Dependency Graph Parsing as Sequence Labeling



Ana Ezquerro



David Vilares



Carlos Gómez-Rodríguez







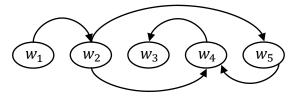






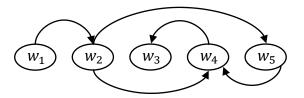
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- Sentence: $W = (w_1, ..., w_n)$.
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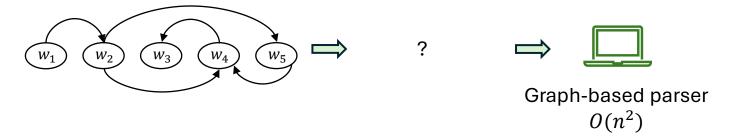
It's **not** Dependency *Tree* Parsing.

- Multiple roots and heads per node.
- Optionally non-connected.
- Cycles are allowed.



Dependency **Graph** Parsing...

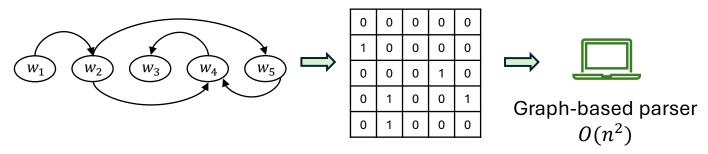
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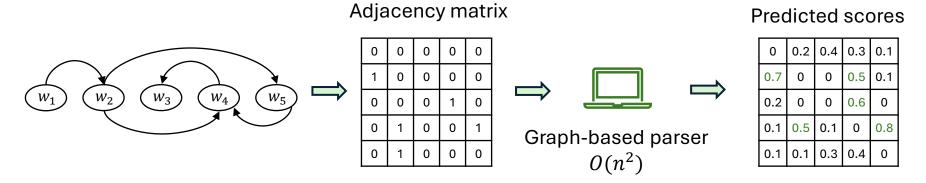
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Adjacency matrix



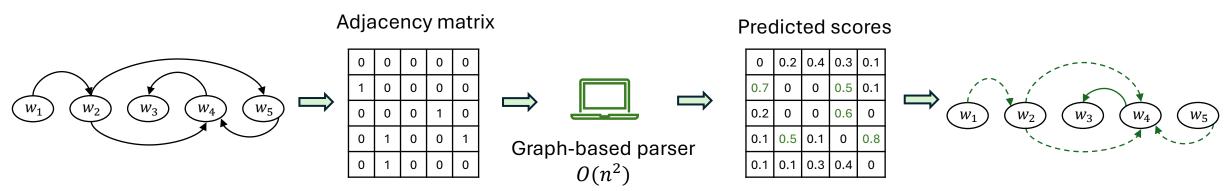
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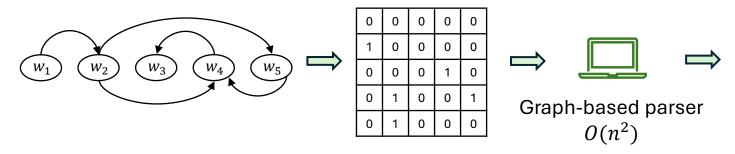


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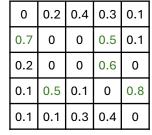
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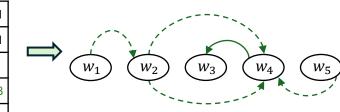
- Dozat & Manning (2018): ~ 90 UF
- <u>Ji et al. (2019)</u>: ~95 UF

Adjacency matrix



Predicted scores



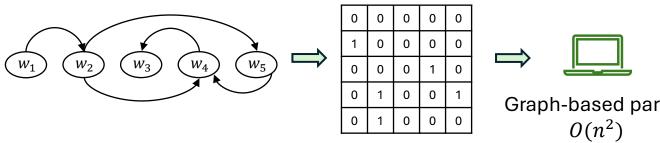


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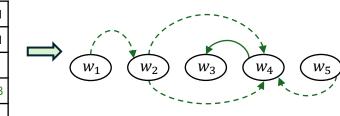




Graph-based parser

Predicted scores

	0	0.2	0.4	0.3	0.1
0	.7	0	0	0.5	0.1
0	.2	0	0	0.6	0
0	.1	0.5	0.1	0	0.8
0	.1	0.1	0.3	0.4	0





Encoding

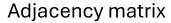
$$\ell_1$$
 ℓ_2 ℓ_3 ℓ_4 ℓ_5

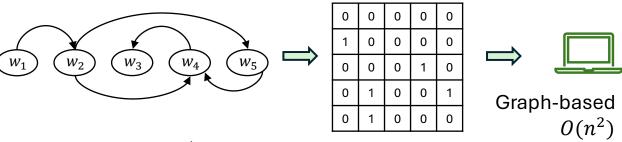
Encoded labels

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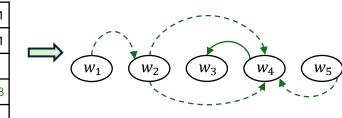


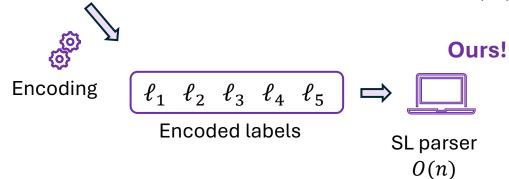




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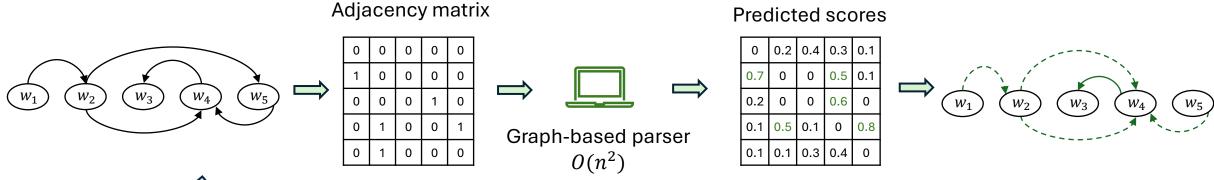


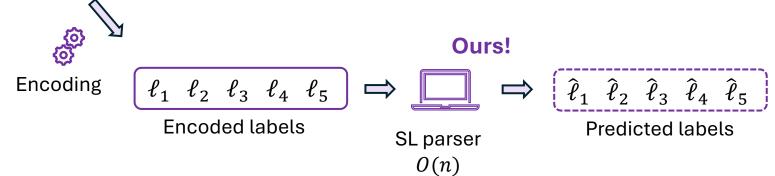


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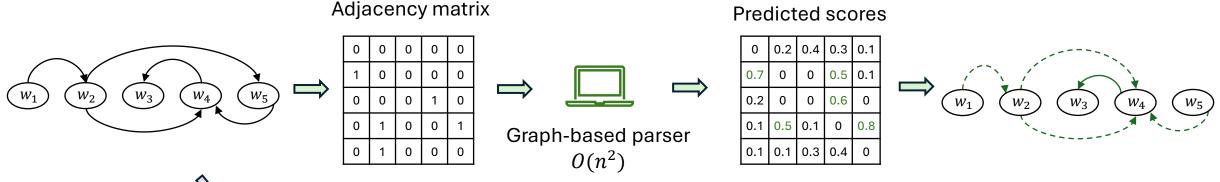


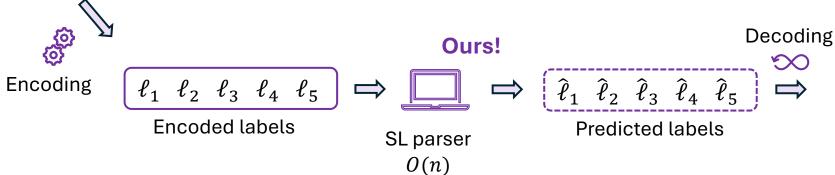


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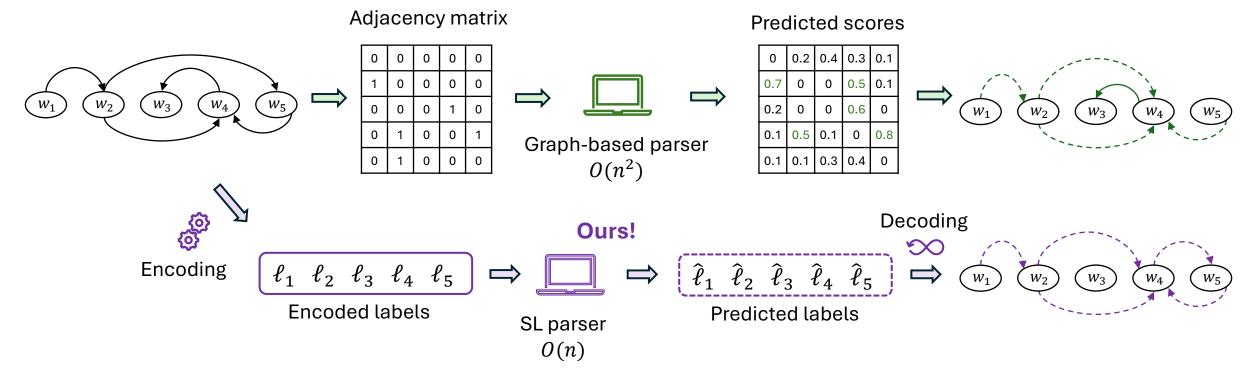




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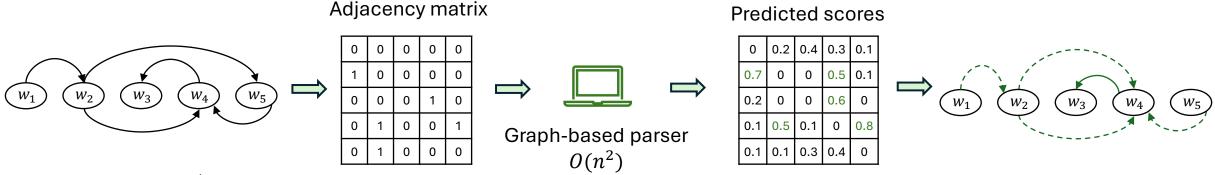
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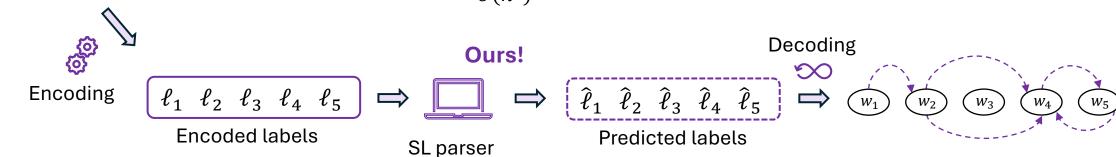


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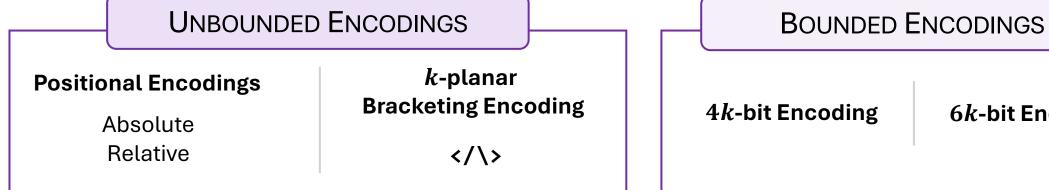


- 1. Define the encoding and decoding functions.
- 2. Then tackle as a classical tagging task



O(n)

We propose various encoding (6)) and decoding (∞) functions



Fixed number of unique labels.

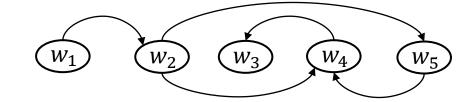
6k-bit Encoding

Non-fixed number of unique labels.

Positional encodings: absolute (A) and relative (R)

Absolute: Sorted sequence of head positions.



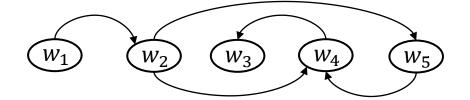


$$\ell_1$$
 ℓ_2 ℓ_3 ℓ_4 ℓ_5 Absolute: (,) (1) (4) (2,5) (2)

Positional encodings: absolute (A) and relative (R)

Absolute: Sorted sequence of head positions.

• Relative: Sorted sequence of head relative positions.



_	ℓ_1	ℓ_2	ℓ_3	ℓ_4	ℓ_5
Absolute:	(,)	(1)	(4)	(2,5)	(2)

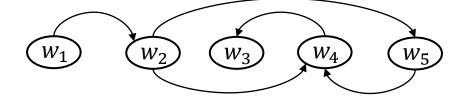
Relative: (,) (-1) (1) (-2, 1) (-3)

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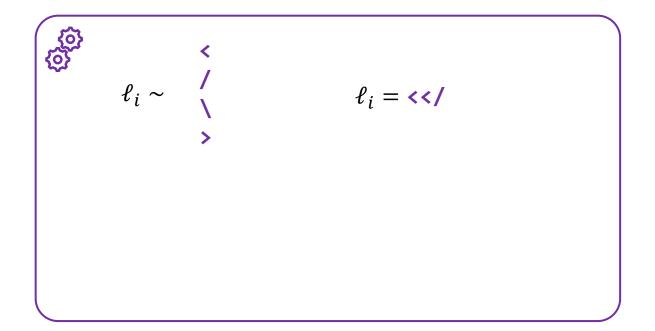
Fast and simple decoding (easy to parallelize).



_	ℓ_1	ℓ_2	ℓ_3	ℓ_4	ℓ_5	
Absolute:	(,)	(1)	(4)	(2,5)	(2)	

Relative: (,) (-1) (1) (-2, 1) (-3)





```
\ell_i \sim \begin{array}{c} <: \text{ There is a head at the right.} \\ /: \text{ There is a dependent at the right.} \\ \backslash: \text{ There is a dependent at the left.} \\ >: \text{ There is a head is at the left.} \\ \end{array}
```

```
There is a head at the right.
```

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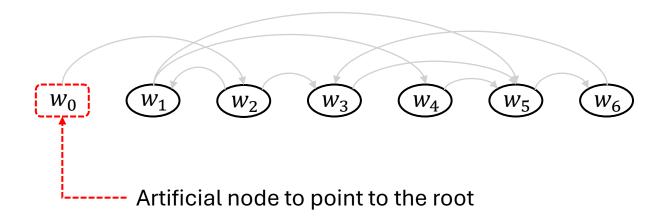
> : There is a head is at the left.

- Distribute the arcs in planes (non-crossing arcs).
- Add symbol * for brackets of other planes.
- First plane: </\>.
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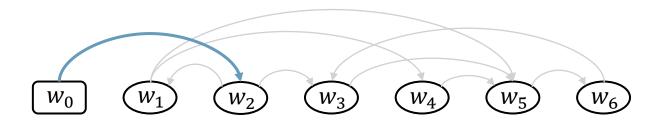
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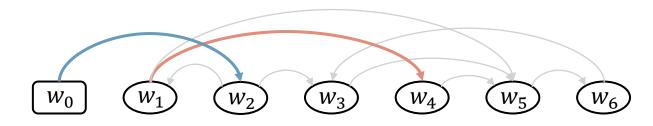
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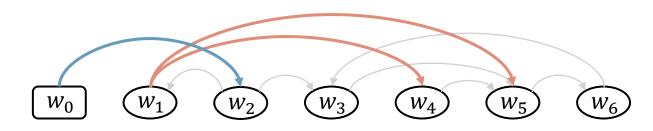
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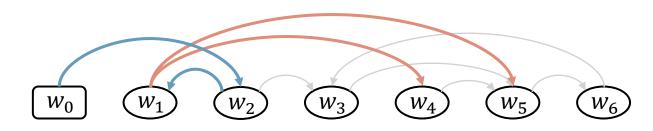
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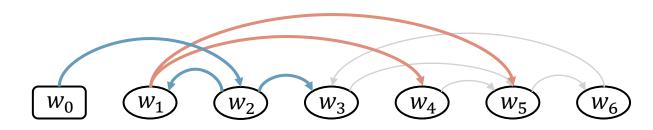
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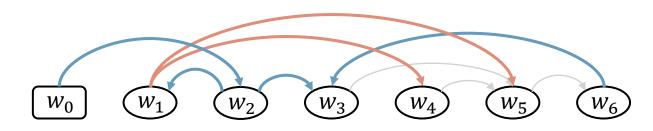
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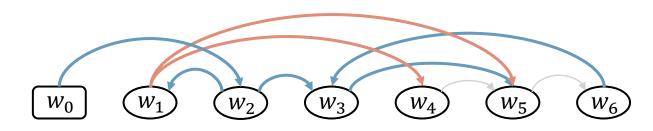
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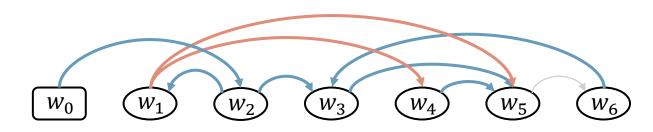
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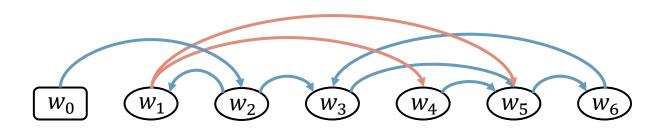
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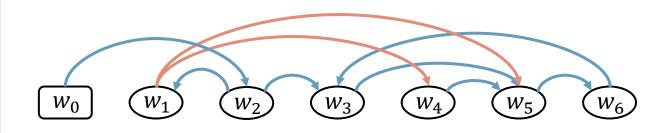
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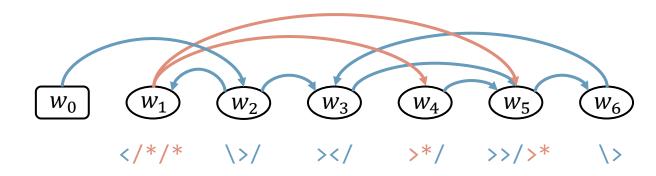
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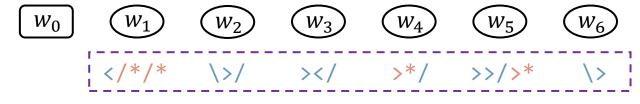
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We predict this!



How do we recover the arcs from the labels $(\ell_1, ..., \ell_n)$?



- Two stacks (L and R) per plane.
- L for left arcs (<\)and R right arcs (/>).

 ∞

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 ∞

L

R Ø

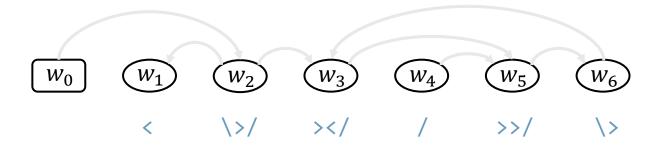
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\ : Resolve L ← w<sub>i</sub>.
> : Resolve R → w<sub>i</sub>.
```

```
L
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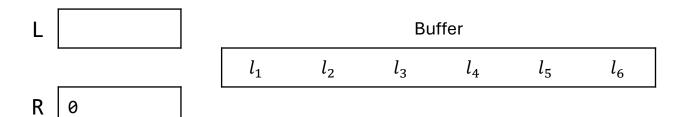
R 0

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\infty
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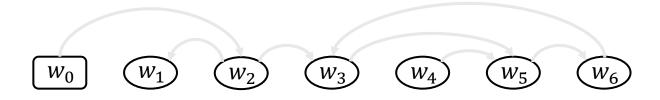


initial state: Labels to buffer and R with the root dependency.

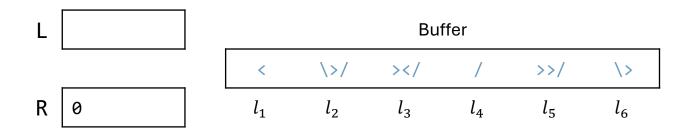


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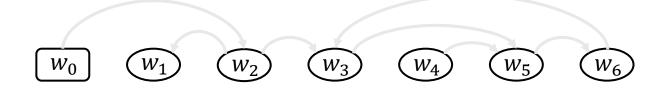


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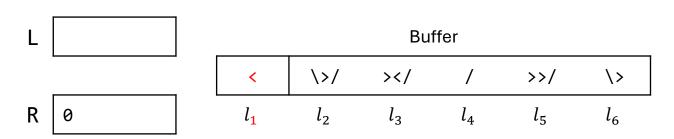


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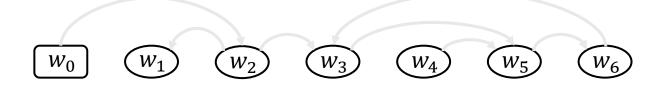


❤ Step 1.



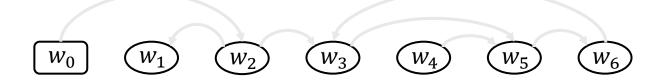
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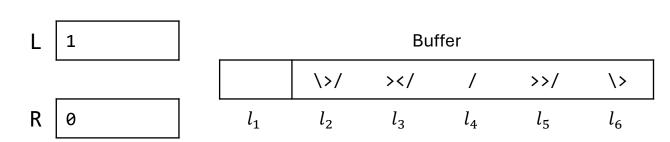


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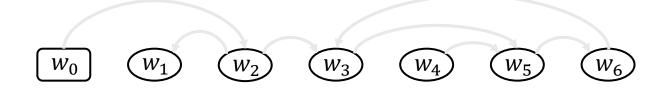




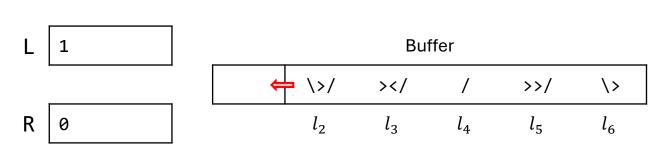


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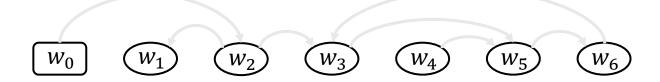
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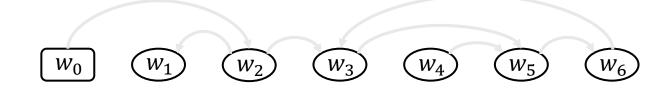
```
\infty
```

- Two stacks (L and R) per plane.
- L for left arcs (<\)and R right arcs (/>).

```
Add i to L.Add i to R.
```

\ : Resolve $\mathbf{L} \leftarrow w_i$.

> : Resolve $\mathbf{R} \rightarrow w_i$.

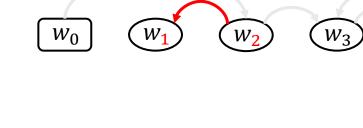


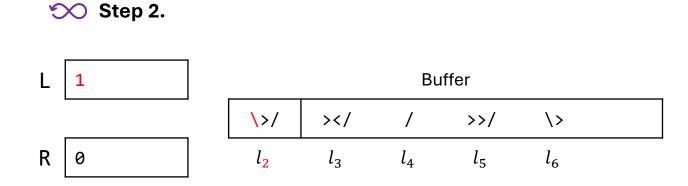
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\infty
```

- Two stacks (L and R) per plane.
- L for left arcs (<\)and R right arcs (/>).

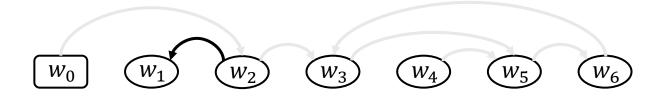
```
    < : Add i to L.
    / : Add i to R.
    \ : Resolve L ← w<sub>i</sub>.
```

> : Resolve $\mathbf{R} \rightarrow w_i$.

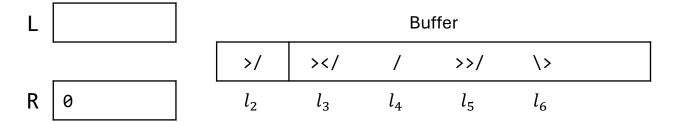




- Two stacks (L and R) per plane.
- L for left arcs (<\)and R right arcs (/>).
 - . Add *i* to L.
 - /: Add i to R.
 - \ : Resolve $L \leftarrow w_i$.
 - > : Resolve $\mathbf{R} \rightarrow w_i$.





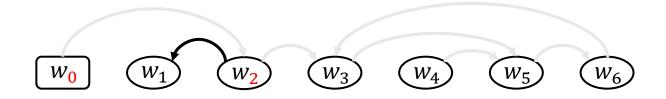


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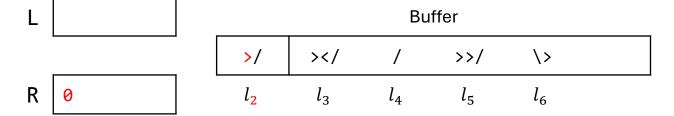
- Two stacks (L and R) per plane.
- L for left arcs (<\)and R right arcs (/>).

```
< : Add i to L.
/ : Add i to R.
\ : Resolve L \leftarrow w_i.
```

> : Resolve $\mathbf{R} \rightarrow w_i$.





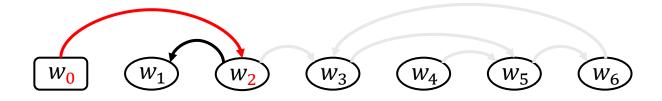


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\infty
```

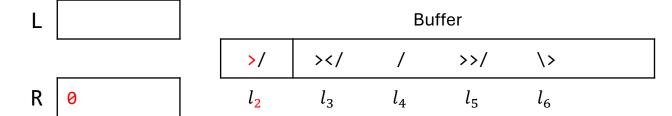
- Two stacks (L and R) per plane.
- L for left arcs (<\)and R right arcs (/>).

```
< : Add i to L.
/ : Add i to R.
\ : Resolve L \leftarrow w_i.
```

> : Resolve $\mathbf{R} \rightarrow w_i$.

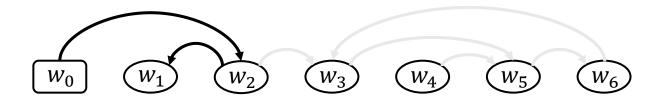




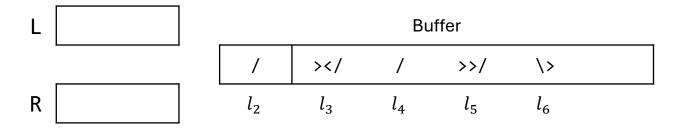


∞

- Two stacks (L and R) per plane.
- L for left arcs (<\)and R right arcs (/>).
 - : Add *i* to L.
 - /: Add i to R.
 - \ : Resolve $L \leftarrow w_i$.
 - > : Resolve $\mathbf{R} \rightarrow w_i$.

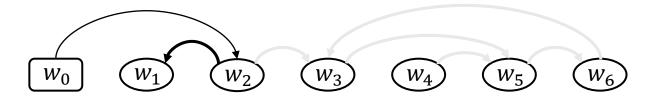


Step 2.

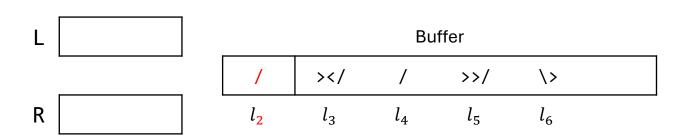


```
\infty
```

- Two stacks (L and R) per plane.
- L for left arcs (<\)and R right arcs (/>).
 - Add *i* to L.Add *i* to R.
 - \ : Resolve $L \leftarrow w_i$.
 - > : Resolve $\mathbf{R} \rightarrow w_i$.







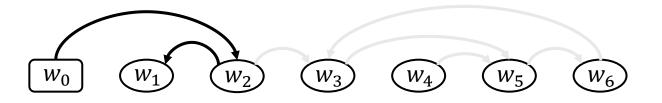
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- Two stacks (L and R) per plane.
- L for left arcs (<\)and R right arcs (/>).

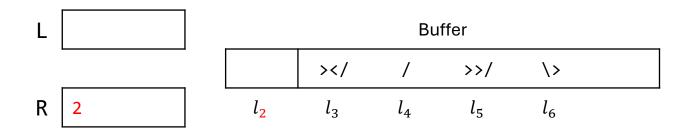
```
< : Add i to L.
/ : Add i to R.</pre>
```

\ : Resolve $L \leftarrow w_i$.

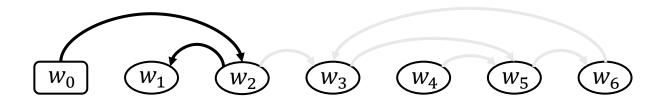
> : Resolve $\mathbf{R} \rightarrow w_i$.



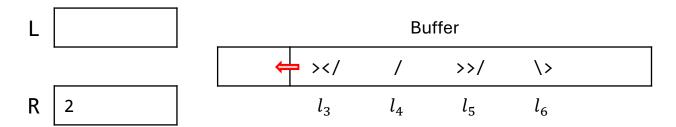




- Two stacks (L and R) per plane.
- L for left arcs (<\)and R right arcs (/>).
 - . Add *i* to L.
 - /: Add i to R.
 - \ : Resolve $L \leftarrow w_i$.
 - > : Resolve $\mathbf{R} \rightarrow w_i$.

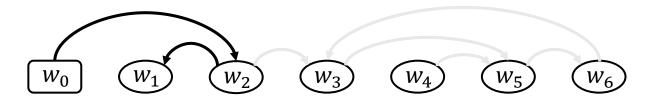




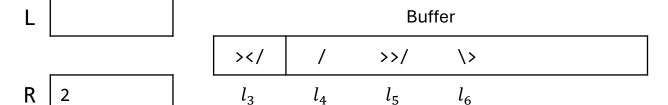


∞

- Two stacks (L and R) per plane.
- L for left arcs (<\)and R right arcs (/>).
 - . Add *i* to L.
 - /: Add i to R.
 - \: Resolve $L \leftarrow w_i$.
 - > : Resolve $\mathbf{R} \rightarrow w_i$.



Step 3.



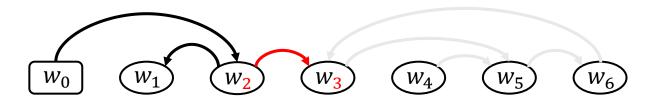
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```

- Two stacks (L and R) per plane.
- L for left arcs (<\)and R right arcs (/>).

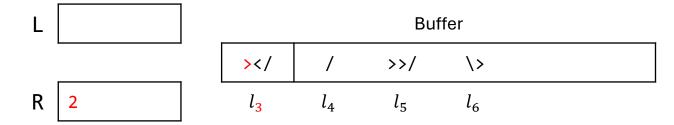
```
< : Add i to L.
/ : Add i to R.</pre>
```

\ : Resolve $L \leftarrow w_i$.

> : Resolve $\mathbf{R} \rightarrow w_i$.

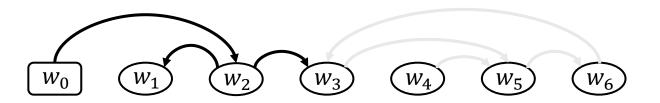




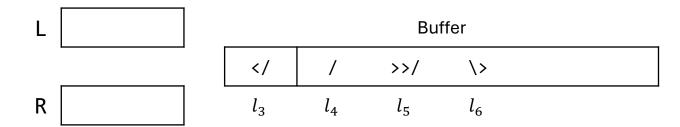


∞

- Two stacks (L and R) per plane.
- L for left arcs (<\)and R right arcs (/>).
 - : Add *i* to L.
 - /: Add i to R.
 - \: Resolve $L \leftarrow w_i$.
 - > : Resolve $\mathbf{R} \rightarrow w_i$.

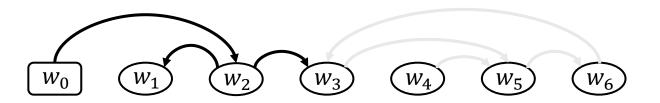


Step 3.

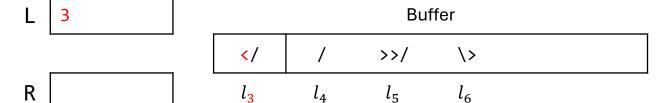


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\infty
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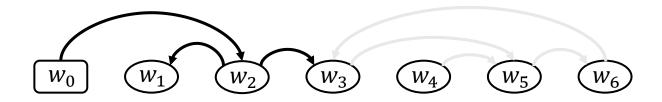
- Two stacks (L and R) per plane.
- L for left arcs (<\)and R right arcs (/>).
 - Add *i* to **L**.
 - /: Add i to R.
 - \: Resolve $L \leftarrow w_i$.
 - > : Resolve $\mathbf{R} \rightarrow w_i$.



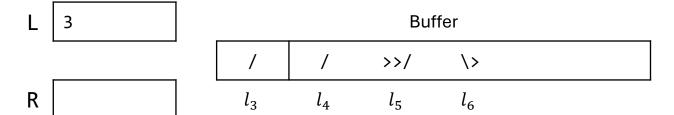
Step 3.



- Two stacks (L and R) per plane.
- L for left arcs (<\)and R right arcs (/>).
 - . Add *i* to L.
 - /: Add i to R.
 - \ : Resolve $L \leftarrow w_i$.
 - > : Resolve $\mathbf{R} \rightarrow w_i$.







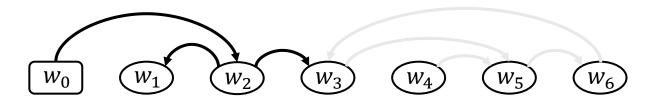
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\infty
```

- Two stacks (L and R) per plane.
- L for left arcs (<\)and R right arcs (/>).

```
< : Add i to L.
/ : Add i to R.</pre>
```

\ : Resolve $L \leftarrow w_i$.

> : Resolve $\mathbf{R} \rightarrow w_i$.

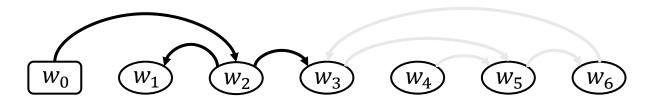




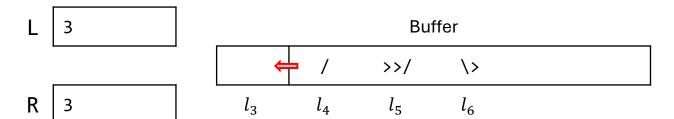
R

$$l_3$$
 l_4 l_5 l_6

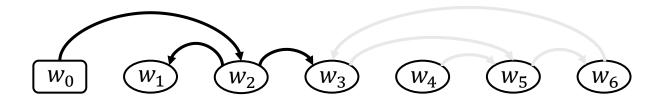
- Two stacks (L and R) per plane.
- L for left arcs (<\)and R right arcs (/>).
 - : Add *i* to L.
 - /: Add i to R.
 - \ : Resolve $L \leftarrow w_i$.
 - > : Resolve $\mathbf{R} \rightarrow w_i$.







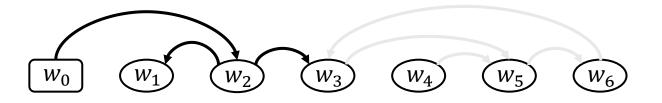
- Two stacks (L and R) per plane.
- L for left arcs (<\)and R right arcs (/>).
 - : Add *i* to L.
 - /: Add i to R.
 - \ : Resolve $L \leftarrow w_i$.
 - > : Resolve $\mathbf{R} \rightarrow w_i$.





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\infty
```

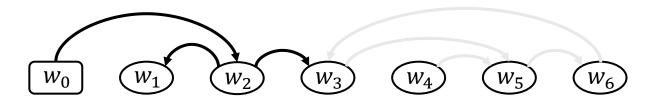
- Two stacks (L and R) per plane.
- L for left arcs (<\)and R right arcs (/>).
 - Add *i* to L.Add *i* to R.
 - \ : Resolve $L \leftarrow w_i$.
 - > : Resolve $\mathbf{R} \rightarrow w_i$.





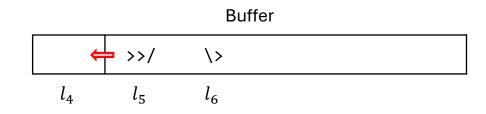


- Two stacks (L and R) per plane.
- L for left arcs (<\)and R right arcs (/>).
 - : Add *i* to L.
 - /: Add i to R.
 - \ : Resolve $L \leftarrow w_i$.
 - > : Resolve $\mathbf{R} \rightarrow w_i$.



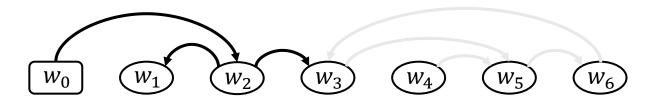






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\infty
```

- Two stacks (L and R) per plane.
- L for left arcs (<\)and R right arcs (/>).
 - . Add *i* to L.
 - /: Add i to R.
 - \ : Resolve $L \leftarrow w_i$.
 - > : Resolve $\mathbf{R} \rightarrow w_i$.





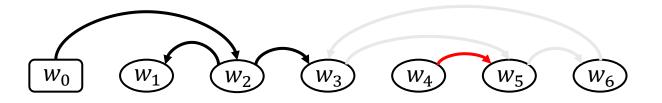


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\infty
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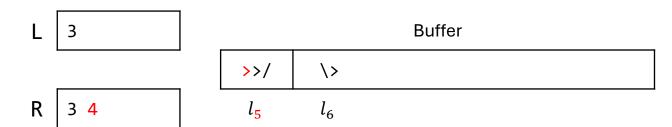
- Two stacks (L and R) per plane.
- L for left arcs (<\)and R right arcs (/>).

```
< : Add i to L.
/ : Add i to R.
\ : Resolve L \leftarrow w_i.
```

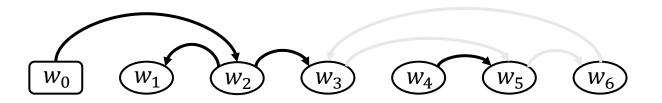
> : Resolve $\mathbf{R} \rightarrow w_i$.





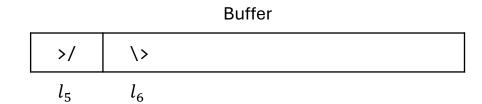


- Two stacks (L and R) per plane.
- L for left arcs (<\)and R right arcs (/>).
 - . Add *i* to L.
 - /: Add i to R.
 - \ : Resolve $L \leftarrow w_i$.
 - > : Resolve $\mathbf{R} \rightarrow w_i$.







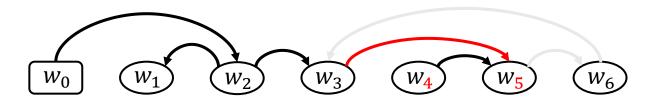


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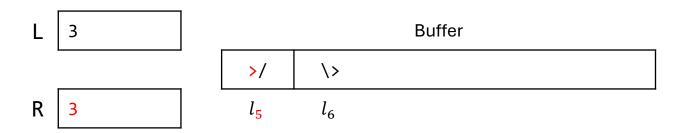
- Two stacks (L and R) per plane.
- L for left arcs (<\)and R right arcs (/>).

```
: Add i to L.
/: Add i to R.
```

\ : Resolve $L \leftarrow w_i$. > : Resolve $\mathbf{R} \rightarrow w_i$.

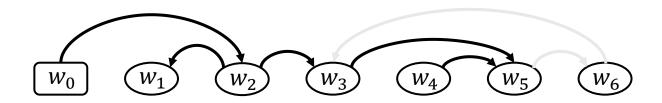




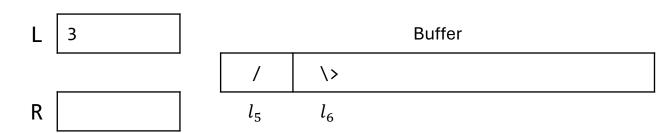


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\infty
```

- Two stacks (L and R) per plane.
- L for left arcs (<\)and R right arcs (/>).
 - . Add *i* to L.
 - /: Add i to R.
 - \ : Resolve $L \leftarrow w_i$.
 - > : Resolve $\mathbf{R} \rightarrow w_i$.







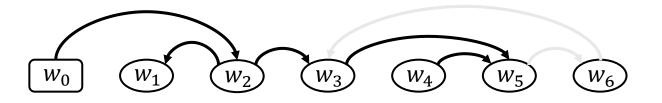
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\infty
```

- Two stacks (L and R) per plane.
- L for left arcs (<\)and R right arcs (/>).

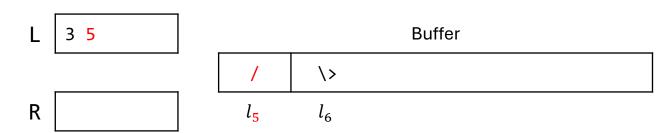
```
Add i to L.Add i to R.
```

\ : Resolve $L \leftarrow w_i$.

> : Resolve $\mathbf{R} \rightarrow w_i$.

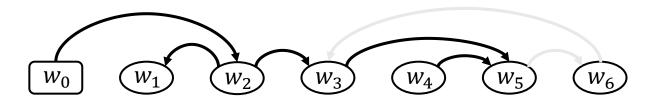




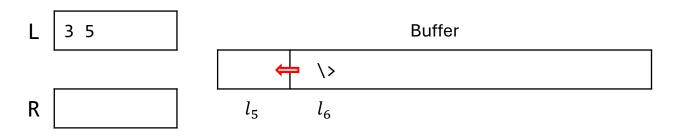


∞

- Two stacks (L and R) per plane.
- L for left arcs (<\)and R right arcs (/>).
 - : Add *i* to L.
 - /: Add i to R.
 - \ : Resolve $L \leftarrow w_i$.
 - > : Resolve $\mathbf{R} \rightarrow w_i$.

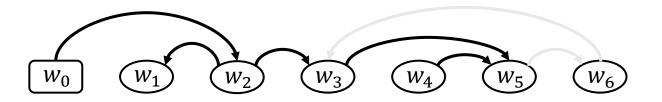




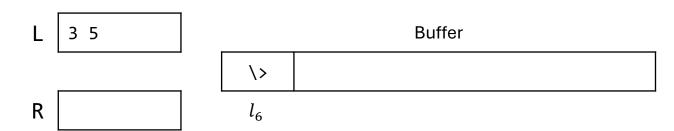


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\infty
```

- Two stacks (L and R) per plane.
- L for left arcs (<\)and R right arcs (/>).
 - : Add *i* to L.
 - /: Add i to R.
 - \ : Resolve $L \leftarrow w_i$.
 - > : Resolve $\mathbf{R} \rightarrow w_i$.



Step 6.

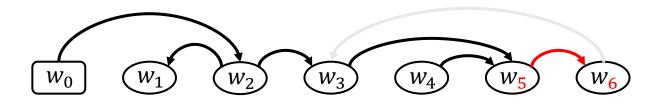


```
\infty
```

- Two stacks (L and R) per plane.
- L for left arcs (<\)and R right arcs (/>).

```
    < : Add i to L.
    / : Add i to R.
    \ : Resolve L ← w<sub>i</sub>.
```

> : Resolve $\mathbf{R} \rightarrow w_i$.







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\infty
```

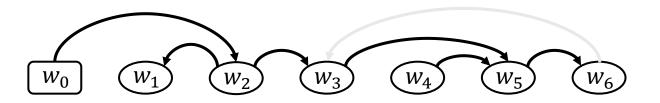
- Two stacks (L and R) per plane.
- L for left arcs (<\)and R right arcs (/>).

: Add *i* to L.

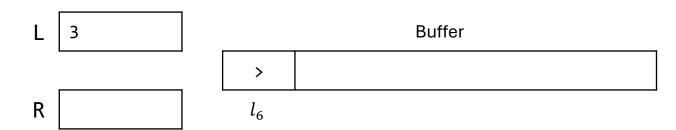
/: Add i to R.

\ : Resolve $L \leftarrow w_i$.

> : Resolve $\mathbf{R} \rightarrow w_i$.



♡ Step 6.



```
\infty
```

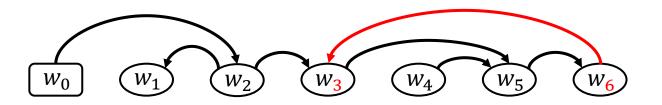
- Two stacks (L and R) per plane.
- L for left arcs (<\)and R right arcs (/>).

: Add *i* to **L**.

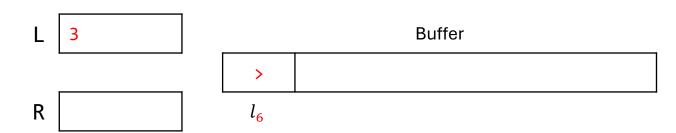
/: Add i to R.

\ : Resolve $L \leftarrow w_i$.

> : Resolve $\mathbf{R} \rightarrow w_i$.



♡ Step 6.



∞

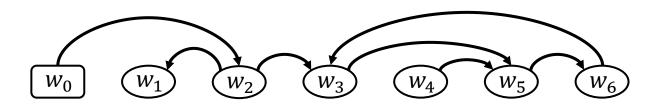
- Two stacks (L and R) per plane.
- L for left arcs (<\)and R right arcs (/>).

<: Add i to \bot .

/: Add i to R.

\ : Resolve $L \leftarrow w_i$.

> : Resolve $\mathbf{R} \rightarrow w_i$.



Finished!

R

L Buffer

1-planar graph

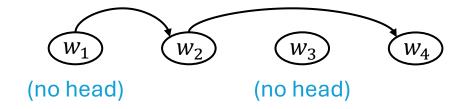
No crossing arcs.

Relaxed 1-planar graph

• No crossing arcs in the same direction.

Relaxed 1-planar tree

- No crossing arcs in the same direction.
- Only one head per node.



- ✓ 1-planar
- Relaxed 1-planar graph
- Relaxed 1-planar tree

1-planar graph

No crossing arcs.

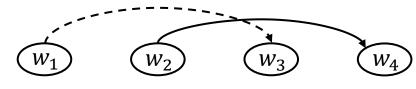
Relaxed 1-planar graph

No crossing arcs in the same direction.

Relaxed 1-planar tree

- No crossing arcs in the same direction.
- Only one head per node.

(crossing arcs in the same direction)



(no head) (no head)

- X 1-planar
- X Relaxed 1-planar graph
- Relaxed 1-planar tree

1-planar graph

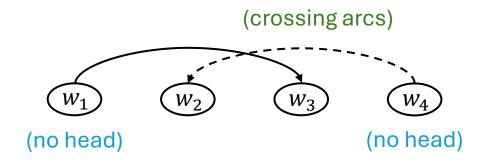
No crossing arcs.

Relaxed 1-planar graph

No crossing arcs in the same direction.

Relaxed 1-planar tree

- No crossing arcs in the same direction.
- Only one head per node.



X 1-planar

Relaxed 1-planar graph

Relaxed 1-planar tree

1-planar graph

No crossing arcs.

Relaxed 1-planar graph

• No crossing arcs in the same direction.

Relaxed 1-planar tree

- No crossing arcs in the same direction.
- Only one head per node.



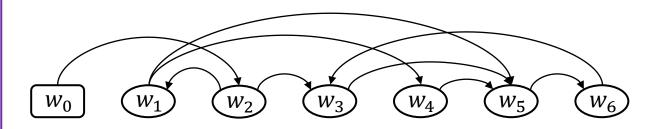
- ✓ 1-planar
- Relaxed 1-planar graph
- Relaxed 1-planar tree

Assumptions:

- Distribute the arcs in relaxed 1-planar trees.
- Encode each label ℓ_i with 4 bits: $b_0b_1b_2b_3$.

2	0	w_i has a right head.
b ₀	1	w_i has a left head.
b ₁		w_i is the outermost dependent.
b ₂		w_i has left dependents.
b ₃		w_i has right dependents.

Step 1: Distribute the arcs in relaxed 1-planar trees.

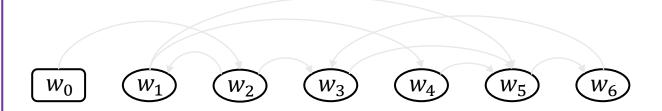


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Step 1: Distribute the arcs in relaxed 1-planar trees.

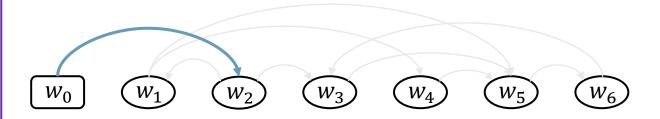


Assumptions:

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b	0	w_i has a right head.
\mathbf{b}_{0} 1 w_{i} has a left head.		w_i has a left head.
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b ₃		w_i has right dependents.

Step 1: Distribute the arcs in relaxed 1-planar trees.

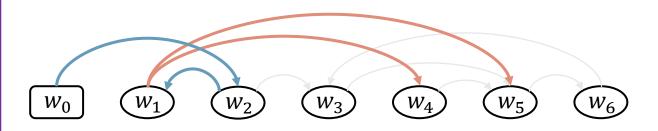


Assumptions:

- Distribute the arcs in relaxed 1-planar trees.
- Encode each label ℓ_i with 4 bits: $b_0b_1b_2b_3$.

4	0	w_i has a right head.
b ₀	1	w_i has a left head.
b ₁		w_i is the outermost dependent.
b ₂		w_i has left dependents.
b ₃		w_i has right dependents.

Step 1: Distribute the arcs in relaxed 1-planar trees.

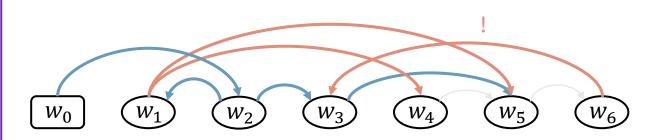


Assumptions:

- Distribute the arcs in relaxed 1-planar trees.
- Encode each label ℓ_i with 4 bits: $\mathbf{b_0b_1b_2b_3}$.

۲	0	w_i has a right head.
b ₀	1	w_i has a left head.
b ₁		w_i is the outermost dependent.
b ₂		w_i has left dependents.
b ₃		w_i has right dependents.

Step 1: Distribute the arcs in relaxed 1-planar trees.

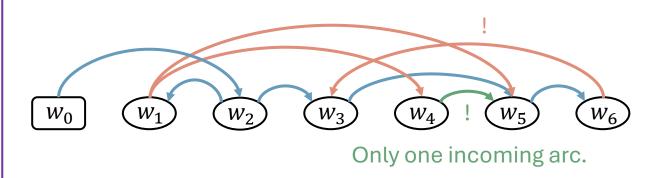


Assumptions:

- Distribute the arcs in relaxed 1-planar trees.
- Encode each label ℓ_i with 4 bits: $b_0b_1b_2b_3$.

h	0	w_i has a right head.
\mathbf{b}_{\emptyset} 1 w_i has a left head.		w_i has a left head.
b ₁		w_i is the outermost dependent.
b ₂		w_i has left dependents.
b ₃		w_i has right dependents.

Step 1: Distribute the arcs in relaxed 1-planar trees.

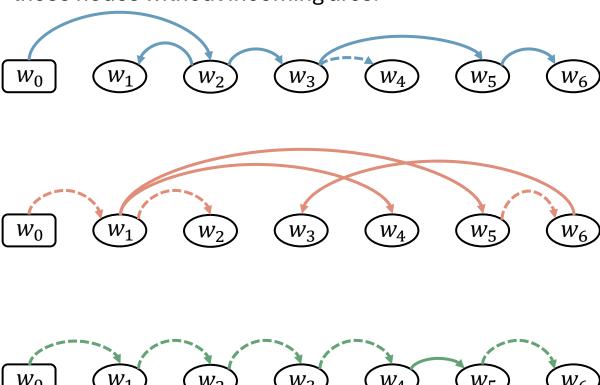


Assumptions:

- Distribute the arcs in relaxed 1-planar trees.
- Encode each label ℓ_i with 4 bits: $b_0b_1b_2b_3$.

L	0	w_i has a right head.
\mathbf{b}_{0} 1 w_{i} has a left head.		w_i has a left head.
b	1	w_i is the outermost dependent.
b ₂		w_i has left dependents.
b ₃		w_i has right dependents.

Step 2: Each plane is a tree. Create artificial heads to those nodes without incoming arcs.

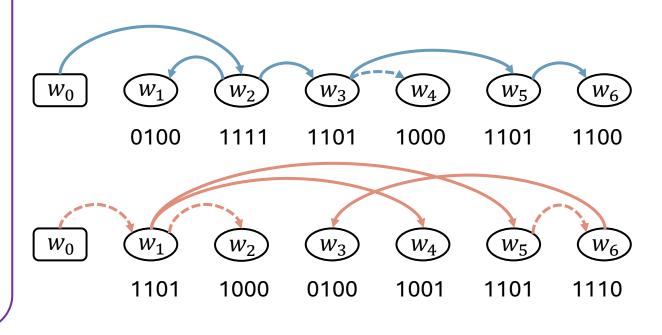


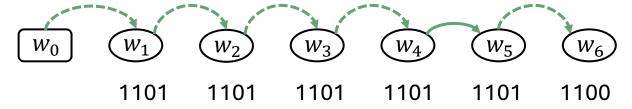
Assumptions:

- Distribute the arcs in relaxed 1-planar trees.
- Encode each label ℓ_i with 4 bits: $b_0b_1b_2b_3$.

L	0	w_i has a right head.
\mathbf{b}_{\emptyset} 1 w_i has a left head.		w_i has a left head.
b	1	w_i is the outermost dependent.
b ₂		w_i has left dependents.
b ₃		w_i has right dependents.

Step 3. Assign labels.







What about decoding?



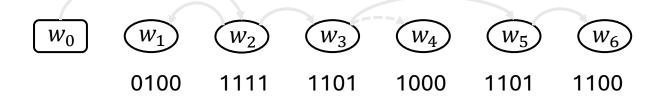
- Same as bracketing-encoding.
- L for left arcs (<\)and R right arcs (/>).
- Store i and b_1 .

	00	Add i_0 to L.
h h	01	Add i_1 to L.
b ₀ b ₁	10	Resolve $\mathbf{R} o w_i$.
	11	Resolve $\mathbf{R} o w_i$ and pop \mathbf{R} .
b ₂	1	Resolve $L_p \leftarrow w_i$ and pop if p .
b ₃	1	Add i to R .



- Same as bracketing-encoding.
- L for left arcs (<\)and R right arcs (/>).
- Store i and b_1 .

	00	Add i_0 to L.
h h	01	Add i_1 to L.
b ₀ b ₁	10	Resolve $\mathbf{R} o w_i$.
	11	Resolve $\mathbf{R} o w_i$ and pop \mathbf{R} .
b ₂	1	Resolve $L_p \leftarrow w_i$ and pop if p .
b ₃	1	Add i to R .



initial state: Labels to buffer and **R** with the root dependency.

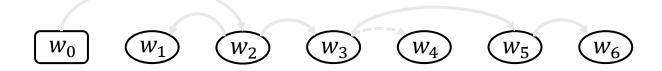
L				Bu	ffer		
		l_1	l_2	l_3	l_4	l_5	l_6

R



- Same as bracketing-encoding.
- L for left arcs (<\)and R right arcs (/>).
- Store i and b_1 .

	00	Add i_0 to L.
h h	01	Add i_1 to L.
b ₀ b ₁	10	Resolve $\mathbf{R} o w_i$.
	11	Resolve $\mathbf{R} o w_i$ and pop \mathbf{R} .
b ₂	1	Resolve $L_p \leftarrow w_i$ and pop if p .
b ₃	1	Add i to R .

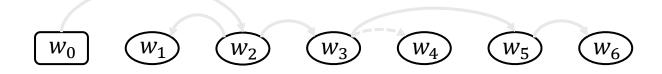


initial state: Labels to buffer and **R** with the root dependency.



- Same as bracketing-encoding.
- L for left arcs (<\)and R right arcs (/>).
- Store i and b_1 .

b_0b_1	00	Add i_0 to L.
	01	Add i_1 to L .
	10	Resolve $\mathbf{R} o w_i$.
	11	Resolve $\mathbf{R} o w_i$ and pop \mathbf{R} .
b ₂	1	Resolve $L_p \leftarrow w_i$ and pop if p .
b ₃	1	Add i to R .

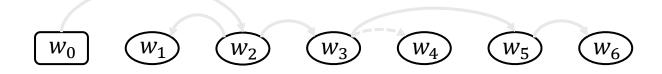


initial state: Labels to buffer and **R** with the root dependency.



- Same as bracketing-encoding.
- L for left arcs (<\)and R right arcs (/>).
- Store i and b_1 .

b ₀ b ₁	00	Add i_0 to L.
	01	Add i_1 to L .
	10	Resolve $\mathbf{R} o w_i$.
	11	Resolve $\mathbf{R} o w_i$ and pop \mathbf{R} .
b ₂	1	Resolve $L_p \leftarrow w_i$ and pop if p .
b ₃	1	Add i to R .

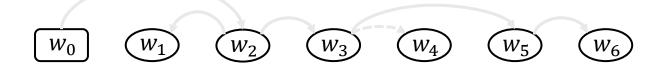


initial state: Labels to buffer and **R** with the root dependency.



- Same as bracketing-encoding.
- L for left arcs (<\)and R right arcs (/>).
- Store i and b_1 .

b_0b_1	00	Add i_0 to L.
	01	Add i_1 to L.
	10	Resolve $\mathbf{R} o w_i$.
	11	Resolve $\mathbf{R} o w_i$ and pop \mathbf{R} .
b ₂	1	Resolve $L_p \leftarrow w_i$ and pop if p .
b ₃	1	Add i to R .

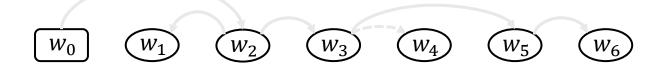


initial state: Labels to buffer and **R** with the root dependency.



- Same as bracketing-encoding.
- L for left arcs (<\)and R right arcs (/>).
- Store i and b_1 .

b ₀ b ₁	00	Add i_0 to L.
	01	Add i_1 to L.
	10	Resolve $\mathbf{R} o w_i$.
	11	Resolve $\mathbf{R} o w_i$ and pop \mathbf{R} .
b ₂	1	Resolve $L_p \leftarrow w_i$ and pop if p .
b ₃	1	Add i to R .

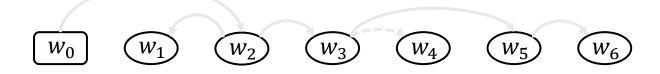


initial state: Labels to buffer and **R** with the root dependency.

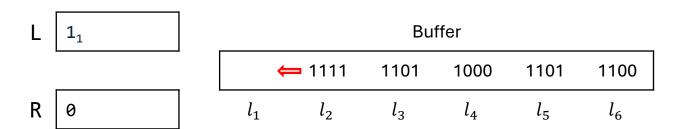


- Same as bracketing-encoding.
- L for left arcs (<\)and R right arcs (/>).
- Store i and b_1 .

b_0b_1	00	Add i_0 to L.
	01	Add i_1 to L.
	10	Resolve $\mathbf{R} o w_i$.
	11	Resolve $\mathbf{R} o w_i$ and pop \mathbf{R} .
b ₂	1	Resolve $L_p \leftarrow w_i$ and pop if p .
b ₃	1	Add i to R .



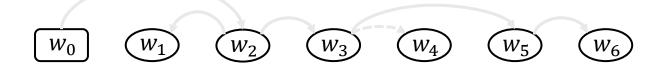
Initial state: Labels to buffer and **R** with the root dependency.





- Same as bracketing-encoding.
- L for left arcs (<\)and R right arcs (/>).
- Store i and b_1 .

b ₀ b ₁	00	Add i_0 to L.
	01	Add i_1 to L.
	10	Resolve $\mathbf{R} o w_i$.
	11	Resolve $\mathbf{R} o w_i$ and pop \mathbf{R} .
b ₂	1	Resolve $L_p \leftarrow w_i$ and pop if p .
b ₃	1	Add i to R .

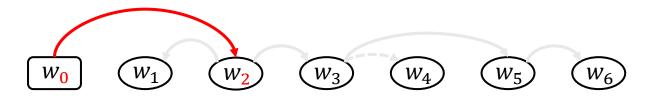


initial state: Labels to buffer and **R** with the root dependency.



- Same as bracketing-encoding.
- L for left arcs (<\)and R right arcs (/>).
- Store i and b_1 .

b_0b_1	00	Add i_0 to L.
	01	Add i_1 to L.
	10	Resolve $\mathbf{R} o w_i$.
	11	Resolve $\mathbf{R} \to w_i$ and pop \mathbf{R} .
b ₂	1	Resolve $L_p \leftarrow w_i$ and pop if p .
b ₃	1	Add i to R .

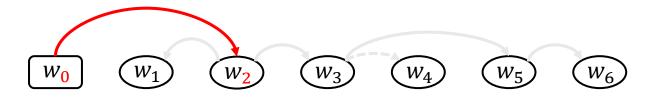


initial state: Labels to buffer and **R** with the root dependency.



- Same as bracketing-encoding.
- L for left arcs (<\)and R right arcs (/>).
- Store i and b_1 .

b ₀ b ₁	00	Add i_0 to L.
	01	Add i_1 to L.
	10	Resolve $\mathbf{R} o w_i$.
	11	Resolve $\mathbf{R} o w_i$ and pop \mathbf{R} .
b ₂	1	Resolve $L_p \leftarrow w_i$ and pop if p .
b ₃	1	Add i to R .

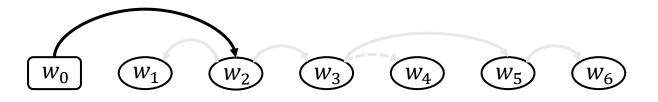


initial state: Labels to buffer and **R** with the root dependency.



- Same as bracketing-encoding.
- L for left arcs (<\)and R right arcs (/>).
- Store i and b_1 .

b_0b_1	00	Add i_0 to L.
	01	Add i_1 to L.
	10	Resolve $\mathbf{R} o w_i$.
	11	Resolve $\mathbf{R} o w_i$ and pop \mathbf{R} .
b ₂	1	Resolve $L_p \leftarrow w_i$ and pop if p .
b ₃	1	Add i to R .

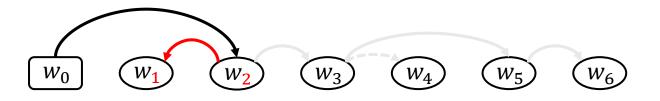


initial state: Labels to buffer and **R** with the root dependency.



- Same as bracketing-encoding.
- L for left arcs (<\)and R right arcs (/>).
- Store i and b_1 .

b ₀ b ₁	00	Add i_0 to L.
	01	Add i_1 to L.
	10	Resolve $\mathbf{R} o w_i$.
	11	Resolve $\mathbf{R} o w_i$ and pop \mathbf{R} .
b ₂	1	Resolve $\mathbf{L}_{\mathbf{p}} \leftarrow w_i$ and pop if \mathbf{p} .
b ₃	1	Add i to R .

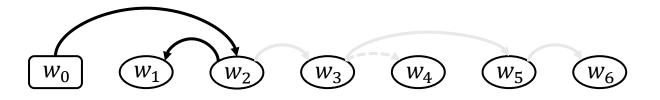


initial state: Labels to buffer and **R** with the root dependency.



- Same as bracketing-encoding.
- L for left arcs (<\)and R right arcs (/>).
- Store i and b_1 .

	00	Add i_0 to L.
	01	Add i_1 to L.
b ₀ b ₁	10	Resolve $\mathbf{R} o w_i$.
	11	Resolve $\mathbf{R} o w_i$ and pop \mathbf{R} .
b ₂	1	Resolve $L_p \leftarrow w_i$ and pop if p .
b ₃	1	Add i to R .

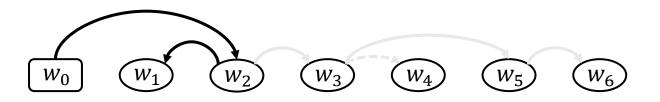


initial state: Labels to buffer and **R** with the root dependency.



- Same as bracketing-encoding.
- L for left arcs (<\)and R right arcs (/>).
- Store i and b_1 .

b ₀ b ₁	00	Add i_0 to L.
	01	Add i_1 to L.
	10	Resolve $\mathbf{R} o w_i$.
	11	Resolve $\mathbf{R} o w_i$ and pop \mathbf{R} .
b ₂	1	Resolve $L_p \leftarrow w_i$ and pop if p .
b ₃	1	Add i to R .

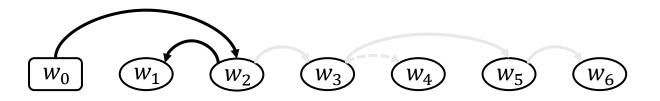


initial state: Labels to buffer and **R** with the root dependency.



- Same as bracketing-encoding.
- L for left arcs (<\)and R right arcs (/>).
- Store i and b_1 .

b_0b_1	00	Add i_0 to L.
	01	Add i_1 to L.
	10	Resolve $\mathbf{R} o w_i$.
	11	Resolve $\mathbf{R} o w_i$ and pop \mathbf{R} .
b ₂	1	Resolve $L_p \leftarrow w_i$ and pop if p .
b ₃	1	Add i to R .

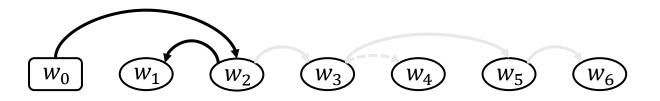


initial state: Labels to buffer and **R** with the root dependency.



- Same as bracketing-encoding.
- L for left arcs (<\)and R right arcs (/>).
- Store i and b_1 .

b_0b_1	00	Add i_0 to L.
	01	Add i_1 to L.
	10	Resolve $\mathbf{R} o w_i$.
	11	Resolve $\mathbf{R} o w_i$ and pop \mathbf{R} .
b ₂	1	Resolve $L_p \leftarrow w_i$ and pop if p .
b ₃	1	Add i to R .

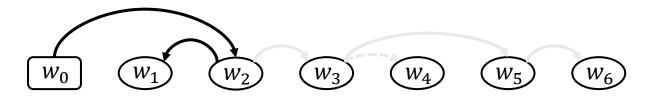


initial state: Labels to buffer and **R** with the root dependency.



- Same as bracketing-encoding.
- L for left arcs (<\)and R right arcs (/>).
- Store i and b_1 .

b_0b_1	00	Add i_0 to L.
	01	Add i_1 to L.
	10	Resolve $\mathbf{R} o w_i$.
	11	Resolve $\mathbf{R} o w_i$ and pop \mathbf{R} .
b ₂	1	Resolve $L_p \leftarrow w_i$ and pop if p .
b ₃	1	Add i to R .



initial state: Labels to buffer and **R** with the root dependency.

L Buffer

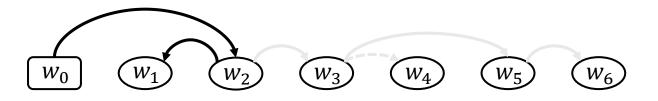
1111 1101 1000 1101 1100

R 2 l_2 l_3 l_4 l_5 l_6



- Same as bracketing-encoding.
- L for left arcs (<\)and R right arcs (/>).
- Store i and b_1 .

b_0b_1	00	Add i_0 to L.
	01	Add i_1 to L.
	10	Resolve $\mathbf{R} o w_i$.
	11	Resolve $\mathbf{R} o w_i$ and pop \mathbf{R} .
b ₂	1	Resolve $L_p \leftarrow w_i$ and pop if p .
b ₃	1	Add i to R .



initial state: Labels to buffer and **R** with the root dependency.

L Buffer

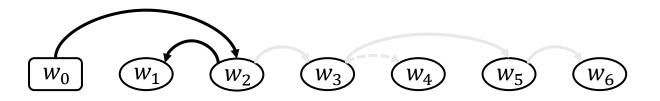
1111 1101 1000 1101 1100

R 2 l_2 l_3 l_4 l_5 l_6



- Same as bracketing-encoding.
- L for left arcs (<\)and R right arcs (/>).
- Store i and b_1 .

b_0b_1	00	Add i_0 to L.
	01	Add i_1 to L.
	10	Resolve $\mathbf{R} o w_i$.
	11	Resolve $\mathbf{R} o w_i$ and pop \mathbf{R} .
b ₂	1	Resolve $L_p \leftarrow w_i$ and pop if p .
b ₃	1	Add i to R .

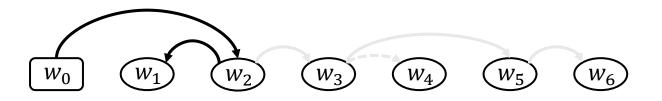


initial state: Labels to buffer and **R** with the root dependency.



- Same as bracketing-encoding.
- L for left arcs (<\)and R right arcs (/>).
- Store i and b_1 .

b ₀ b ₁	00	Add i_0 to L.
	01	Add i_1 to L.
	10	Resolve $\mathbf{R} o w_i$.
	11	Resolve $\mathbf{R} o w_i$ and pop \mathbf{R} .
b ₂	1	Resolve $L_p \leftarrow w_i$ and pop if p .
b ₃	1	Add i to R.



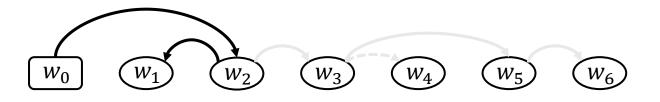
initial state: Labels to buffer and **R** with the root dependency.

L Buffer \leftarrow 1101 1000 1101 1100 R 2 l_2 l_3 l_4 l_5 l_6



- Same as bracketing-encoding.
- L for left arcs (<\)and R right arcs (/>).
- Store i and b_1 .

b ₀ b ₁	00	Add i_0 to L.
	01	Add i_1 to L.
	10	Resolve $\mathbf{R} o w_i$.
	11	Resolve $\mathbf{R} o w_i$ and pop \mathbf{R} .
b ₂	1	Resolve $L_p \leftarrow w_i$ and pop if p .
b ₃	1	Add i to R .



initial state: Labels to buffer and **R** with the root dependency.

L Buffer

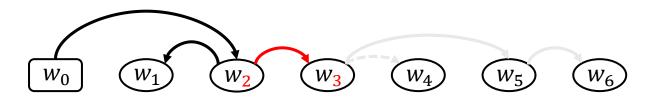
1101 1000 1101 1100

R 2 l_3 l_4 l_5 l_6



- Same as bracketing-encoding.
- L for left arcs (<\)and R right arcs (/>).
- Store i and b_1 .

b_0b_1	00	Add i_0 to L.
	01	Add i_1 to L.
	10	Resolve $\mathbf{R} o w_i$.
	11	Resolve $\mathbf{R} \to w_i$ and pop \mathbf{R} .
b ₂	1	Resolve $L_p \leftarrow w_i$ and pop if p .
b ₃	1	Add i to R .



initial state: Labels to buffer and **R** with the root dependency.

L Buffer

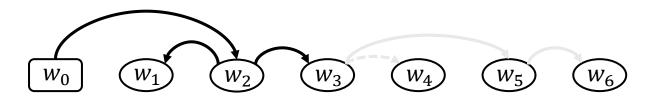
1101 1000 1101 1100

R 2 l_3 l_4 l_5 l_6



- Same as bracketing-encoding.
- L for left arcs (<\)and R right arcs (/>).
- Store i and b_1 .

b ₀ b ₁	00	Add i_0 to L.
	01	Add i_1 to L.
	10	Resolve $\mathbf{R} o w_i$.
	11	Resolve $\mathbf{R} o w_i$ and pop \mathbf{R} .
b ₂	1	Resolve $L_p \leftarrow w_i$ and pop if p .
b ₃	1	Add i to R.



initial state: Labels to buffer and **R** with the root dependency.

L Buffer

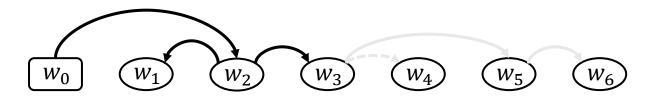
1101 1000 1101 1100

R 2 l_3 l_4 l_5 l_6



- Same as bracketing-encoding.
- L for left arcs (<\)and R right arcs (/>).
- Store i and b_1 .

b ₀ b ₁	00	Add i_0 to L.
	01	Add i_1 to L.
	10	Resolve $\mathbf{R} o w_i$.
	11	Resolve $\mathbf{R} o w_i$ and pop \mathbf{R} .
b ₂	1	Resolve $L_p \leftarrow w_i$ and pop if p .
b ₃	1	Add i to R .

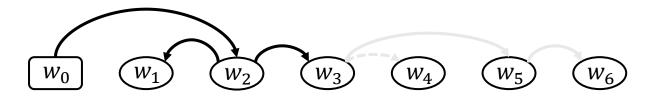


initial state: Labels to buffer and **R** with the root dependency.



- Same as bracketing-encoding.
- L for left arcs (<\)and R right arcs (/>).
- Store i and b_1 .

	00	Add i_0 to L.
	01	Add i_1 to L.
b ₀ b ₁	10	Resolve $\mathbf{R} o w_i$.
	11	Resolve $\mathbf{R} o w_i$ and pop \mathbf{R} .
b ₂	1	Resolve $L_p \leftarrow w_i$ and pop if p .
b ₃	1	Add i to R .



initial state: Labels to buffer and **R** with the root dependency.

L Buffer

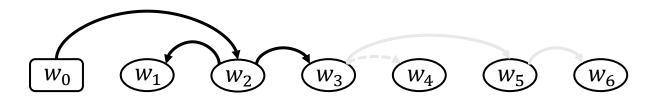
1101 1000 1101 1100

R l_3 l_4 l_5 l_6



- Same as bracketing-encoding.
- L for left arcs (<\)and R right arcs (/>).
- Store i and b_1 .

	00	Add i_0 to L.
	01	Add i_1 to L.
b ₀ b ₁	10	Resolve $\mathbf{R} o w_i$.
	11	Resolve $\mathbf{R} o w_i$ and pop \mathbf{R} .
b ₂	1	Resolve $L_p \leftarrow w_i$ and pop if p .
b ₃	1	Add i to R .

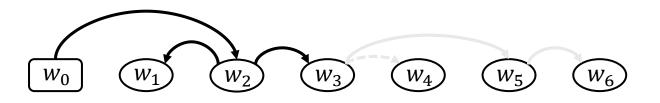


initial state: Labels to buffer and **R** with the root dependency.



- Same as bracketing-encoding.
- L for left arcs (<\)and R right arcs (/>).
- Store i and b_1 .

b ₀ b ₁	00	Add i_0 to L.
	01	Add i_1 to L.
	10	Resolve $\mathbf{R} o w_i$.
	11	Resolve $\mathbf{R} o w_i$ and pop \mathbf{R} .
b ₂	1	Resolve $L_p \leftarrow w_i$ and pop if p .
b ₃	1	Add i to R .



initial state: Labels to buffer and **R** with the root dependency.

L Buffer

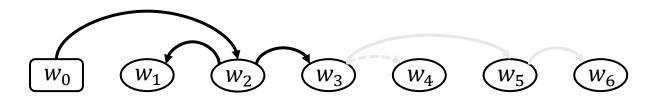
1101 1000 1101 1100

R l_3 l_4 l_5 l_6



- Same as bracketing-encoding.
- L for left arcs (<\)and R right arcs (/>).
- Store i and b_1 .

b ₀ b ₁	00	Add i_0 to L.
	01	Add i_1 to L.
	10	Resolve $\mathbf{R} o w_i$.
	11	Resolve $\mathbf{R} o w_i$ and pop \mathbf{R} .
b ₂	1	Resolve $L_p \leftarrow w_i$ and pop if p .
b ₃	1	Add i to R .



initial state: Labels to buffer and **R** with the root dependency.

L Buffer

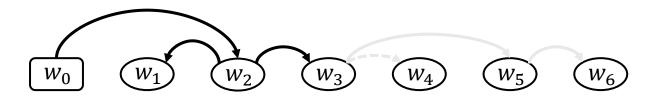
1101 1000 1101 1100

R 3 l_3 l_4 l_5 l_6



- Same as bracketing-encoding.
- L for left arcs (<\)and R right arcs (/>).
- Store i and b_1 .

b ₀ b ₁	00	Add i_0 to L.
	01	Add i_1 to L.
	10	Resolve $\mathbf{R} o w_i$.
	11	Resolve $\mathbf{R} o w_i$ and pop \mathbf{R} .
b ₂	1	Resolve $L_p \leftarrow w_i$ and pop if p .
b ₃	1	Add i to R .



initial state: Labels to buffer and **R** with the root dependency.

L Buffer

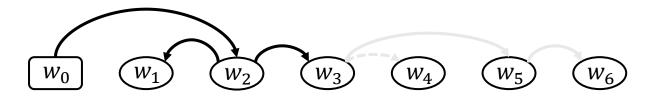
1101 1000 1101 1100

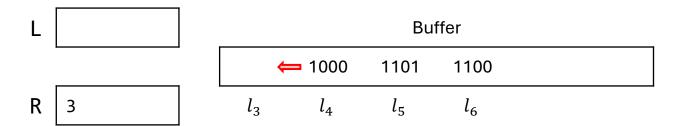
R 3 l_3 l_4 l_5 l_6



- Same as bracketing-encoding.
- L for left arcs (<\)and R right arcs (/>).
- Store i and b_1 .

b ₀ b ₁	00	Add i_0 to L.
	01	Add i_1 to L.
	10	Resolve $\mathbf{R} o w_i$.
	11	Resolve $\mathbf{R} o w_i$ and pop \mathbf{R} .
b ₂	1	Resolve $L_p \leftarrow w_i$ and pop if p .
b ₃	1	Add i to R .

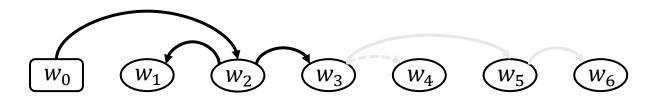






- Same as bracketing-encoding.
- L for left arcs (<\)and R right arcs (/>).
- Store i and b_1 .

b_0b_1	00	Add i_0 to L.
	01	Add i_1 to L.
	10	Resolve $\mathbf{R} o w_i$.
	11	Resolve $\mathbf{R} o w_i$ and pop \mathbf{R} .
b ₂	1	Resolve $L_p \leftarrow w_i$ and pop if p .
b ₃	1	Add i to R .



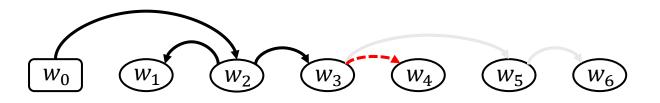
initial state: Labels to buffer and **R** with the root dependency.

L Buffer 1000 1101 1100 R 3 $l_4 l_5 l_6$



- Same as bracketing-encoding.
- L for left arcs (<\)and R right arcs (/>).
- Store i and b_1 .

b ₀ b ₁	00	Add i_0 to L.
	01	Add i_1 to L.
	10	Resolve $\mathbf{R} \to w_i$.
	11	Resolve $\mathbf{R} o w_i$ and pop \mathbf{R} .
b ₂	1	Resolve $L_p \leftarrow w_i$ and pop if p .
b ₃	1	Add i to R .



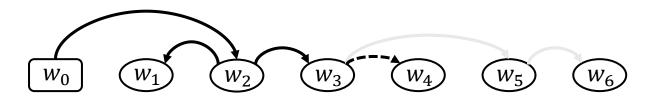
initial state: Labels to buffer and **R** with the root dependency.

L Buffer 1000 1101 1100 R 3 l_4 l_5 l_6



- Same as bracketing-encoding.
- L for left arcs (<\)and R right arcs (/>).
- Store i and b_1 .

b_0b_1	00	Add i_0 to L.
	01	Add i_1 to L.
	10	Resolve $\mathbf{R} o w_i$.
	11	Resolve $\mathbf{R} o w_i$ and pop \mathbf{R} .
b ₂	1	Resolve $L_p \leftarrow w_i$ and pop if p .
b ₃	1	Add i to R .



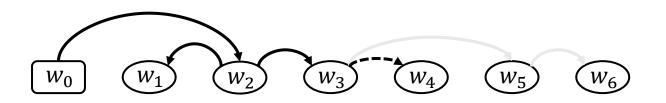
initial state: Labels to buffer and **R** with the root dependency.

L Buffer 1000 1101 1100 R 3 $l_4 l_5 l_6$



- Same as bracketing-encoding.
- L for left arcs (<\)and R right arcs (/>).
- Store i and b_1 .

b_0b_1	00	Add i_0 to L.
	01	Add i_1 to L.
	10	Resolve $\mathbf{R} o w_i$.
	11	Resolve $\mathbf{R} o w_i$ and pop \mathbf{R} .
b ₂	1	Resolve $L_p \leftarrow w_i$ and pop if p .
b ₃	1	Add i to R .

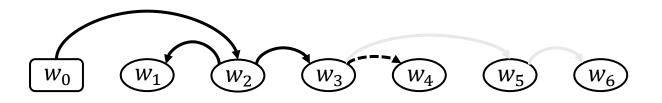


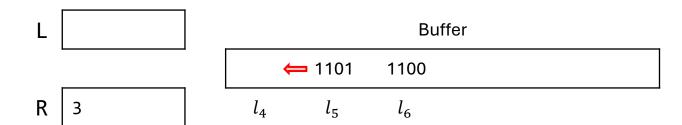
initial state: Labels to buffer and **R** with the root dependency.



- Same as bracketing-encoding.
- L for left arcs (<\)and R right arcs (/>).
- Store i and b_1 .

b ₀ b ₁	00	Add i_0 to L.
	01	Add i_1 to L.
	10	Resolve $\mathbf{R} o w_i$.
	11	Resolve $\mathbf{R} o w_i$ and pop \mathbf{R} .
b ₂	1	Resolve $L_p \leftarrow w_i$ and pop if p .
b ₃	1	Add i to R.

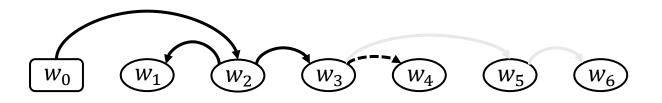






- Same as bracketing-encoding.
- L for left arcs (<\)and R right arcs (/>).
- Store i and b_1 .

b_0b_1	00	Add i_0 to L.
	01	Add i_1 to L.
	10	Resolve $\mathbf{R} o w_i$.
	11	Resolve $\mathbf{R} o w_i$ and pop \mathbf{R} .
b ₂	1	Resolve $L_p \leftarrow w_i$ and pop if p .
b ₃	1	Add i to R .

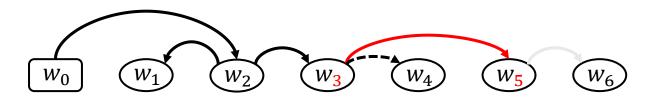


initial state: Labels to buffer and **R** with the root dependency.



- Same as bracketing-encoding.
- L for left arcs (<\)and R right arcs (/>).
- Store i and b_1 .

b ₀ b ₁	00	Add i_0 to L.
	01	Add i_1 to L.
	10	Resolve $\mathbf{R} o w_i$.
	11	Resolve $\mathbf{R} \to w_i$ and pop \mathbf{R} .
b ₂	1	Resolve $L_p \leftarrow w_i$ and pop if p .
b ₃	1	Add i to R.

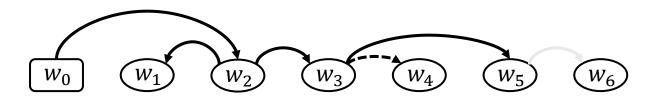


initial state: Labels to buffer and **R** with the root dependency.



- Same as bracketing-encoding.
- L for left arcs (<\)and R right arcs (/>).
- Store i and b_1 .

b ₀ b ₁	00	Add i_0 to L.
	01	Add i_1 to L.
	10	Resolve $\mathbf{R} o w_i$.
	11	Resolve $\mathbf{R} o w_i$ and pop \mathbf{R} .
b ₂	1	Resolve $L_p \leftarrow w_i$ and pop if p .
b ₃	1	Add i to R .

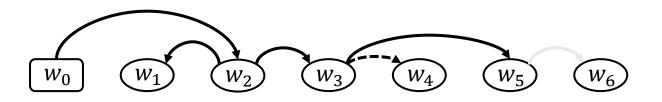


initial state: Labels to buffer and **R** with the root dependency.



- Same as bracketing-encoding.
- L for left arcs (<\)and R right arcs (/>).
- Store i and b_1 .

	00	Add i_0 to L.		
h h	01	Add i_1 to L.		
b ₀ b ₁	10	Resolve $\mathbf{R} o w_i$.		
	11	Resolve $\mathbf{R} o w_i$ and pop \mathbf{R} .		
b ₂	1	Resolve $L_p \leftarrow w_i$ and pop if p .		
b ₃	1	Add i to R .		

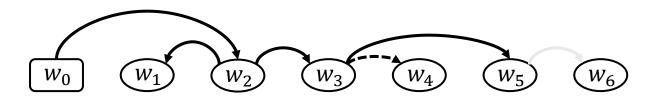


L				Buffer	
		1101	1100		
R		l_5	l_6		



- Same as bracketing-encoding.
- L for left arcs (<\)and R right arcs (/>).
- Store i and b_1 .

	00	Add i_0 to L.		
h h	01	Add i_1 to L.		
b ₀ b ₁	10	Resolve $\mathbf{R} o w_i$.		
	11	Resolve $\mathbf{R} o w_i$ and pop \mathbf{R} .		
b ₂	1	Resolve $L_p \leftarrow w_i$ and pop if p .		
b ₃	1	Add i to R .		

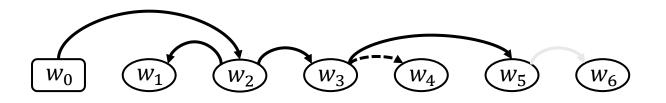


initial state: Labels to buffer and **R** with the root dependency.



- Same as bracketing-encoding.
- L for left arcs (<\)and R right arcs (/>).
- Store i and b_1 .

	00	Add i_0 to L.		
h h	01	Add i_1 to L.		
b ₀ b ₁	10	Resolve $\mathbf{R} o w_i$.		
	11	Resolve $\mathbf{R} o w_i$ and pop \mathbf{R} .		
b ₂	1	Resolve $L_p \leftarrow w_i$ and pop if p .		
b ₃	1	Add i to R .		

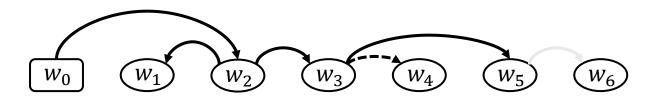


initial state: Labels to buffer and **R** with the root dependency.



- Same as bracketing-encoding.
- L for left arcs (<\)and R right arcs (/>).
- Store i and b_1 .

b ₀ b ₁	00	Add i_0 to L.		
	01	Add i_1 to L.		
	10	Resolve $\mathbf{R} o w_i$.		
	11	Resolve $\mathbf{R} o w_i$ and pop \mathbf{R} .		
b ₂	1	Resolve $L_p \leftarrow w_i$ and pop if p .		
b ₃	1	Add i to R .		



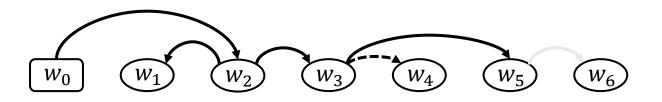
initial state: Labels to buffer and **R** with the root dependency.

L Buffer $1101 \quad 1100$ R $l_5 \qquad l_6$



- Same as bracketing-encoding.
- L for left arcs (<\)and R right arcs (/>).
- Store i and b_1 .

	00	Add i_0 to L.
h h	01	Add i_1 to L.
b ₀ b ₁	10	Resolve $\mathbf{R} o w_i$.
	11	Resolve $\mathbf{R} o w_i$ and pop \mathbf{R} .
b ₂	1	Resolve $L_p \leftarrow w_i$ and pop if p .
b ₃	1	Add i to R .

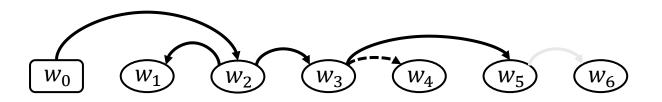


initial state: Labels to buffer and **R** with the root dependency.



- Same as bracketing-encoding.
- L for left arcs (<\)and R right arcs (/>).
- Store i and b_1 .

	00	Add i_0 to L.		
h h	01	Add i_1 to L.		
b ₀ b ₁	10	Resolve $\mathbf{R} o w_i$.		
	11	Resolve $\mathbf{R} o w_i$ and pop \mathbf{R} .		
b ₂	1	Resolve $L_p \leftarrow w_i$ and pop if p .		
b ₃	1	Add i to R .		

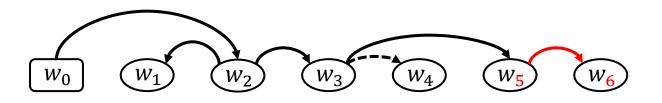


L		Buffer			
		←	– 1100		
R	5	$\overline{l_5}$	l_6		



- Same as bracketing-encoding.
- L for left arcs (<\)and R right arcs (/>).
- Store i and b_1 .

	00	Add i_0 to L.		
h h	01	Add i_1 to L.		
b ₀ b ₁	10	Resolve $\mathbf{R} o w_i$.		
	11	Resolve $\mathbf{R} \to w_i$ and pop \mathbf{R} .		
b ₂	1	Resolve $L_p \leftarrow w_i$ and pop if p .		
b ₃	1	Add i to R .		

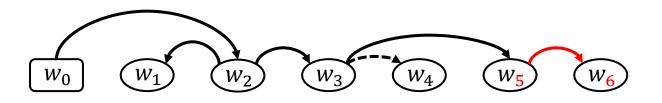


L			Buffer	
		1100		
R	5	l ₆		



- Same as bracketing-encoding.
- L for left arcs (<\)and R right arcs (/>).
- Store i and b_1 .

b ₀ b ₁	00	Add i_0 to L.		
	01	Add i_1 to L.		
	10	Resolve $\mathbf{R} o w_i$.		
	11	Resolve $\mathbf{R} o w_i$ and pop \mathbf{R} .		
b ₂	1	Resolve $L_p \leftarrow w_i$ and pop if p .		
b ₃	1	Add i to R .		

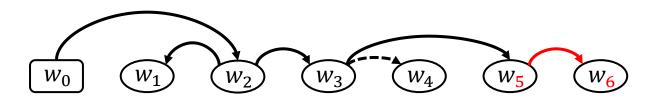


L			Buffer	
		1100		
R	5	l_6		



- Same as bracketing-encoding.
- L for left arcs (<\)and R right arcs (/>).
- Store i and b_1 .

b ₂ b ₃	1 Resolve $L_p \leftarrow w_i$ and pop if p . 1 Add i to R .			
	11	Resolve $\mathbf{R} \to w_i$ and pop \mathbf{R} .		
b ₀ b ₁	10	Resolve $\mathbf{R} \rightarrow w_i$.		
	01	Add i_1 to L.		
	00	Add i_0 to L.		

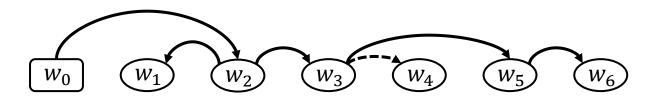


L		Buffer	
	1100		
R	l ₆		



- Same as bracketing-encoding.
- L for left arcs (<\)and R right arcs (/>).
- Store i and b_1 .

b ₀ b ₁	00	Add i_0 to L.		
	01	Add i_1 to L.		
	10	Resolve $\mathbf{R} o w_i$.		
	11	Resolve $\mathbf{R} o w_i$ and pop \mathbf{R} .		
b ₂	b ₂ 1 Resolve $L_p \leftarrow w_i$ and pop if p .			
b ₃	1	Add i to R.		

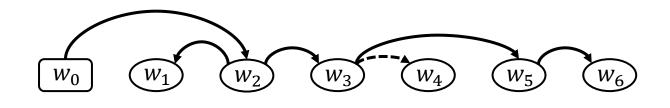


L		Buffer	
	1100		
R	l_6		



- Same as bracketing-encoding.
- L for left arcs (<\)and R right arcs (/>).
- Store i and b_1 .

b ₀ b ₁	00	Add i_0 to L.		
	01	Add i_1 to L.		
	10	Resolve $\mathbf{R} o w_i$.		
	11	Resolve $\mathbf{R} o w_i$ and pop \mathbf{R} .		
b ₂	$\mathbf{b_2}$ 1 Resolve $\mathbf{L_p} \leftarrow w_i$ and pop if \mathbf{p} .			
b ₃	1	Add i to R.		



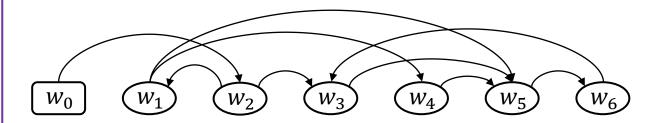
5				
L			Buffer	
R		l_6		

Assumptions:

- Distribute the arcs in relaxed 1-planar graphs.
- For each node limit one head per direction.
- Encode each label ℓ_i with 6 bits: $b_0b_1b_2b_3b_4b_5$.

b ₀	w_i has a left head.
b ₁	w_i is the outermost right dependent.
b ₂	w_i has right dependents.
b ₃	w_i has a right head.
b ₄	w_i is the outermost left dependent.
b ₅	w_i has left dependents.

Step 1: Distribute the arcs in relaxed 1-planar graphs.



- Distribute the arcs in **relaxed 1-planar graphs**.
- For each node limit one head per direction.
- Encode each label ℓ_i with 6 bits: $b_0b_1b_2b_3b_4b_5$.

_		
	b ₀	w_i has a left head.
	b ₁	w_i is the outermost right dependent.
Ī	b ₂	w_i has right dependents.
Ī	b ₃	w_i has a right head.
Ī	b ₄	w_i is the outermost left dependent.
Ī	b ₅	w_i has left dependents.

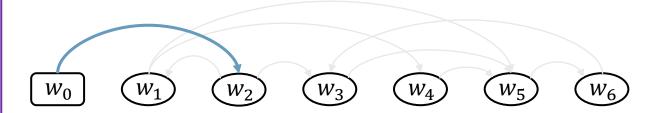
Step 1: Distribute the arcs in relaxed 1-planar graphs.



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b ₅	w_i has left dependents.

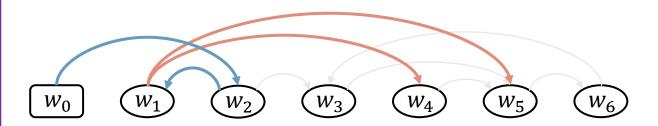
Step 1: Distribute the arcs in relaxed 1-planar graphs.



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b ₄	w_i is the outermost left dependent.
b ₅	w_i has left dependents.

Step 1: Distribute the arcs in relaxed 1-planar graphs.



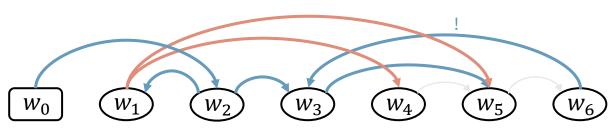
Assumptions:

- Distribute the arcs in relaxed 1-planar graphs.
- For each node limit one head per direction.
- Encode each label ℓ_i with 6 bits: $b_0b_1b_2b_3b_4b_5$.

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b ₁	w_i is the outermost right dependent.
b ₂	w_i has right dependents.
b ₃	w_i has a right head.
b ₄	w_i is the outermost left dependent.
b ₅	w_i has left dependents.

Step 1: Distribute the arcs in relaxed 1-planar graphs.

Allow one head per direction



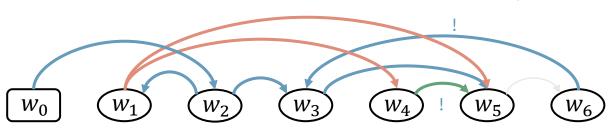
Assumptions:

- Distribute the arcs in **relaxed 1-planar graphs**.
- For each node limit one head per direction.
- Encode each label ℓ_i with 6 bits: $b_0b_1b_2b_3b_4b_5$.

b ₀	w_i has a left head.
b ₁	w_i is the outermost right dependent.
b ₂	w_i has right dependents.
b ₃	w_i has a right head.
b ₄	w_i is the outermost left dependent.
b ₅	w_i has left dependents.

Step 1: Distribute the arcs in relaxed 1-planar graphs.

Allow one head per direction

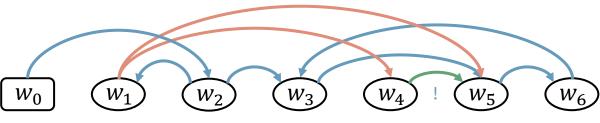


Assumptions:

- Distribute the arcs in relaxed 1-planar graphs.
- For each node limit one head per direction.
- Encode each label ℓ_i with 6 bits: $b_0b_1b_2b_3b_4b_5$.

b ₀	w_i has a left head.
b ₁	w_i is the outermost right dependent.
b ₂	w_i has right dependents.
b ₃	w_i has a right head.
b ₄	w_i is the outermost left dependent.
b ₅	w_i has left dependents.

Step 1: Distribute the arcs in relaxed 1-planar graphs.

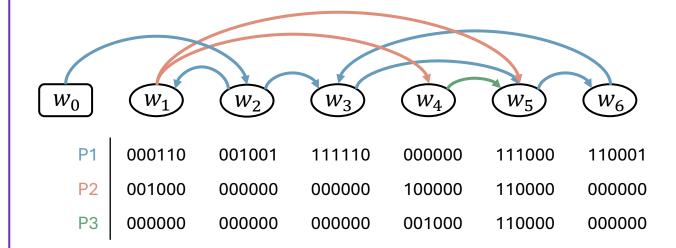


Allow one head per direction

- Distribute the arcs in relaxed 1-planar graphs.
- For each node limit one head per direction.
- Encode each label ℓ_i with 6 bits: $b_0b_1b_2b_3b_4b_5$.

b ₀	w_i has a left head.
b ₁	w_i is the outermost right dependent.
b ₂	w_i has right dependents.
b ₃	w_i has a right head.
b ₄	w_i is the outermost left dependent.
b ₅	w_i has left dependents.

Step 2: Assign labels.

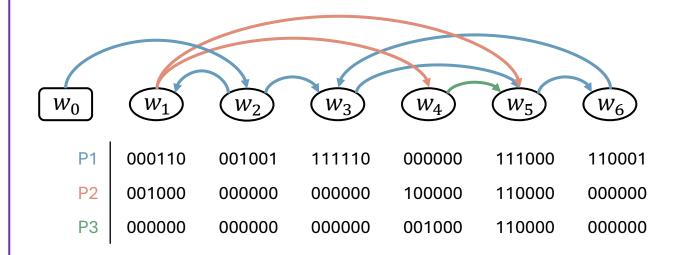


Assumptions:

- Distribute the arcs in relaxed 1-planar graphs.
- For each node limit one head per direction.
- Encode each label ℓ_i with 6 bits: $b_0b_1b_2b_3b_4b_5$.

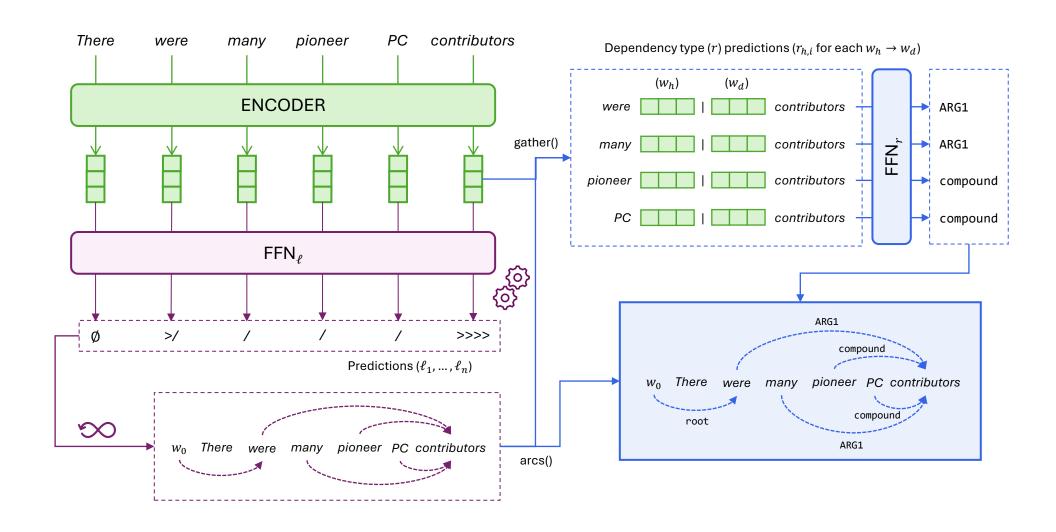
b ₀	w_i has a left head.
b ₁	w_i is the outermost right dependent.
b ₂	w_i has right dependents.
b ₃	w_i has a right head.
b ₄	w_i is the outermost left dependent.
b ₅	w_i has left dependents.

Step 2: Assign labels.



 ∞ Same as 4k-bit encoding!

Encoder-Decoder Architecture



Experiments

Encoders:

- 4-layered BiLSTM.
- XLM-RoBERTa (Conneau et al., 2020).
- XLNet (Yang et al., 2019).

Decoders:

- Absolute (A) and relative (R).
- Bracketing (B) with $k \in \{2,3\}$.
- 4k-bit (B4) with $k \in \{2,3,4\}$.
- 6k-bit (B6) with $k \in \{2,3,4\}$.

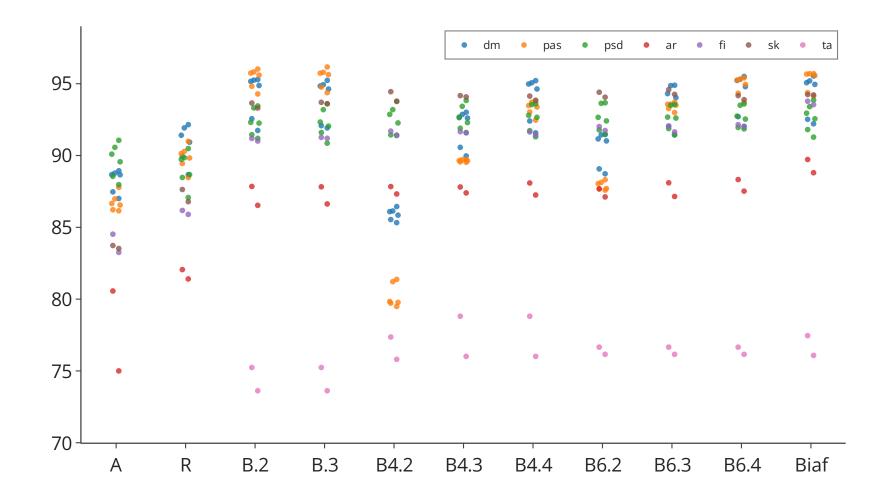
Evaluation

- SemEval 2015 Task 18 and IWPT-2021 Shared Task.
- UF and LF score.
- Biaffine baseline (<u>Dozat & Manning</u>, 2018).
- Coverage (score with gold labels).

Results

Performance

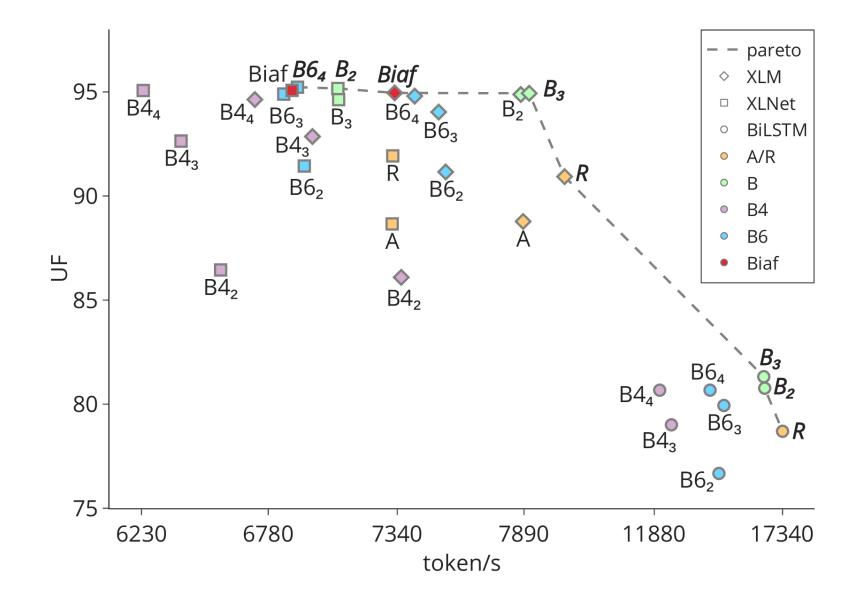
- Worst performance with A and B.
- B2 and B3 reach a similar performance to Biaf.
- Clear improvement increasing k.



Results

Speed

- Faster decoding for A and R.
- B4.k is slower than Biaf (likely due to the extra arcs generated).
- B6.k and B.k offer a trade-off between accuracy and speed.



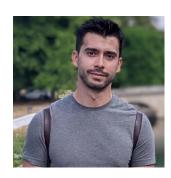
Conclusions

- Several bounded and unbounded linearizations are proposed for graph parsing.
- Multilingual benchmark.
- SL algorithms and graph-based parsers have similar performance.
- SL is a faster and more efficient alternative to graph-based models.
- Hyperparameter k must be configured for bracket and bit encodings.

Thanks for listening!



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