

# Transfer

Martin Kay

Stanford University and  
The University of the Saarland

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	after	c	s	z	+	#	h	?
0	start	1	2	3	0	0	0	0
1	c	1	2	3	0	0	3	0
2	s	1	2	3	4	0	3	0
3	c h, s h, z	1	2	3	4	0	0	0
4	sib +	1	6	3	0	0	0	0
5	sib + s	1	2	3	0	0	0	0
6	?	1	2	3	0	0	0	0

f l a p + s #  
0 0 0 0 0 0 2 0

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## Spelling Conventions

flap+s → flaps

flash+s → flashes

When s has a sibilant and a morpheme boundary to the left and a word boundary to the right, replace it with es.

Compile:

s → es / (s | z | c h | s h) + \_\_#

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	after	c	s	z	+	#	h	?
0	start	1	2	3	0	0	0	0
1	c	1	2	3	0	0	3	0
2	s	1	2	3	4	0	3	0
3	c h, s h, z	1	2	3	4	0	0	0
4	sib +	1	5	3	0	0	0	0
5	sib + s	1	2	3	0	0	0	0
6	?	1	2	3	0	0	0	0

f l a s h + s #  
0 0 0 0 2 3 4 5 ←→ 0

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	<i>after</i>	<b>c</b>	<b>s</b>	<b>z</b>	<b>+:<math>\varepsilon</math></b>	<b>+:<math>e</math></b>	<b>#:<math>\varepsilon</math></b>	<b>h</b>	<b>?</b>
<b>0 start</b>		1	2	3	0		0	0	0
<b>1 c</b>		1	2	3	0		0	3	0
<b>2 s</b>		1	2	3	4	5	0	3	0
<b>3 c h, s h, z</b>		1	2	3	4	5	0	0	0
<b>4 sib +:<math>\varepsilon</math></b>	<b>Finite-state Transducers</b>				0	0			
<b>5 sib +:<math>e</math></b>	<i>Two languages in parallel</i>								
<b>6 sib +:<math>\varepsilon</math> s</b>	1	2	3	4			3	0	
<b>7 sib +:<math>e</math> s</b>						0			
<b>8 ?</b>	1	2	3	0		0	0		

f      l      a      p      +: $\varepsilon$       s      #: $\varepsilon$   
 0      0      0      0      0      0      0

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	<i>after</i>	<b>c</b>	<b>s</b>	<b>z</b>	<b>+:<math>\varepsilon</math></b>	<b>+:<math>e</math></b>	<b>#:<math>\varepsilon</math></b>	<b>h</b>	<b>?</b>
<b>0 start</b>		1	2	3	0		0	0	0
<b>1 c</b>		1	2	3	0		0	3	0
<b>2 s</b>		1	2	3	4	5	0	3	0
<b>3 c h, s h, z</b>		1	2	3	4	5	0	0	0
<b>4 sib +:<math>\varepsilon</math></b>	1	6	3	0		0	0	0	0
<b>5 sib +:<math>e</math></b>		7							
<b>6 sib +:<math>\varepsilon</math> s</b>	1	2	3	4			3	0	
<b>7 sib +:<math>e</math> s</b>						0			
<b>8 ?</b>	1	2	3	0		0	0		

f      l      a      s      h      +: $\varepsilon$       s      #  
 0      0      0      0      2      3      4      6      X

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	<i>after</i>	<b>c</b>	<b>s</b>	<b>z</b>	<b>+:<math>\varepsilon</math></b>	<b>+:<math>e</math></b>	<b>#:<math>\varepsilon</math></b>	<b>h</b>	<b>?</b>
<b>0 start</b>		1	2	3	0		0	0	0
<b>1 c</b>		1	2	3	0		0	3	0
<b>2 s</b>		1	2	3	4	5	0	3	0
<b>3 c h, s h, z</b>		1	2	3	4	5	0	0	0
<b>4 sib +:<math>\varepsilon</math></b>	1	6	3	0		0	0	0	0
<b>5 sib +:<math>e</math></b>		7							
<b>6 sib +:<math>\varepsilon</math> s</b>	1	2	3	4			3	0	
<b>7 sib +:<math>e</math> s</b>						0			
<b>8 ?</b>	1	2	3	0		0	0		

f      l      a      s      h      +: $\varepsilon$       s      #  
 0      0      0      0      2      3      4      6      X

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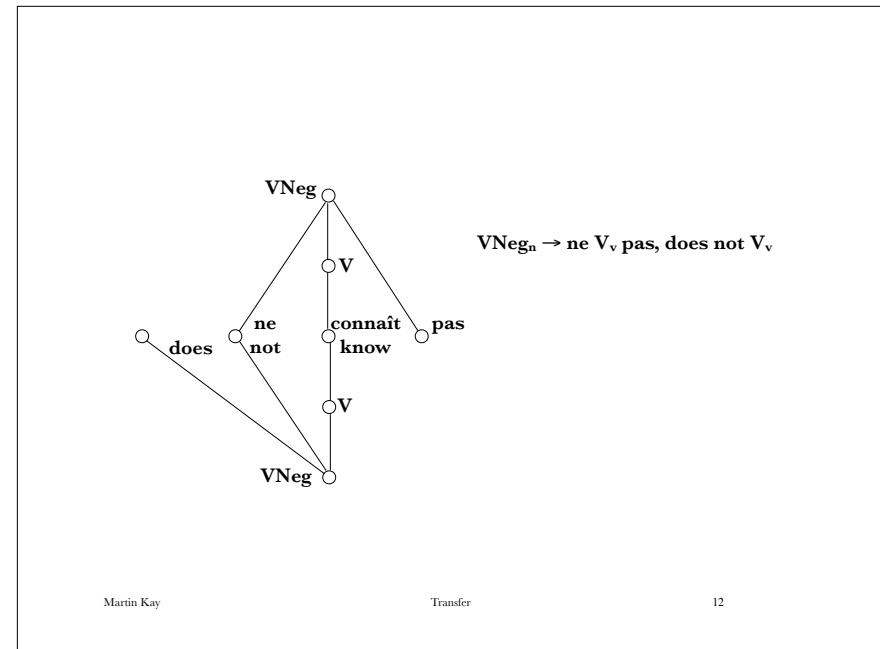
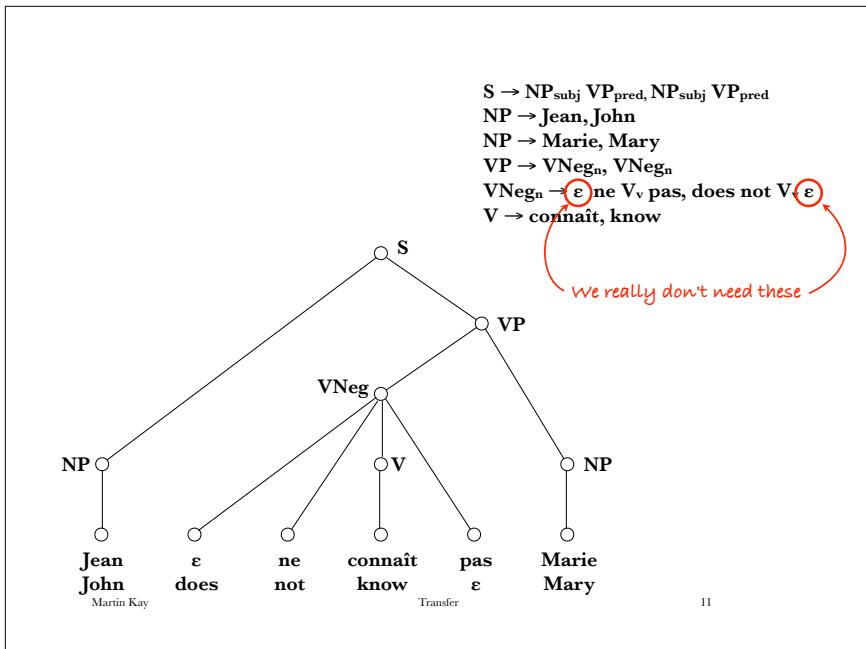
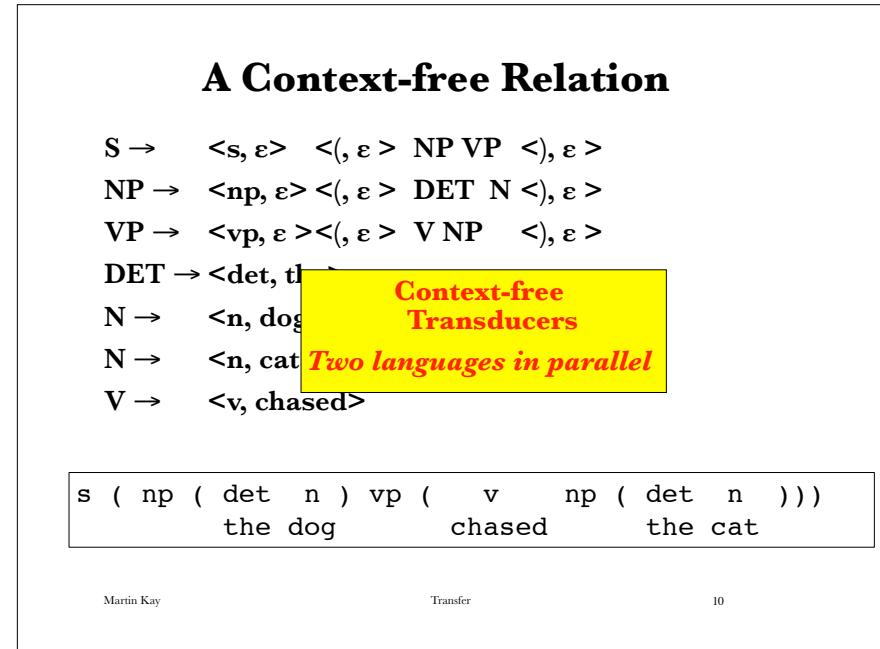
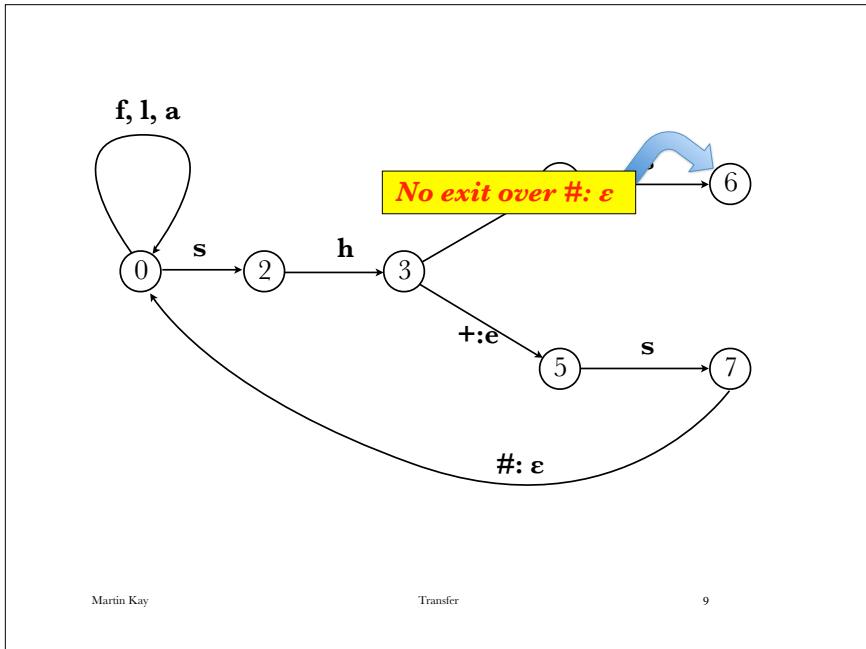
	<i>after</i>	<b>c</b>	<b>s</b>	<b>z</b>	<b>+:<math>\varepsilon</math></b>	<b>+:<math>e</math></b>	<b>#:<math>\varepsilon</math></b>	<b>h</b>	<b>?</b>
<b>0 start</b>		1	2	3	0		0	0	0
<b>1 c</b>		1	2	3	0		0	3	0
<b>2 s</b>		1	2	3	4	5	0	3	0
<b>3 c h, s h, z</b>		1	2	3	4	5	0	0	0
<b>4 sib +:<math>\varepsilon</math></b>	1	6	3	0		0	0	0	0
<b>5 sib +:<math>e</math></b>		7							
<b>6 sib +:<math>\varepsilon</math> s</b>	1	2	3	4			3	0	
<b>7 sib +:<math>e</math> s</b>						0			
<b>8 ?</b>	1	2	3	0		0	0		

f      l      a      s      h      +: $\varepsilon$       s      #  
 0      0      0      0      2      3      4      5      7      0

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*Suppose I always want this one!*

der Mann the man	gab gave	dem Jungen the boy	den Hund the dog
der Mann the man	gab gave	den Hund the dog	dem Jungen the boy
den Hund the dog	gab gave	der Mann the man	dem Jungen the boy
dem Jungen the boy	gab gave	der Mann the man	den Hund the dog

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*All the same*

$$\begin{aligned} S &\rightarrow N_n V_v D_d A_a, \quad N_n V_v N_d N_a \\ S &\rightarrow N_n V_v A_a D_g, \quad N_n V_v N_d N_a \\ S &\rightarrow A_a V_v N_n D_g, \quad N_n V_v N_d N_a \\ S &\rightarrow D_g V_v N_n A_a, \quad N_n V_v N_d N_a \end{aligned}$$

*Suppose I also want  
"The man gave a dog to the boy"*

$$\begin{aligned} S &\rightarrow N_n V_v D_d A_a, \quad N_n V_v N_d N_a \\ S &\rightarrow N_n V_v A_a D_g, \quad N_n V_v N_d N_a \\ S &\rightarrow A_a V_v N_n D_g, \quad N_n V_v N_d N_a \\ S &\rightarrow D_g V_v N_n A_a, \quad N_n V_v N_d N_a \end{aligned}$$

$$\begin{aligned} S &\rightarrow N_n V_v D_d A_a, \quad N_n V_v N_a \text{ to } N_d \\ S &\rightarrow N_n V_v A_a D_g, \quad N_n V_v N_a \text{ to } N_d \\ S &\rightarrow A_a V_v N_n D_g, \quad N_n V_v N_a \text{ to } N_d \\ S &\rightarrow D_g V_v N_n A_a, \quad N_n V_v N_a \text{ to } N_d \end{aligned}$$

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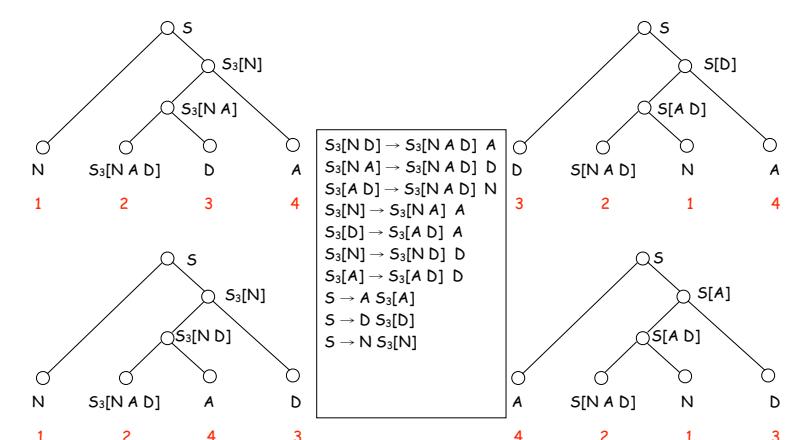
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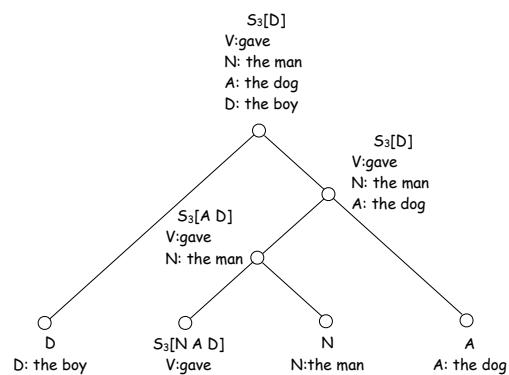


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$S_3[N D] \rightarrow S_3[N A D] A$   
 $S_3[N A] \rightarrow S_3[N A D] D$   
 $S_3[A D] \rightarrow S_3[N A D] N$   
 $S_3[N] \rightarrow S_3[N A] A$   
 $S_3[D] \rightarrow S_3[A D] A$   
 $S_3[N] \rightarrow S_3[N D] D$   
 $S_3[A] \rightarrow S_3[A D] D$   
 $S \rightarrow A S_3[A]$   
 $S \rightarrow D S_3[D]$   
 $S \rightarrow N S_3[N]$



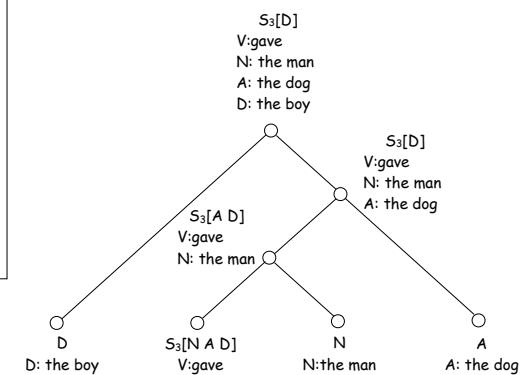
*Abstract away from word order*

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$S_3[N D] \rightarrow S_3[N A D] A$   
 $S_3[N A] \rightarrow S_3[N A D] D$   
 $S_3[A D] \rightarrow S_3[N A D] N$   
 $S_3[N] \rightarrow S_3[N A] A$   
 $S_3[D] \rightarrow S_3[A D] A$   
 $S_3[N] \rightarrow S_3[N D] D$   
 $S_3[A] \rightarrow S_3[A D] D$   
 $S \rightarrow A S_3[A]$   
 $S \rightarrow D S_3[D]$   
 $S \rightarrow N S_3[N]$

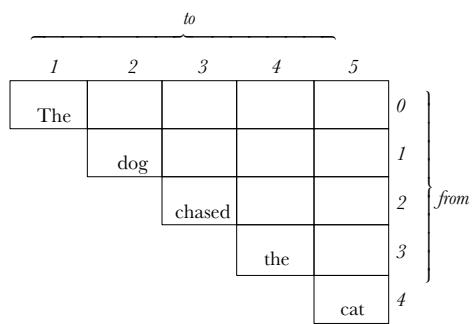


*Abstract away from word order  
⇒ semantics!*

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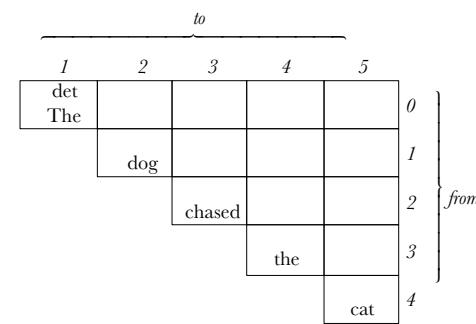


The            dog            chased            the            cat  
0                1                2                3                4                5

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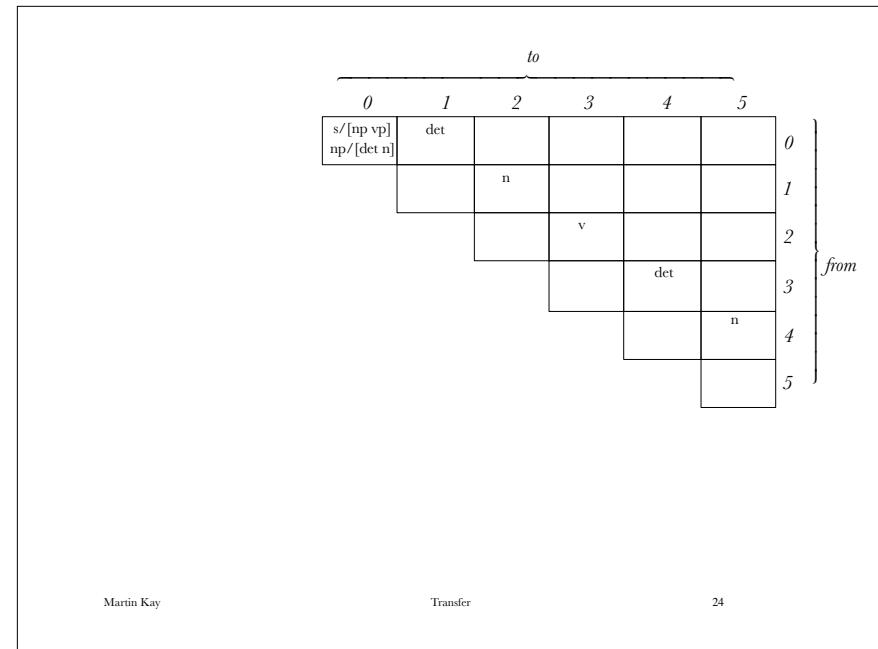
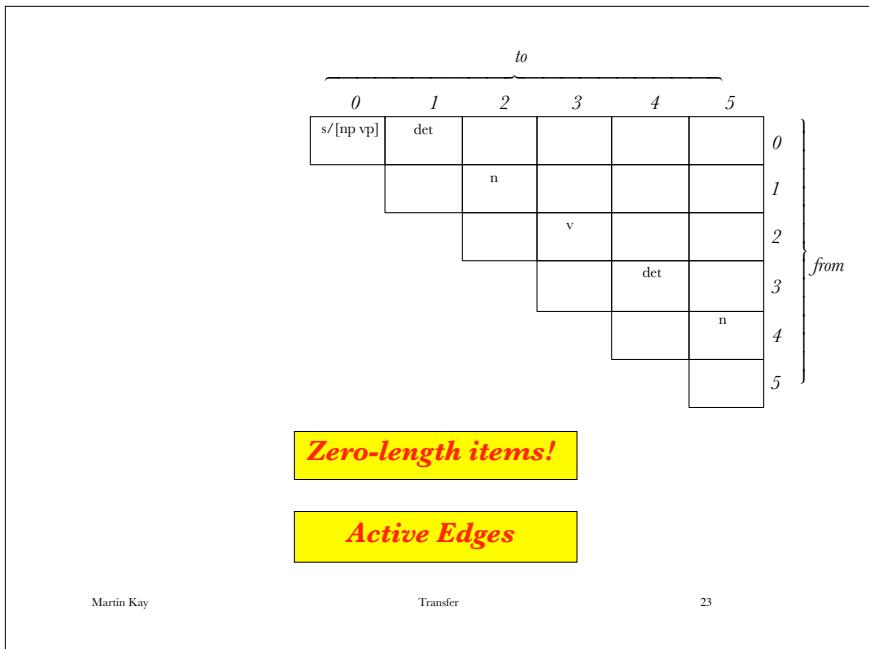
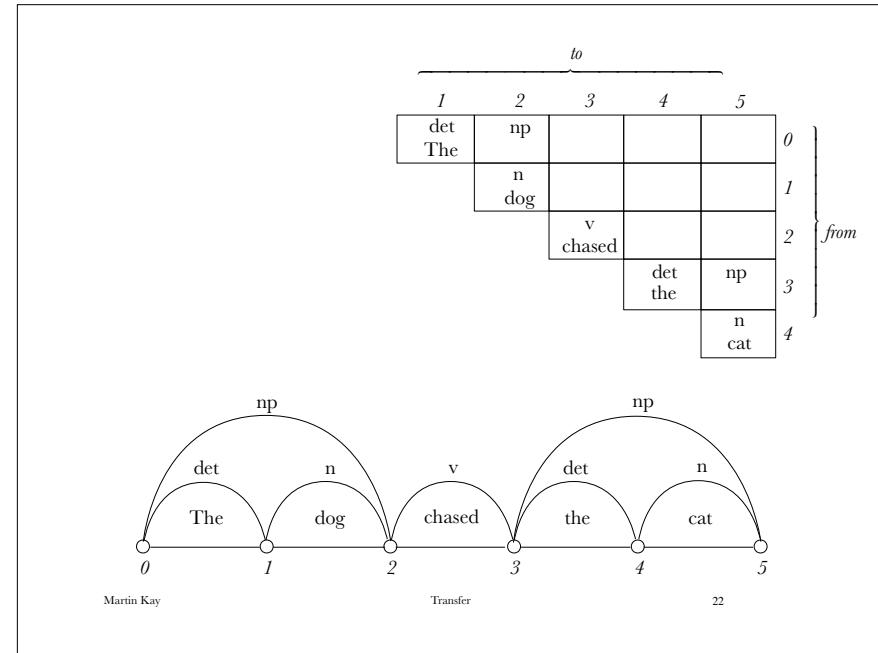
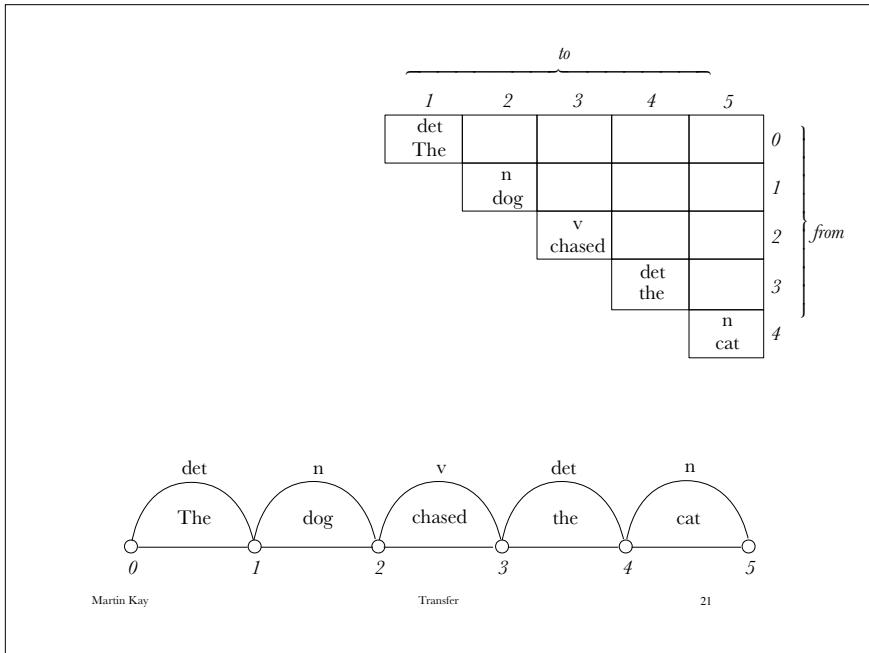


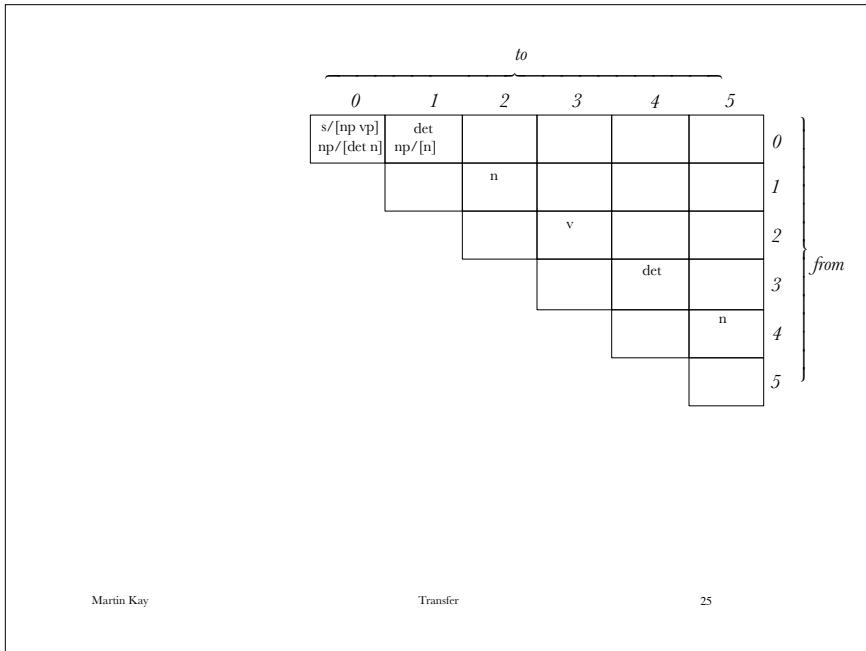
det            The            dog            chased            the            cat  
0                1                2                3                4                5

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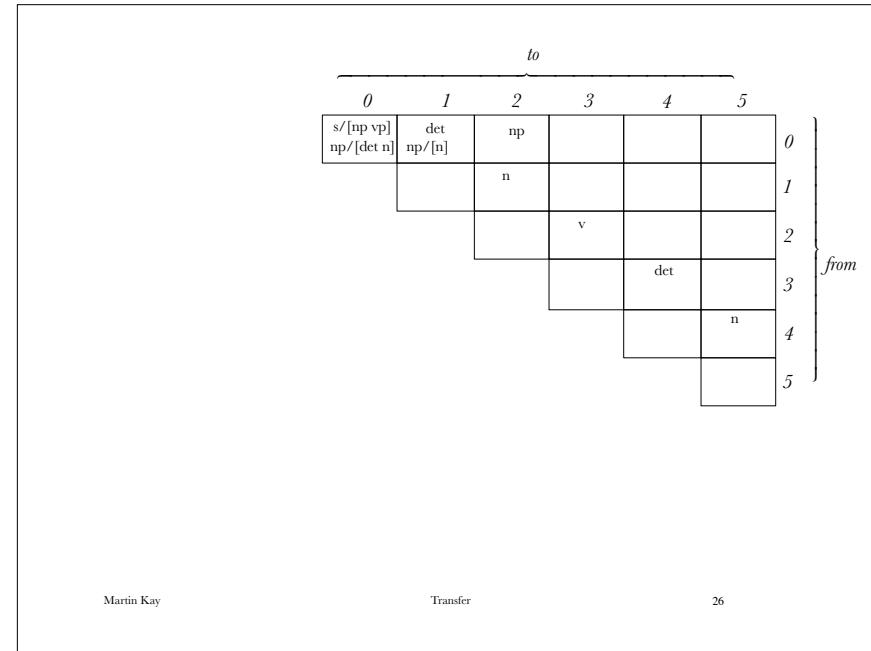




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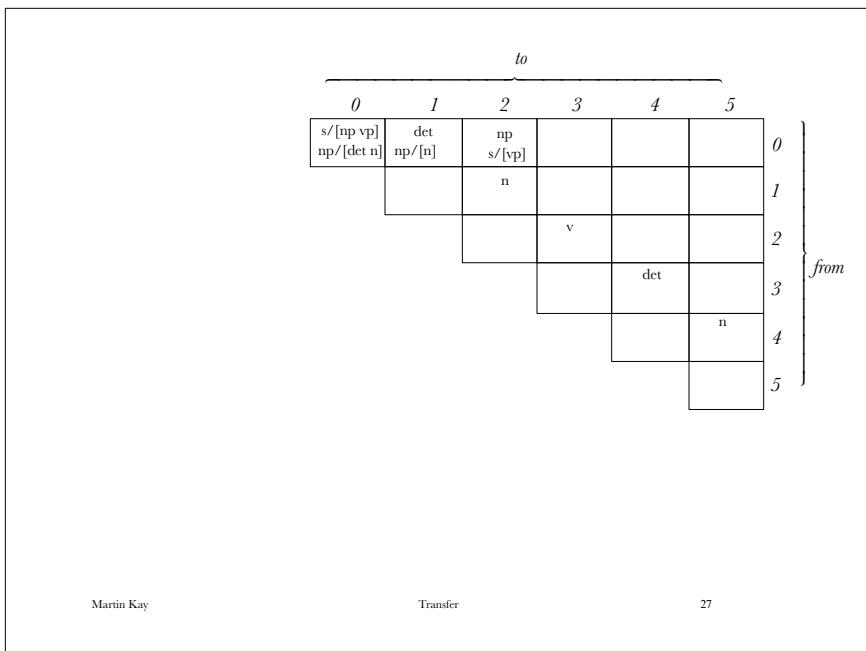
25



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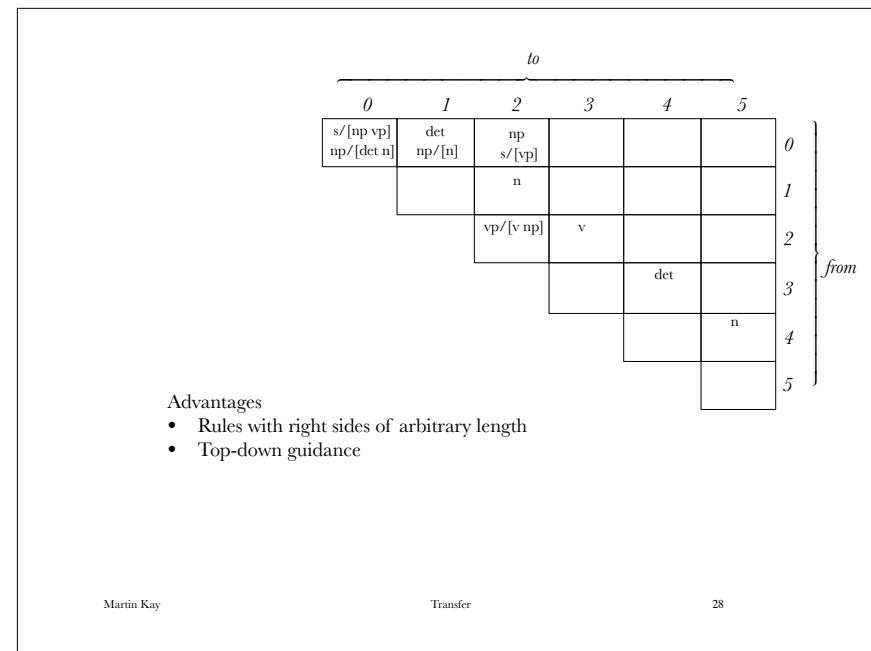
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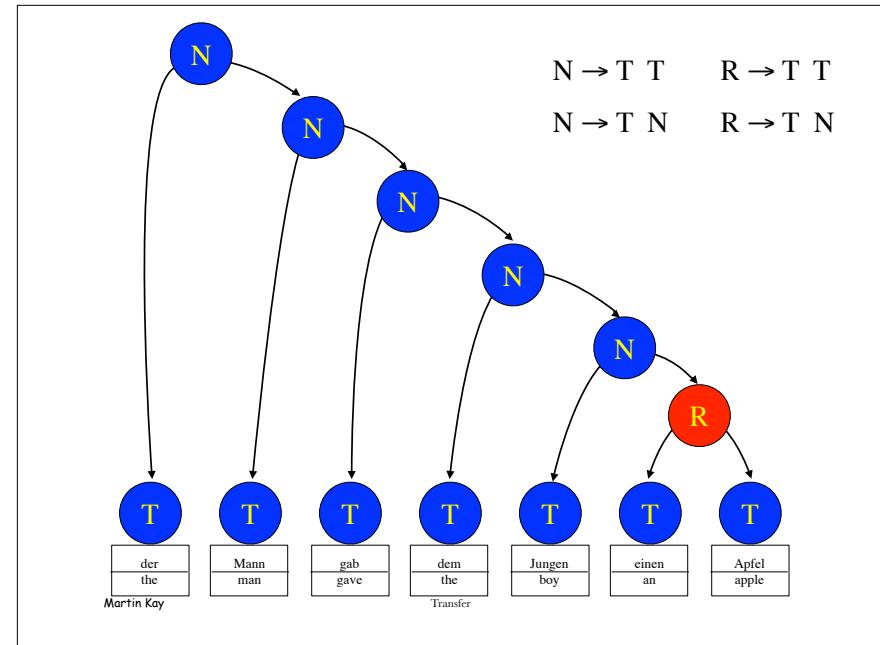
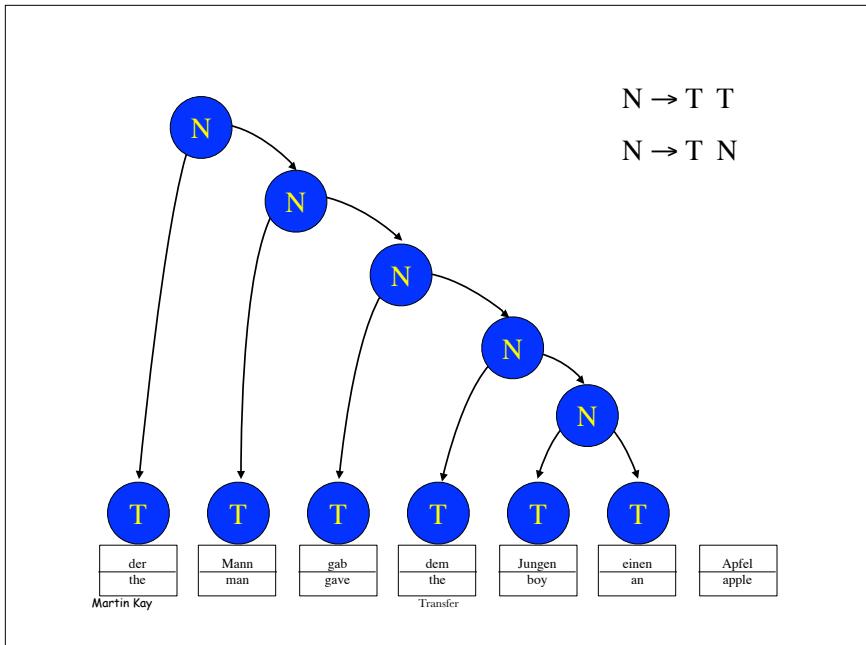
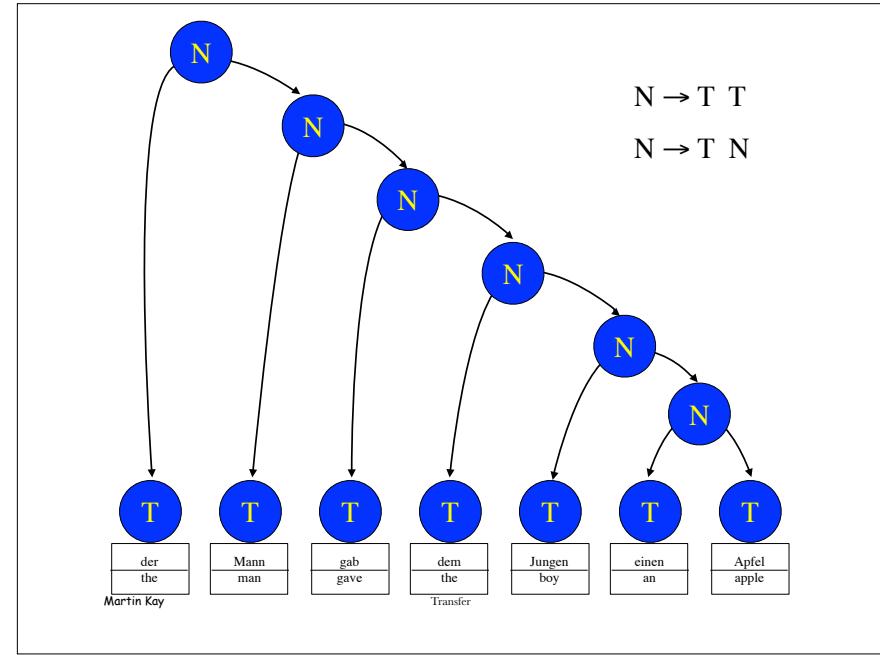
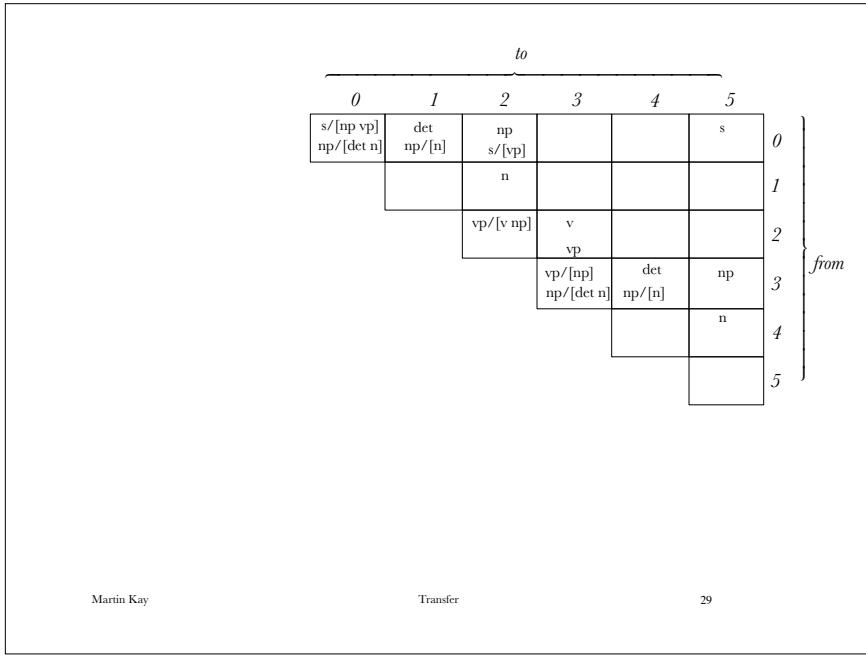
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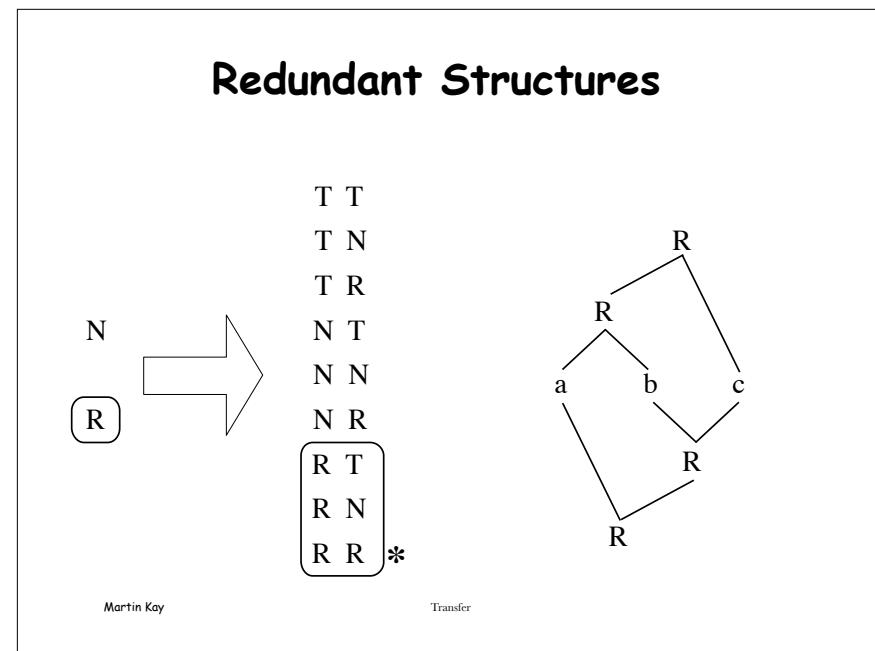
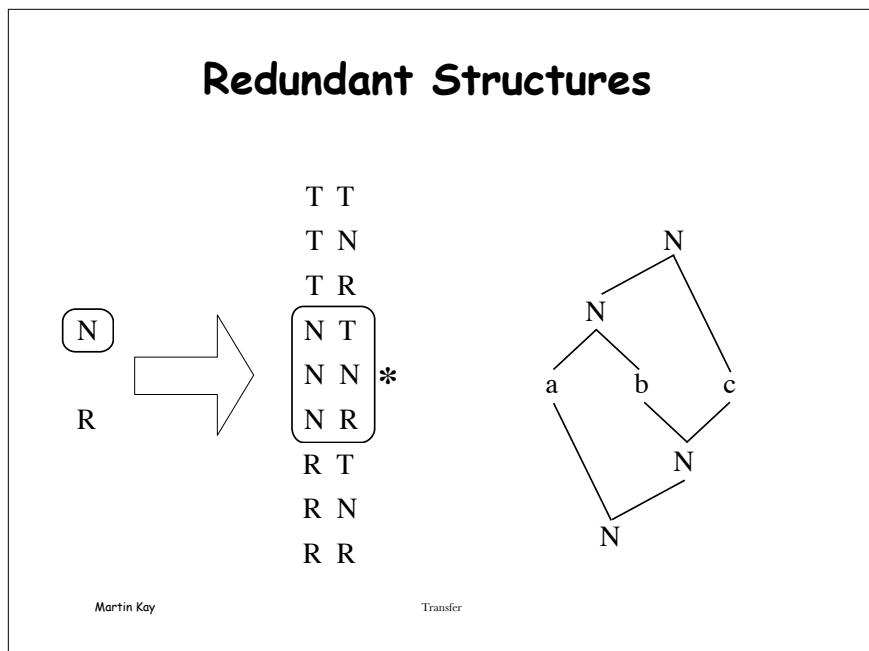
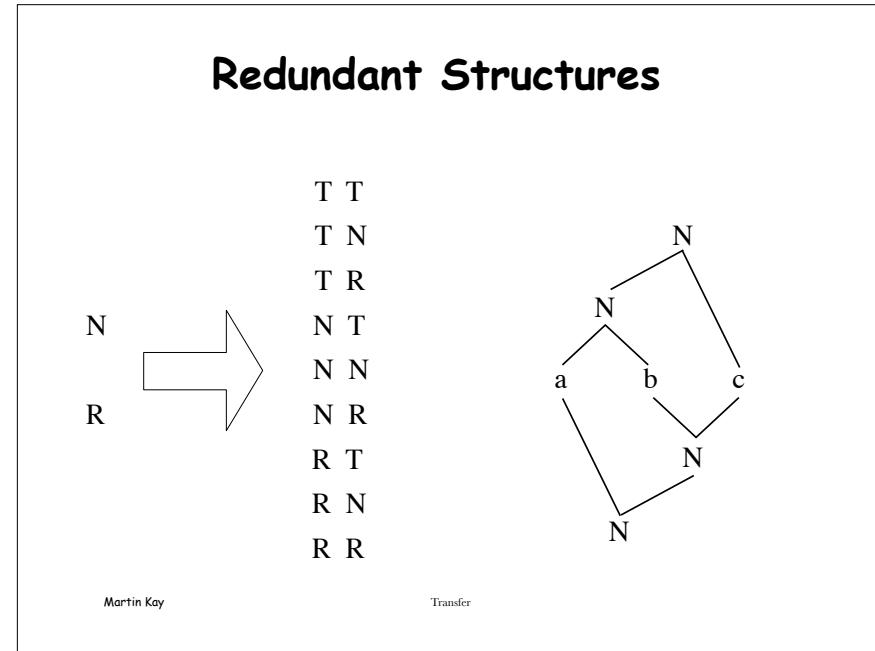
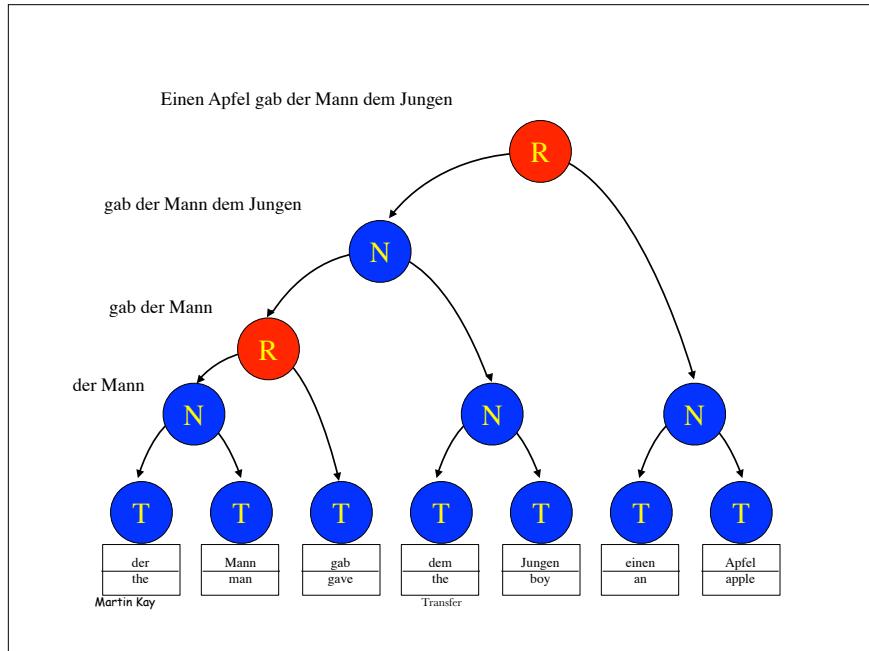


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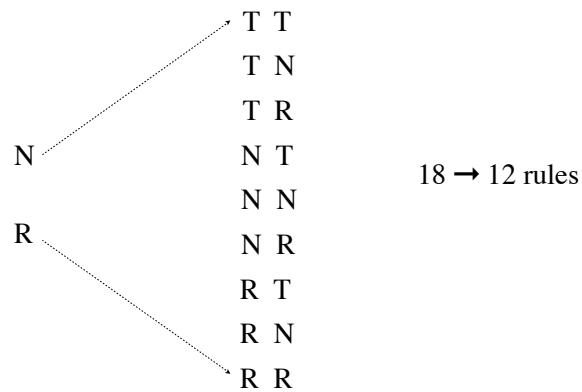
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## Redundant Structures



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Dekai Wu: *Inversion Transduction Grammars*

Machine Translation

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*Not all reorderings are possible*

Den Hund hat der Mann dem Jungen gegeben

1      2      3      4

The man gave the dog to the boy

2      4      1      3

1      2      3      4

Den Hund hat der Mann dem Jungen gegeben

3      1      4      2

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Machine Translation

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## Center Embedding

This is the house that Jack built.

The house the malt lay in  
built.

This is the rat that ate the malt

That lay in the house that Jack built.

This is the cat that killed the rat

That ate the malt that lay in the house that Jack  
built.



Putting Linguistics back into Computational Linguistics

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## Center Embedding

This is the house that Jack built.  
This is the malt that lay in the house that Jack built.  
**The house the malt the rat ate lay in**  
That lay in the house that Jack built.  
This is the cat that killed the rat  
That ate the malt that lay in the house that Jack built.

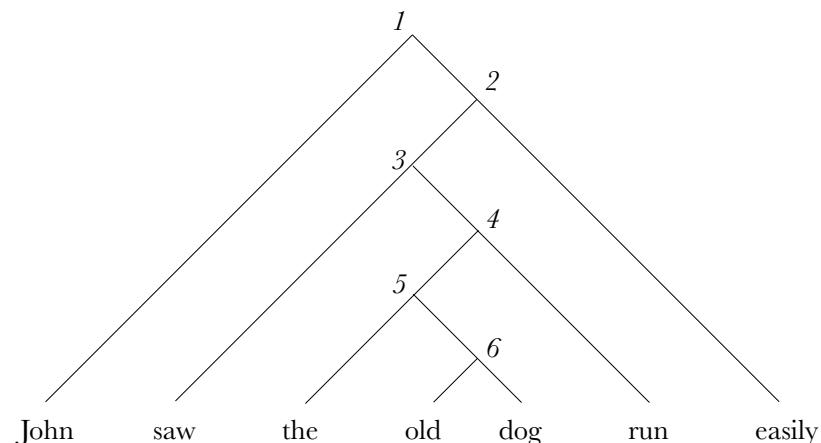


## Center Embedding

This is the house that Jack built.  
This is the malt that lay in the house that Jack built.  
This is the rat that ate the malt  
That lay in the house that Jack built.  
**The house the malt the rat the cat killed  
ate lay in**,  
built.



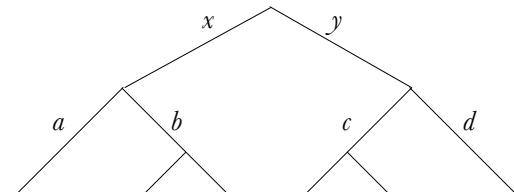
## Center Embedding



## Computing Embeddings

$$\mathbf{X}_{x,y} \rightarrow \mathbf{Y}_{a,b} \mathbf{Z}_{c,d}$$

$$x = \max(a, b+1)$$
$$y = \max(c+1, d)$$



## A Touch more Syntax

- Introduce real grammar rules opportunistically.
- With a higher priority than simple ordering rules.
- Robustness is not affected.

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Machine Translation

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## Seamantics as Sets of Predicates

**The dog saw the cat**

dog(d), def(d), saw(s), past(s), cat(c), def(c),  
arg1(s, d), arg2(s, c)

Grammar:

$s(x) \rightarrow np(y) vp(x, y)$

$vp(x, y) \rightarrow v(x, y, z) np(z)$

$np(x) \rightarrow det(x) n(x)$

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## Lexicon

Word	Cat	Semantics
cat	$n(x)$	$x: \text{cat}(x)$
saw	$v(x, y, z)$	$\text{see}(x), \text{past}(x),$ $\text{arg1}(x, y), \text{arg2}(x, z)$
dog	$n(x)$	$x: \text{dog}(x)$
the	$\text{det}(x)$	$x: \text{def}(x)$

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## Initial Agenda

Vertex	Word	Cat	Semantics
d	the	$\text{det}(d)$	$d: \text{def}(d)$
	dog	$n(d)$	$d: \text{dog}(d)$
s	saw	$v(s, d, c)$	$s: \text{see}(s), \text{past}(s),$ $\text{arg1}(s, d), \text{arg2}(s, c)$
	the	$\text{det}(c)$	$d: \text{def}(d)$
	cat	$n(c)$	$d: \text{cat}(d)$

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## Initial Agenda

Vertex	Word	Cat	Semantics
d	the	det(d)	d: def(d)
	the	np(d)/n(d)	d: def(d)
	dog	n(d)	d: dog(d)
s	saw	v(s, d, c)	s: see(s), past(s), arg1(s, d), arg2(s, c)
c	saw	v(s, d)/np(c)	s: see(s), past(s), arg1(s, d)
	the	det(c)	d: def(d)
	the	np(c)/n(c)	d: def(d)
	cat	n(c)	d: cat(d)

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Vertex	Word	Cat	Semantics
d	the	det(d)	d: def(d)
	the	np(d)/n(d)	d: def(d)
	dog	n(d)	d: dog(d)
s	the dog	np(d)	d: dog(d), def(d) arg1(s, d), arg2(s, c)
c	saw	v(s, d)/np(c)	s: see(s), past(s), arg1(s, d)
	the	det(c)	d: def(d)
	the	np(c)/n(c)	d: def(d)
	cat	n(c)	d: cat(d)

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Vertex	Word	Cat	Semantics
d	the	det(d)	d: def(d)
	the	np(d)/n(d)	d: def(d)
	saw the cat	v(s, d)/np(d)	s: see(s), past(s), arg1(s, d), arg2(s, c), cat(c), def(c)
c	saw	v(s, d)/np(c)	s: see(s), past(s), arg1(s, d)
	the	det(c)	d: def(d)
	the	np(c)/(n(c))	d: def(d)
	cat	n(c)	d: cat(d)
	the cat	np(c)	c: def(c), cat(c)

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Vertex	Word	Cat	Semantics
d	the	det(d)	d: def(d)
	the	np(d)/n(d)	d: def(d)
	dog	n(d)	d: dog(d)
	the dog	np(d)	d: def(d), dog(d)
	saw the cat	v(s, d)/np(d)	s: see(s), past(s), arg1(s, d), arg2(s, c), cat(c), def(c)
s	saw	v(s, d, c)	s: see(s), past(s), arg1(s, d), arg2(s, c)
c	saw	v(s, d)/np(c)	s: see(s), past(s), arg1(s, d)
	the	det(c)	d: def(d)
	the	np(c)/(n(c))	d: def(d)
	cat	n(c)	d: cat(d)
	the cat	np(c)	c: def(c), cat(c)

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s: see(s),  
past(s),  
arg1(s,  
d),  
arg2(s, c)

Vertex	Word	Cat	Semantics
d	the	det(d)	d: def(d)
	the	np(d)/n(d)	d: def(d)
	dog	n(d)	d: dog(d)
	the dog	np(d)	d: def(d), dog(d)
s	saw	v(s, d, c)	s: see(s), past(s), arg1(s, d), arg2(s, c)
	saw the cat	v(s, d)/np(d)	s: see(s), past(s), arg1(s, d), arg2(s, c), cat(c), def(c)
c	saw	v(s, d)/np(c)	s: see(s), past(s), arg1(s, d)
	the	det(c)	d: def(d)
	the	np(c)/(n(c))	d: def(d)
	cat	n(c)	d: cat(d)
	the cat	np(c)	c: def(c), cat(c)

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## Rewriting rules

### String rewriting

$$\alpha \rightarrow \beta / \gamma \_ \delta$$

$\alpha, \gamma, \delta$  are strings / regular expressions allowing variable assignment

$\beta$  is a string

### Set rewriting

$$\alpha \rightarrow \beta / \gamma$$

$\alpha, \beta$  are sets allowing variable assignment

$\gamma$  is a set

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Transfer

## The PARC Transfer System (circa 2000)

Transfer from LFG F-Structure to  
F-Structure through the intermediary of  
a set of Prolog predicates.

Not necessarily limited to F-Structure. Later  
extended to C-Structure

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## Characteristics

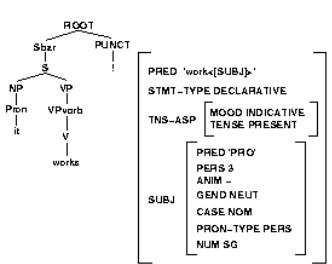
- A configuration consists of one set of predicates. Not one for each language.
- Completely deterministic.
- Ordered rules: Each rule operates on the configuration left by the preceding one.
- Anything that is not explicitly transferred to the target language remains in the source language

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## Flat Structure



```

pred (0, word)
smt_type(0, declarative)
tns_asp(0, 1)
mood(1, indicative)
tense(1, present)
subj(0, 2)
pred(2, pro)
pers(2, 3)
ann(2, '-')
gend(2, neut)
case(2, nom)
pron_type(2, pers)
nom(2, sg)
  
```

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**Typically the grammar begins with a bunch of deletion rules. These rules primarily delete language specific terms which are not supposed to affect the translation relation.**

```

aux_select(_,_) ==> 0.
status(_,_) ==> 0.
gend(_,_) ==> 0.
prog(_,_) ==> 0.
anim(_,_) ==> 0.
ntype(_,_) ==> 0.
grain(_,_) ==> 0.
proper(_,_) ==> 0.
  
```

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**Simple rules to transfer specific words or attributes, look like:**

```

vtype(X,main) ==> vtype(X,unspec).
pred(X, be) ==> pred(X, être).
  
```

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**Repetitive transfer rules can be encoded using templates. A template can be defined as any prolog term, including any of the operators provided by prolog (such as ' $\rightarrow$ ' or ' $-$ '). Templates can call other templates and also combine with other templates and rules.**

```

p2p(Source, Target) :: 
  pred(X,Source) ==> pred(X,Target).

Source -> Target :: 
  p2p(Source, Target).

  dog    -> chien.
  cat    -> chat.
  saw    -> voyait.

  sleep  -> dormir.
  run    -> courir.
  come   -> venir.
  walk   -> marcher.
  
```

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```

proper_name(Source, Target) ::  

    pred(X,Source) ==> pred(X,Target).  
  

proper_name('John', 'Jean').  

proper_name('Mary', 'Marie').

```

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Templates can also be redefined, which is especially useful for using the convenient and mnemonic operators.

```

Source -> Target ::  

    spec_form(X,Source) ==> spec_form(X,Target).  
  

the      -> le.  
  

Source -> Target ::  

    pron_form(X,Source) ==> pron_form(X,Target).  
  

'I'      -> je.  
  

Source -> Target ::  

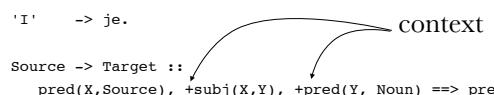
    pred(X,Source), +subj(X,Y), +pred(Y,_Noun) ==> pred(X,Target).  
  

good   -> bon.  

young  -> jeune.  

left   -> gauche.  

right  -> droit.



```

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In addition to templates, the system provides a facility for referring to a group of recurring terms together, using macros.

```

add_adjunct(X,Z)      := adjunct(X,Y), in_set(Z,Y).  

adjective(X,Adj,Subj) := pred(X,Adj), arg(X,1,Subj).  
  

pred(X,girl) ==>  

    pred(X,fille),           % girl -> jeune fille  

    add_adjunct(X,J),  

    adjective(J,jeune,X).

```

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Semantics is a set of predicates

$\text{man}(m)$ ,  $\text{dog}(d)$ ,  $\text{boy}(b)$ ,  $\text{def}(m)$ ,  $\text{def}(d)$ ,  $\text{see}(s)$ ,  
 $\text{past}(s)$ ,  $\text{agent}(s, m)$ ,  $\text{patient}(s, d)$ ,  $\text{recipient}(s, b)$

$b, d, m, s$  are arbitrary constants.

Grammar:

$s(s) \rightarrow np(subj), vp(s, subj)$   
 $vp(v, subj) \rightarrow v(v, subj, obj), np(obj)$   
 $vp(subj, obj2) \rightarrow v(v, subj, obj1, obj2), np(obj1)$   
 $np(x) \rightarrow det(x), n(x)$

Word	Cat	Semantics
man	$n(x)$	$x: \text{man}(x)$
boy	$v(x, y, z)$	$x: \text{boy}(x)$
dog	$n(x)$	$x: \text{dog}(x)$
the	$\text{det}(x)$	$x: \text{def}(x)$
gave	$v(v, x, y, z)$	$\text{give}(v), \text{past}(v), \text{agent}(v, x), \text{patient}(v, y), \text{recipient}(v, z)$

- Semantics is a set of predicates.
  - Predicates are related by variables
- 

Word	Cat	Semantics
man	$n(x)$	$x: \text{man}(x)$
boy	$v(x, y, z)$	$x: \text{boy}(x)$
dog	$n(x)$	$x: \text{dog}(x)$
the	$\text{det}(x)$	$x: \text{def}(x)$
gave	$v(v, x, y, z)$	$\text{give}(v), \text{past}(v), \text{agent}(v, x), \text{patient}(v, y), \text{recipient}(v, z)$

- Variables connect syntax to semantics
- 