

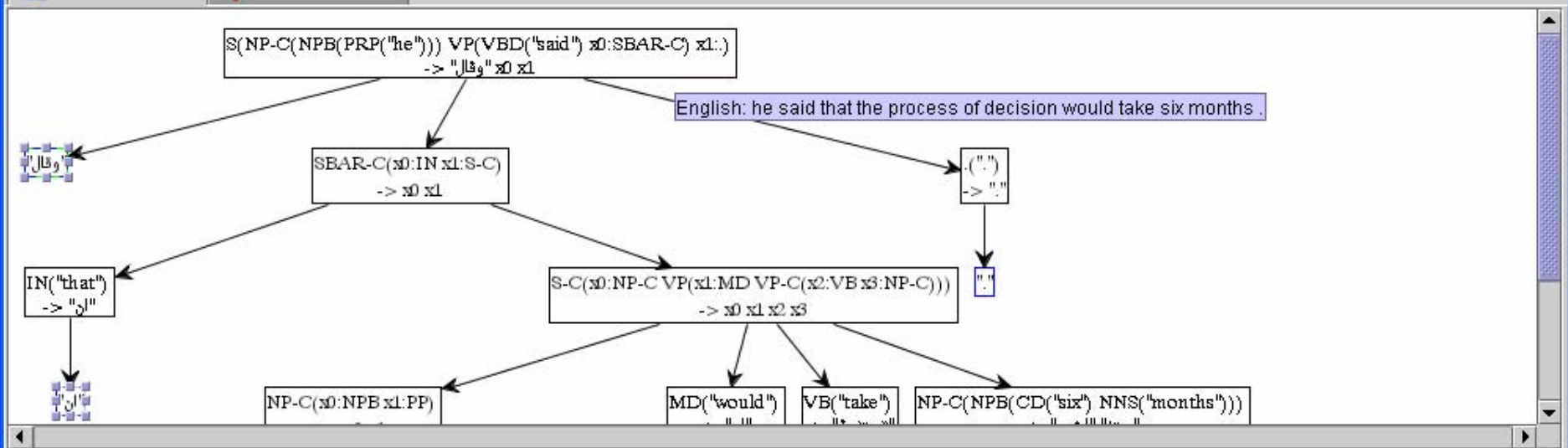
Click, Ctrl-click, or drag above to select. For adding rules, please select a contiguous span of top level nodes. Modify Delete

Phrase-based MT: he said that the process of decision to take six months .

Searching Manual Selecting Template

Lines = 100 Redraw Click below to add rule. (Red=no rules found, Blue=used by AT translation, Green=default translation, Purple=Red+Blue)

"وقال"	"ان"	"العملية"	"من"	"المقرر"	"ان"	"تستغرق"	"سبعة"	"اشهر"
he said	that the process is		which would			take	four months	
he		practical	would			takes	six weeks	
that		the process	is to be			last	six months ' time	
he		the operation	were to			took	six months ,	
he said		operation	is			lasting	of six	@-@ mo
was		exercise	from	scheduled to		would take		month
had		operational	planned that			span	six @-@ months '	
his		an operation	be			last for	6 month	
while		the practical	the rapporteur			taken	of six months from	



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he said	that the process is		which would			take	four months	
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had		operational		planned that		span	six @-@ months '	
his		an operation	be			last for	6 month	
while		the practical	the rapporteur			taken	of six months from	

dev-little (line 47) - dev-little

Input: 中 资 已 成 为 澳 门 最 大 的 外 来 投 资 者 。

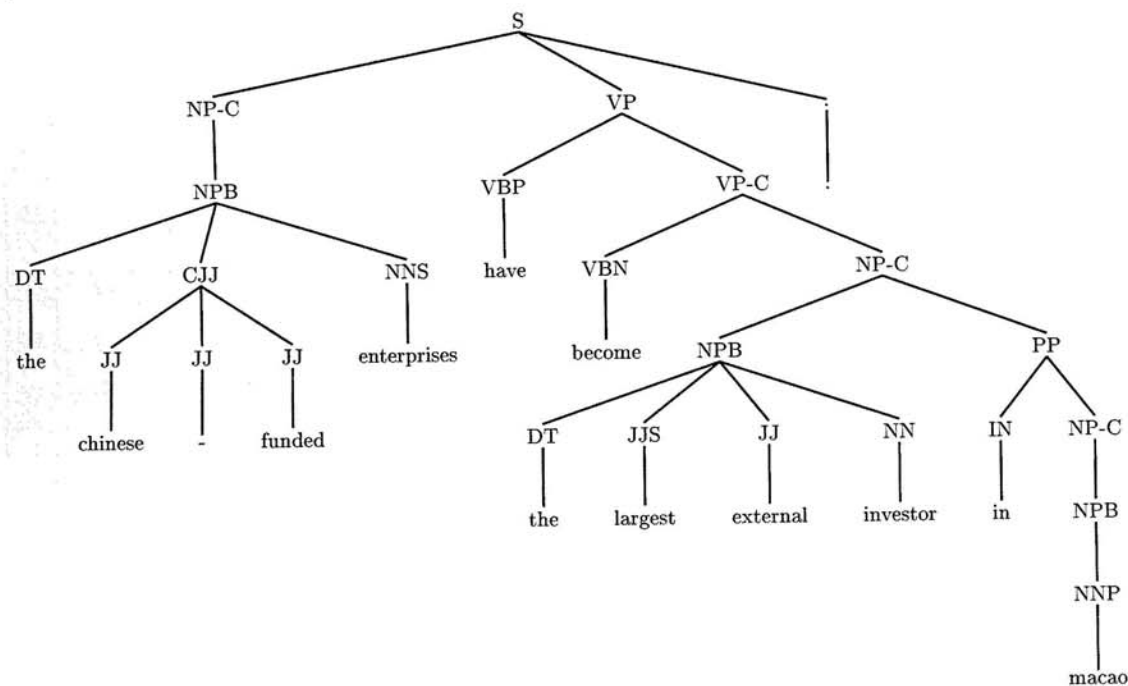
Reference: the chinese enterprises have become the biggest outside investors in macao .

AlTemp-e: investment 0 | in 1 | macao 2 | has 3 | become 4 | the largest 5 | foreign 6 | investors 7 | . 8

AlTemp-f: 中 1 | 资 0 | 已 3 | 成 为 4 | 澳 门 2 | 最 大 的 5 | 外 来 6 | 投 资 者 7 | . 8

[dev-little] 1-Best: the chinese - funded enterprises have become the largest external investor in macao .

[dev-little] 1-Best Tree



input

phrase-based
system output

syntax-based
system output

dev-little (line 59) - dev-little

Input: 基纳纳对中国过去向坦桑提供的大量援助表示感谢。

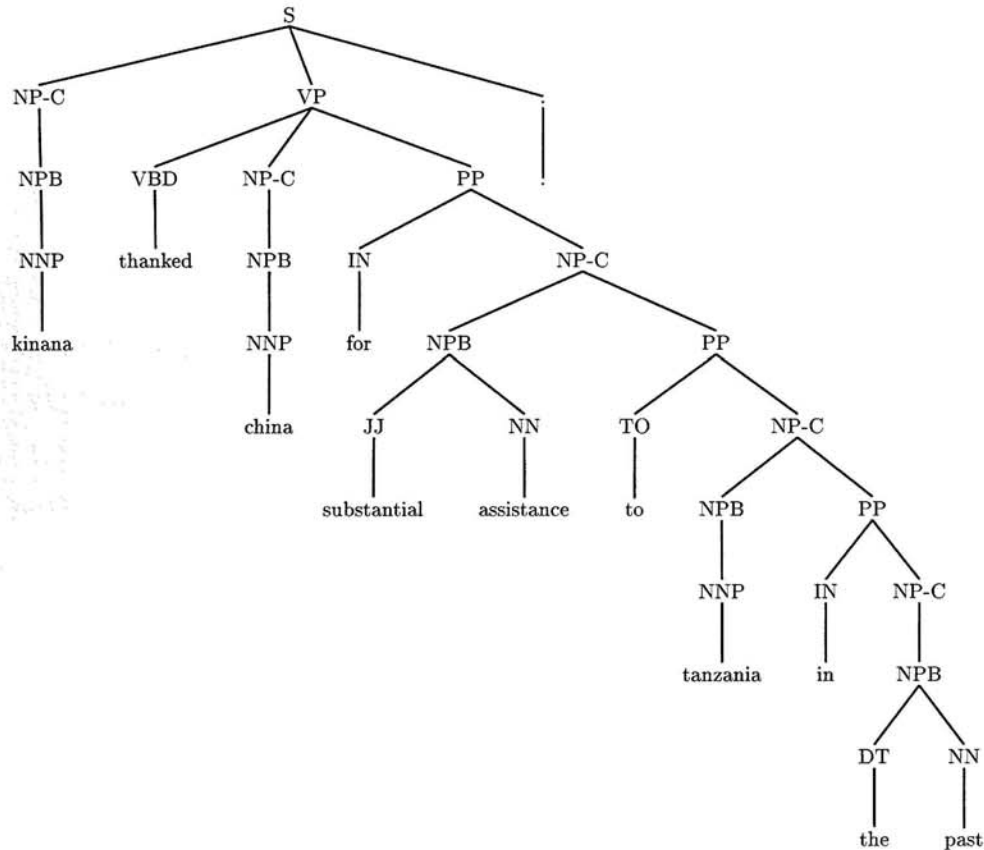
Reference: keenana expressed gratitude to china for its great assistance to tanzania in the past .

AlTemp-e: kinana₀ | to₁ | china₂ | in the past to₃ | tanzania₄ | expressed appreciation₅ | for the substantial₆ | assistance₇ | .₈

AlTemp-f: 基纳纳₀ | 对₁ | 中国₂ | 过去向₃ | 坦桑₄ | 提供的大量₆ | 援助₇ | 表示感谢₅ | 。₈

[dev-little] 1-Best: kinana thanked china for substantial assistance to tanzania in the past .

[dev-little] 1-Best Tree



input

phrase-based
system output

syntax-based
system output

dev-little (line 38) - dev-little

Input: 此次 为期 两天 的 研讨会 , 由 世界贸易组织 上海 研究中心 与 上海市 对外 服务 有限公司 联合 举办 .

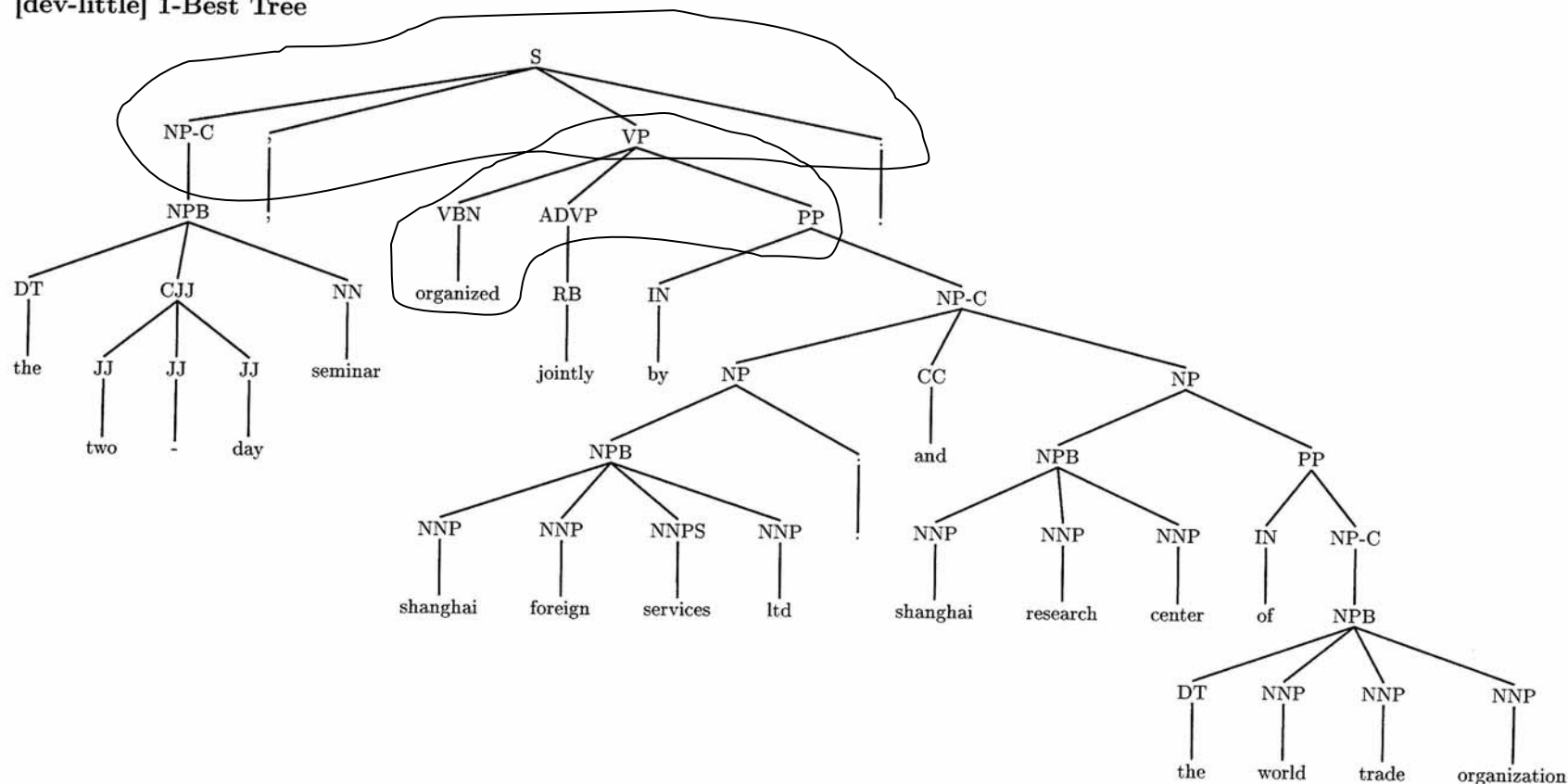
Reference: the two - day seminar is jointly sponsored by the wto shanghai research center and shanghai foreign service company limited .

AlTemp-e: the 0 | two - day 1 | seminar 2 | by the world trade organization 3 | , 4 | shanghai research center 5 | and 6 | shanghai foreign service 7 | co . , ltd . 8 | jointly 9 | . 10

AlTemp-f: 此次 0 | 为期 两天 的 1 | 研讨会 2 | , 4 | 由 世界贸易组织 3 | 上海 研究中心 5 | 与 6 | 上海市 对外 服务 7 | 有限公司 8 | 联合 举办 9 | . 10

[dev-little] 1-Best: the two - day seminar , organized jointly by shanghai foreign services ltd . and shanghai research center of the world trade organization .

[dev-little] 1-Best Tree



lev-little (line 53) - dev-little

Input: 丁豪在儿童福利院读完小学，随后进入附近乡里一所学校上初中。

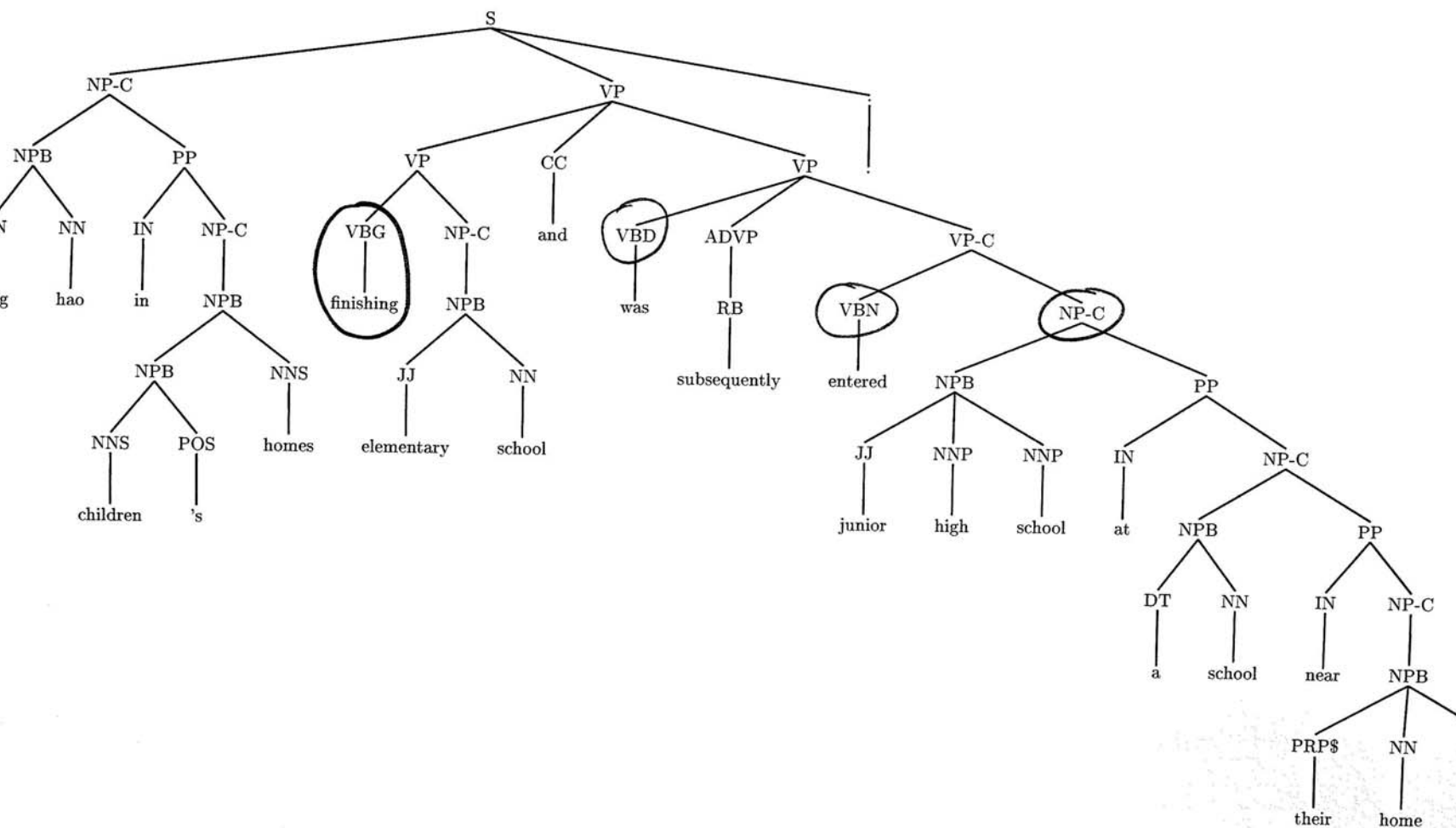
Reference: ding hao completed his primary school at the children welfare school, and then went to a nearby township middle school.

AltTemp-e: ding hao ₀ | in ₁ | children 's welfare institute ₂ | complete primary school ₃ | , ₄ | then entered ₅ | commune ₆ | near ₇ | a school ₈ | , ₉ | junior high school level . ₁₀

AltEmp-f: 丁豪₀ | 在₁ | 儿童福利院₂ | 读完小学₃ | , ₄ | 随后进入₅ | 附近₇ | 乡里₆ | 一所学校₈ | 上₉ | 初中。₁₀

dev-little] 1-Best: ding hao in children 's homes finishing elementary school and was subsequently entered junior high school at a school near their home towns .

ev-little] 1-Best Tree



dev-little (line 64) - dev-little

can become very good partners

Input: 他确信，加、中两国可以成为很好的合作伙伴。

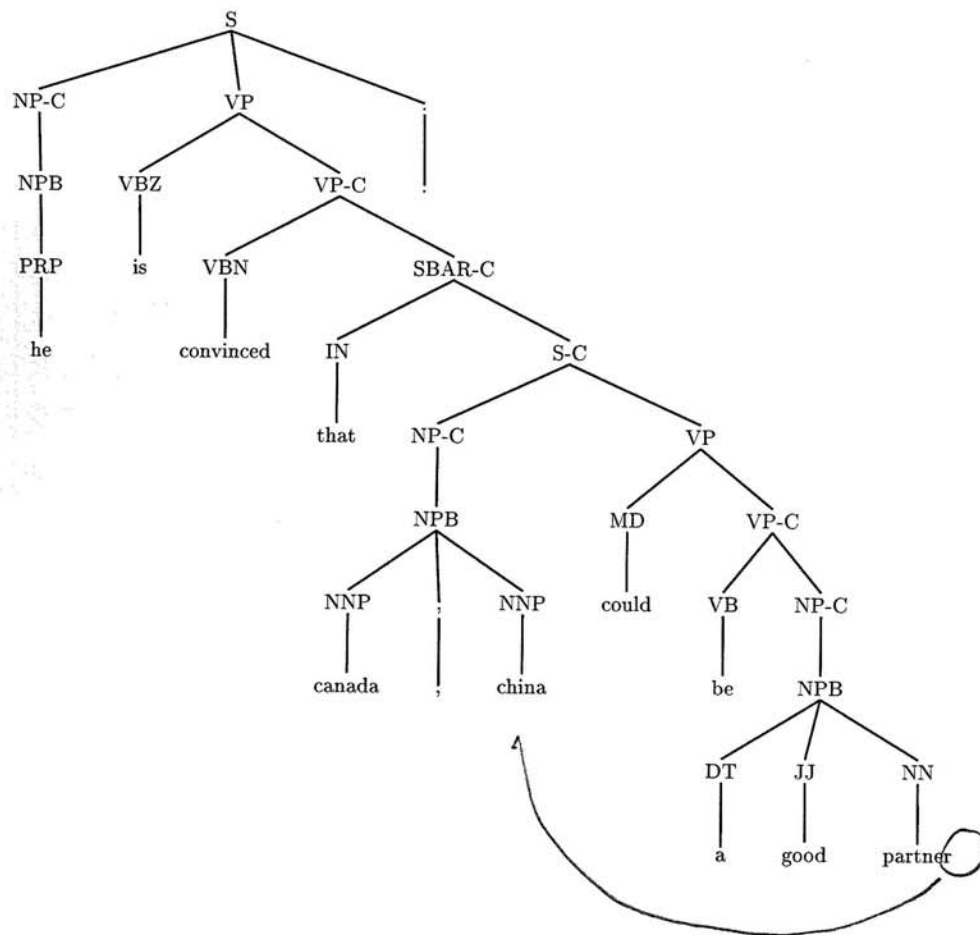
Reference: he assured that canada and china can become very good partners .

AlTemp-e: he was convinced that 0 | the 1 | two countries 2 | , 3 | can 4 | become good 5 | partners 6 | . 7

AlTemp-f: 他确信， 0 | 加 1 | 、 中 3 | 两国 2 | 可以 4 | 成为 很好的 5 | 合作 伙伴 6 | 。 7

[dev-little] 1-Best: he is convinced that canada , china could be a good partner .

[dev-little] 1-Best Tree



Subj - obj
number agreement.

dev-little (line 51) - dev-little

Input: 法国 外长 昨天 是 在 法国 国民议会 外事 委员会 会议 上 发表 上述 声明 的 。

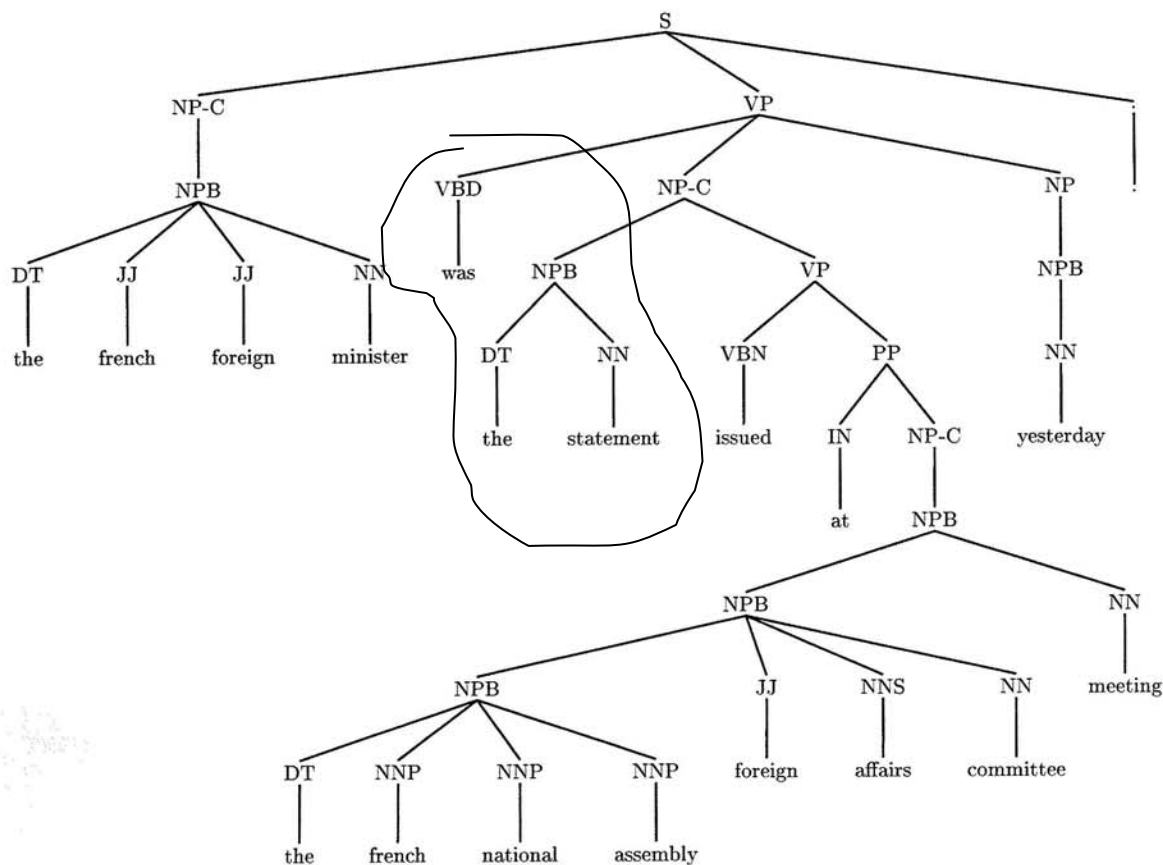
Reference: the french foreign minister made the above statement in a meeting of the foreign affairs commission of the french national congress .

AlTemp-e: french₀ | foreign minister₁ | in the french national assembly₂ | yesterday₃ | the statement delivered by₄ | foreign affairs₅ | committee meeting₆ | .₇

AlTemp-f: 法国₀ | 外长₁ | 昨天₃ | 在 法国 国民议会₂ | 外事₅ | 委员会 会议 上₆ | 发表 上述 声明₄ | 的 。₇

[dev-little] 1-Best: the french foreign minister was the statement issued at the french national assembly foreign affairs committee meeting yesterday .

[dev-little] 1-Best Tree



dev-little (line 248) - dev-little

Input: 国防部 前天 对 导弹 发射 事故 作出 道歉。

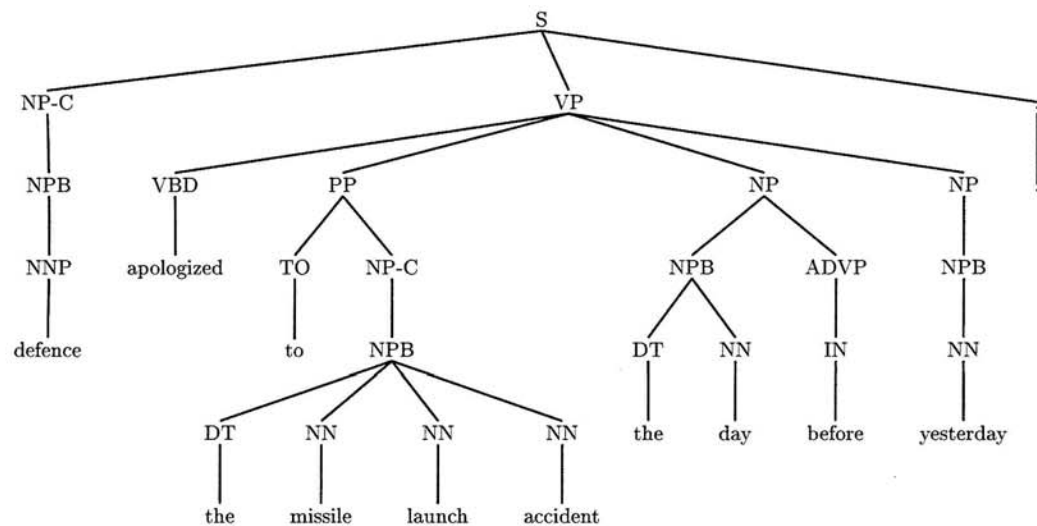
Reference: the defense ministry apologized for the missile accident the day before yesterday .

AlTemp-e: the day before yesterday₀ | the ministry of defense₁ | against₂ | missile₃ | launching accidents₄ | make an apology .₅

AlTemp-f: 国防部₁ | 前天₀ | 对₂ | 导弹₃ | 发射 事故₄ | 作出 道歉。₅

[dev-little] 1-Best: defence apologized to the missile launch accident the day before yesterday .

[dev-little] 1-Best Tree



dev-little (line 125) - dev-little

Input: 今年在加利福尼亚州和南部地区^{rain}的豪雨都归咎于厄尔尼诺作宠。

Reference: the torrential rain this year in california and its southern part is attributed to the el nino .

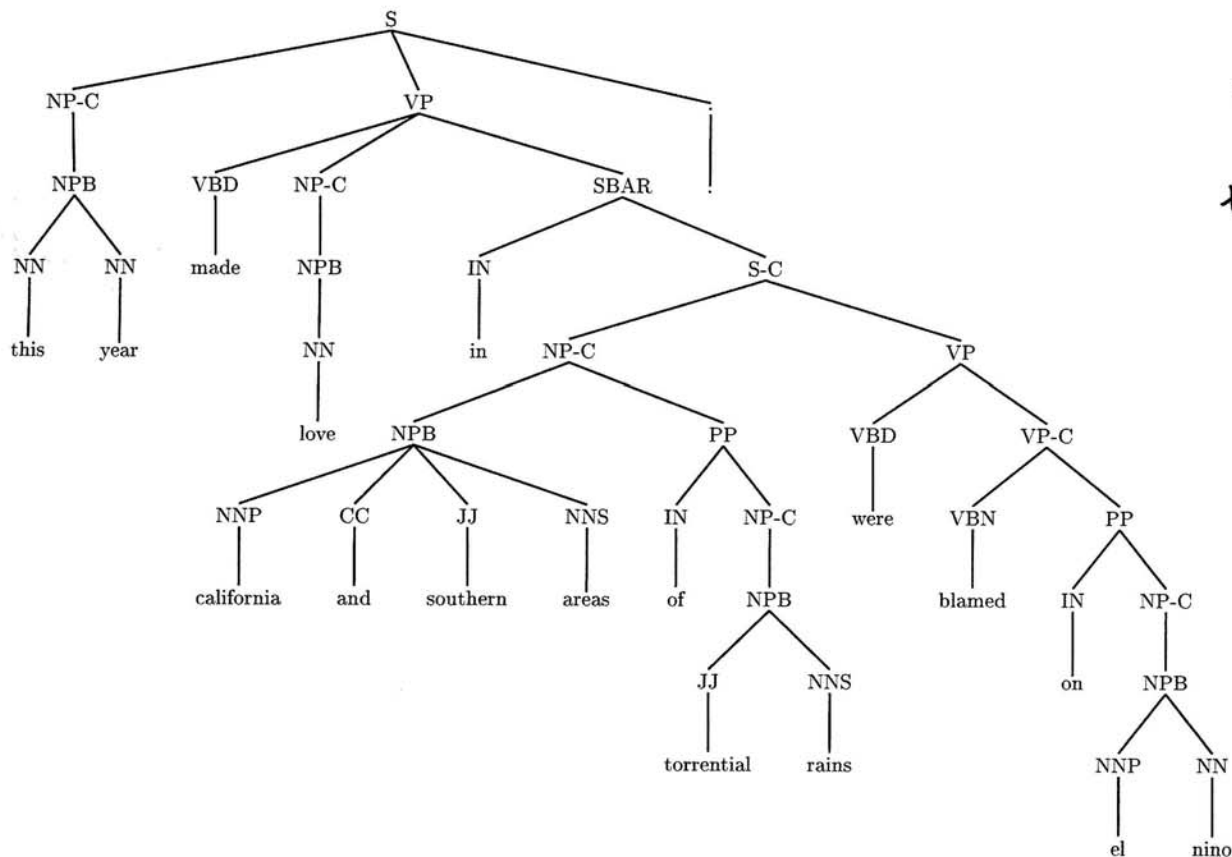
AlTemp-e: this year₀ | in california₁ | and southern₂ | areas₃ | of heavy rains₄ | attributed to₅ | a₆ | favorite₇ | el nio₈ | .₉

AlTemp-f: 今年₀ | 在加利福尼亚州₁ | 和南部₂ | 地区₃ | 的豪雨₄ | 都归咎于₅ | 厄尔尼诺₈ | 作₆ | 宠₇ | 。₉

[dev-little] 1-Best: this year made love in california and southern areas of torrential rains were blamed on el nino .

[dev-little] 1-Best Tree

Scope.



funny.

this year really NP-C

Lots of Open Problems

- Choosing syntactic categories that are appropriate for translation
- Decoder search in runtime translation
 - Many search errors hurt accuracy
 - Much faster speed needed for experimentation
- More context for rule choice
- Modeling English fluency, using trees

Chomsky's Program [1957]

- **Algorithmically distinguish between grammatical and ungrammatical sentences:**
 - John thinks Sara hit the boy
 - * The hit thinks Sara John boy
 - John thinks the boy was hit by Sara
 - Who does John think Sara hit?
 - John thinks Sara hit the boy and the girl
 - * Who does John think Sara hit the boy and?
 - John thinks Sara hit the boy with the bat
 - What does John think Sara hit the boy with?
 - Colorless green ideas sleep furiously.
 - * Green sleep furiously ideas colorless.

This Research Program has Contributed Powerful Ideas



Context-free grammar



**Formal
language
hierarchy**



**Syntax,
Phonology...**

This Research Program is Really Unfinished

Type in your English sentence here:

Is this grammatical?

Is this sensible?

*immediate consequences
for machine translation
and life in general ...*

Big World of Tree Automata Theory

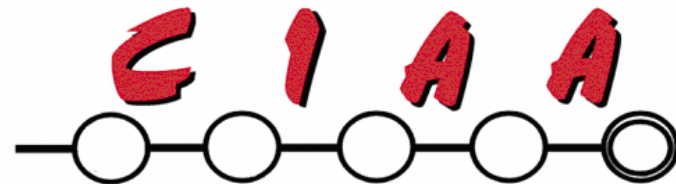
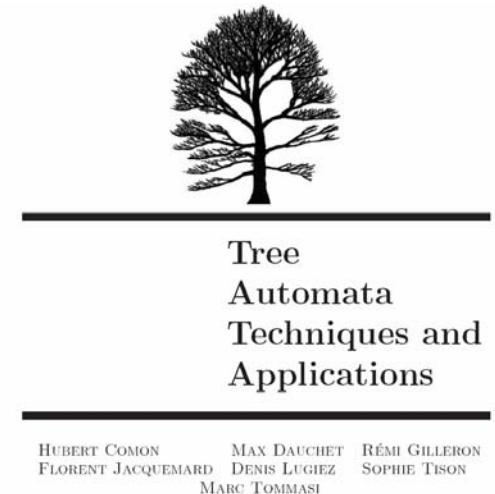
Doner (1968), Rounds (1970), Thatcher (1970), Engelfriet thesis (1975),
Gecseg & Steinby textbook (1984), ...



Heiko Vogler



Magnus Steinby



Conference on Implementation
and Application of Automata

Tiburon: A Tree Automata Toolkit

- Developed by Jonathan May, ISI
- First version distributed in April 2006
- Inspired by string automata toolkits
- You cast your problem in terms of tree acceptors and transducers
 - doesn't have to be MT
- You get implemented algorithms for free
 - e.g., as Kumar/Byrne'03 and Pereira/Riley'96 use string automata toolkits for MT and ASR
- Wealth of tree automata literature to draw on
- Lots of open problems in tree automata and in choosing formalisms for modeling NLP

Tiburon: A Tree Automata Toolkit

	String World	Tree World
N-best paths through a lattice (Viterbi, 1967; Eppstein, 1998)	... trees in a forest (Huang & Chiang, 2005)
EM training	Forward-backward EM (Baum & Welch, 1971)	Tree transducer EM training (Graehl & Knight, 2004)
Determinization of weighted string acceptors (Mohri, 1997)	... of weighted tree acceptors (May & Knight, 2005)
Intersection	WFSA intersection	Tree acceptor intersection (despite CFG not closed)
Applying transducers	string \rightarrow WFST \rightarrow WFSA	tree \rightarrow TT \rightarrow weighted tree acceptor
Transducer composition	WFST composition (Pereira & Riley, 1996)	Many tree transducers are not closed under composition! (Rounds 70; Engelfriet 75; Graehl, Hopkins, Knight, sub.)

Classes of Tree Transducers

copying

non-copying

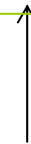
deleting

non-deleting

R

RL

RLN



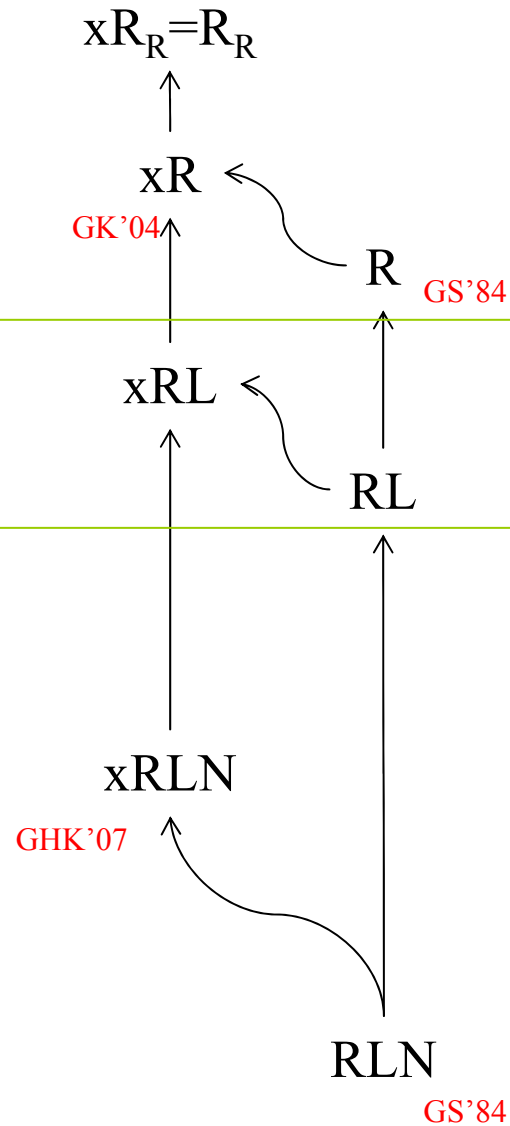
Classes of Tree Transducers

copying

non-copying

deleting

non-deleting



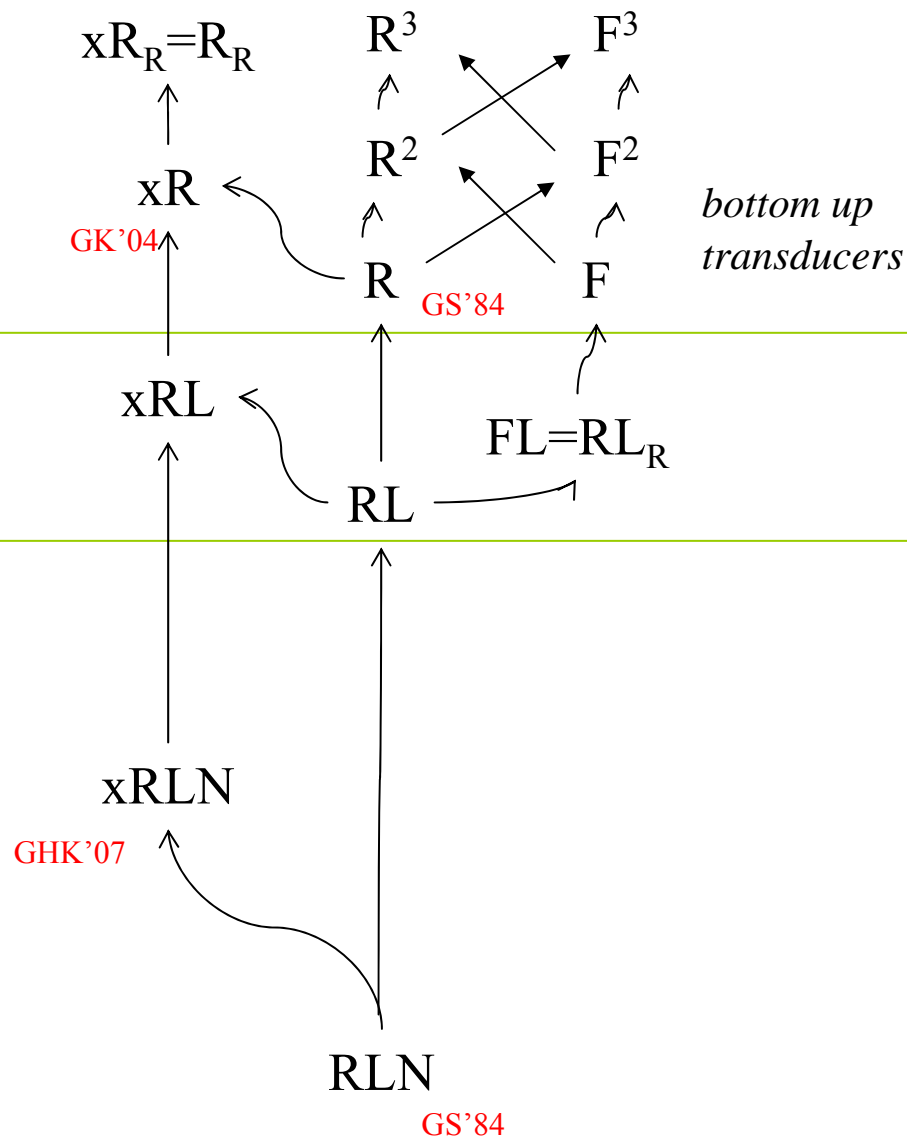
Classes of Tree Transducers

copying

non-copying

deleting

non-deleting



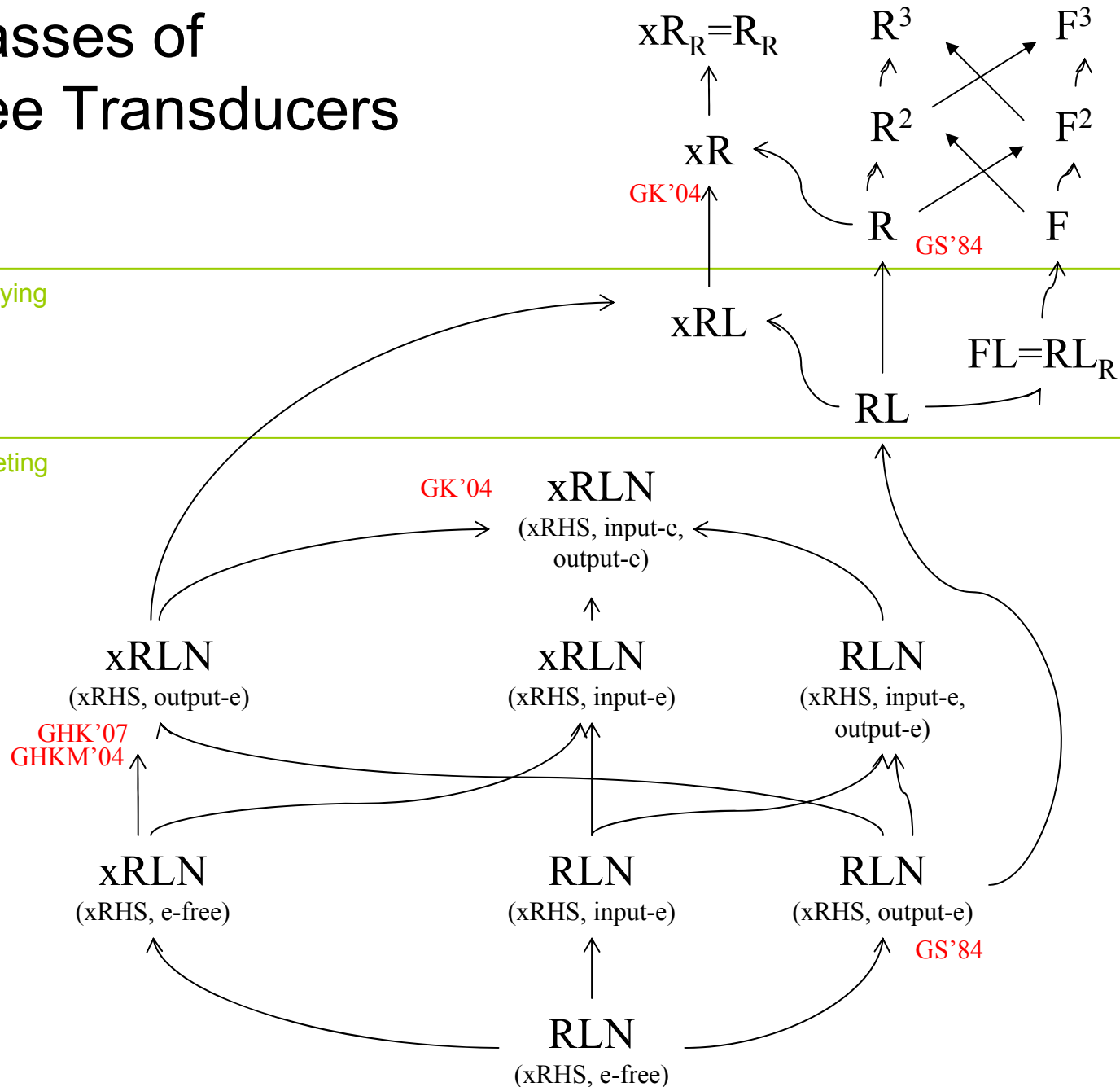
Classes of Tree Transducers

copying

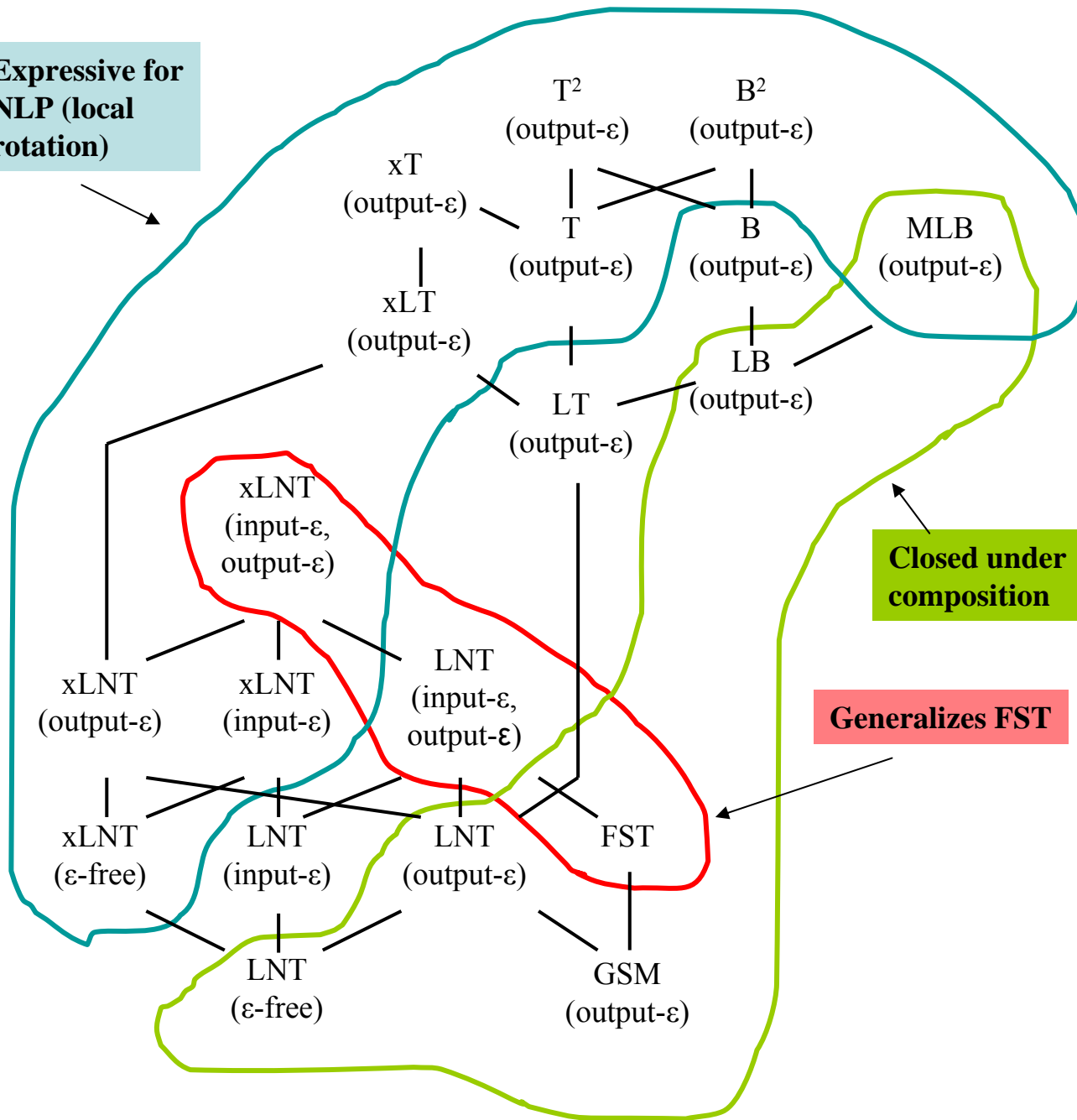
non-copying

deleting

non-deleting



**Expressive for
NLP (local
rotation)**



No known tree
transducer class:

- **is expressive** for
NLP

- **is closed** under
composition

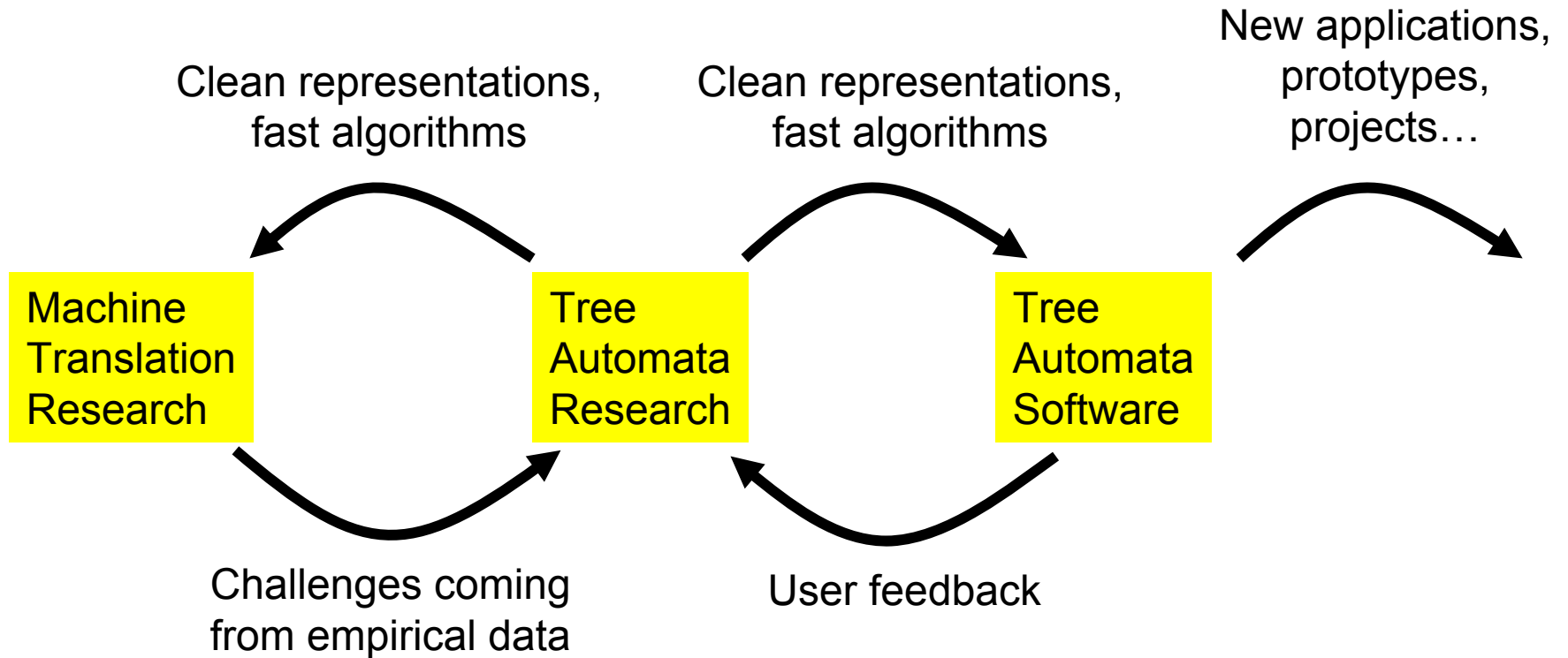
- **generalizes FST**

Active search!

**Closed under
composition**

Generalizes FST

Research Synergy



This Is Interdisciplinary Research

- Machine Learning
- Engineering
- Linguistics
- Efficient search algorithms
- Automata theory
- Grid computing

...

~~the end~~

still the beginning!