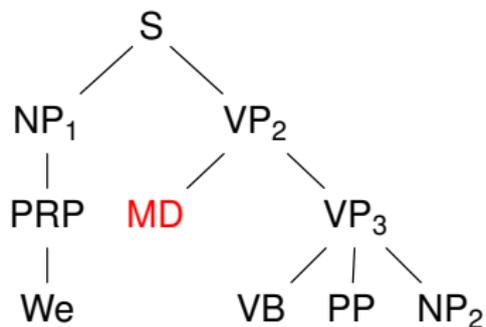
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$\text{MD}(\text{must})$

Derivation



Tree Substitution Languages

Fragments

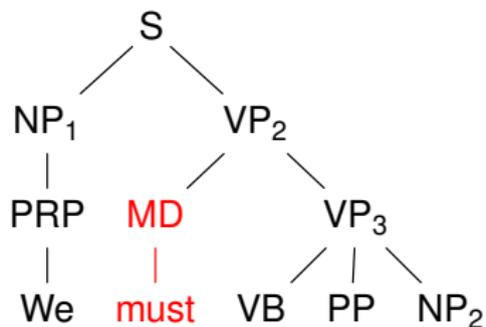
$S(NP_1(\text{PRP}), VP_2)$

$VP_2(\text{MD}, VP_3(\text{VB}, \text{PP}, NP_2))$

$\text{PRP}(\text{We})$

$\text{MD}(\text{must})$

Derivation



Tree Substitution Languages

Fragments

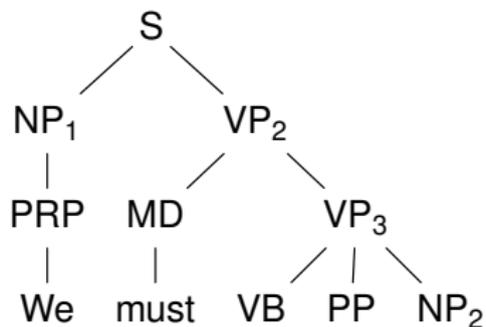
$S(NP_1(\text{PRP}), VP_2)$

$\text{PRP}(\text{We})$

$VP_2(\text{MD}, VP_3(\text{VB}, \text{PP}, NP_2))$

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Derivation



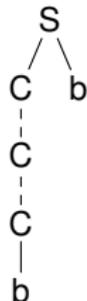
Tree Substitution Languages

not closed under union

- these languages are tree substitution languages individually



$$L_1 = \{S(C^n(a), a) \mid n \in \mathbb{N}\}$$



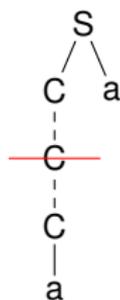
$$L_2 = \{S(C^n(b), b) \mid n \in \mathbb{N}\}$$

- but their union is not

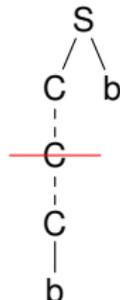
Tree Substitution Languages

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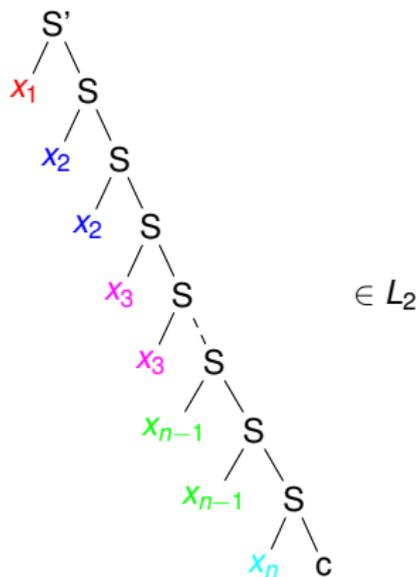
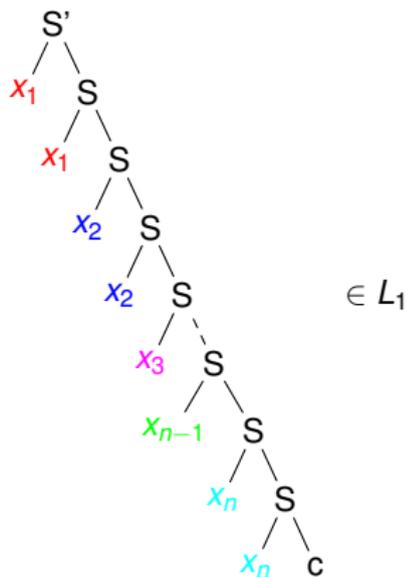
$$L_2 = \{S(C^n(b), b) \mid n \in \mathbb{N}\}$$

- but their union is not
(exchange subtrees below the indicated cuts)

Tree Substitution Languages

not closed under intersection

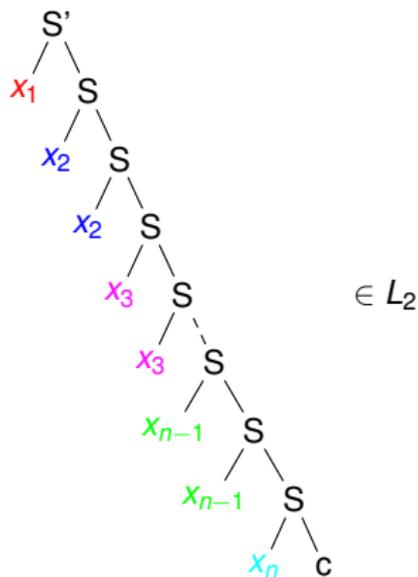
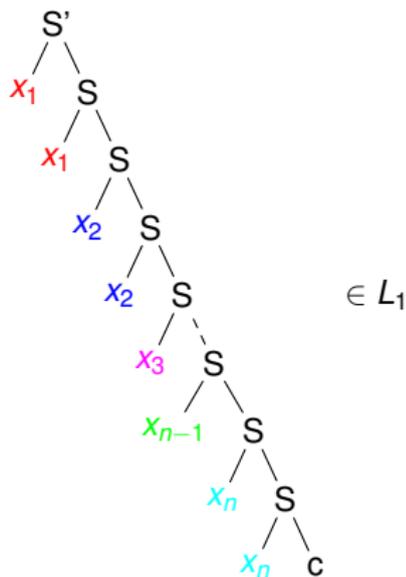
- these languages L_1 and L_2 are tree substitution languages individually for $n \geq 1$ and arbitrary $x_1, \dots, x_n \in \{a, b\}$



Tree Substitution Languages

not closed under intersection

- these languages L_1 and L_2 are tree substitution languages individually for $n \geq 1$ and arbitrary $x_1, \dots, x_n \in \{a, b\}$

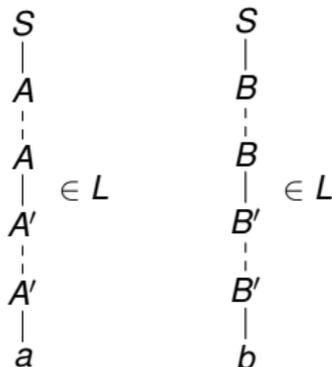


- but their intersection only contains trees with $x_1 = x_2 = \dots = x_n$ and is not a tree substitution language

Tree Substitution Languages

not closed under complement

- this language L is a tree substitution language

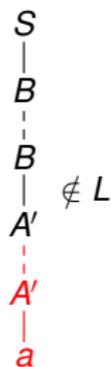
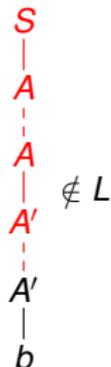


- but its complement is not

Tree Substitution Languages

not closed under complement

- this language L is a tree substitution language



- but its complement is not
(exchange as indicated in red)

Tree Substitution Languages

Properties

- ✓ simple
- ✓ contain all finite and co-finite tree languages
- ✗ ambiguity (several explanations for a generated tree)
- ✗ not closed under Boolean operations
(union/intersection/complement: ✗/✗/✗)
- ✓ can express many finite-distance dependencies
(extended domain of locality)

Tree Substitution Languages

Open questions

- multiple intersections more expressive?
- which regular tree languages are tree substitution languages?
- relation to local tree languages?

Tree Substitution Languages

Open questions

- multiple intersections more expressive?
- which regular tree languages are tree substitution languages?
- relation to local tree languages?
- extension to weights
- application to parsing

Tree Substitution Languages

Open questions

- multiple intersections more expressive?
- which regular tree languages are tree substitution languages?
- relation to local tree languages?
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- application to parsing

Thank you for your attention!

Tree Substitution Languages

Experiment

[Post, Gildea 2009]

grammar	size	Prec.	Recall	F_1
local	46k	75.37	70.05	72.61
“spinal” TSG	190k	80.30	78.10	79.18
“minimal subset” TSG	2,560k	76.40	78.29	77.33

(on WSJ Sect. 23)

Tree Substitution Languages with Latent Variables

Experiment

[Shindo et al. 2012]

grammar	F1 score	
	$ w \leq 40$	full
TSG [Post, Gildea, 2009]	82.6	
TSG [Cohn et al., 2010]	85.4	84.7
CFGlv [Collins, 1999]	88.6	88.2
CFGlv [Petrov, Klein, 2007]	90.6	90.1
CFGlv [Petrov, 2010]		91.8
TSGlv (single)	91.6	91.1
TSGlv (multiple)	92.9	92.4
Discriminative Parsers		
Carreras et al., 2008		91.1
Charniak, Johnson, 2005	92.0	91.4
Huang, 2008	92.3	91.7