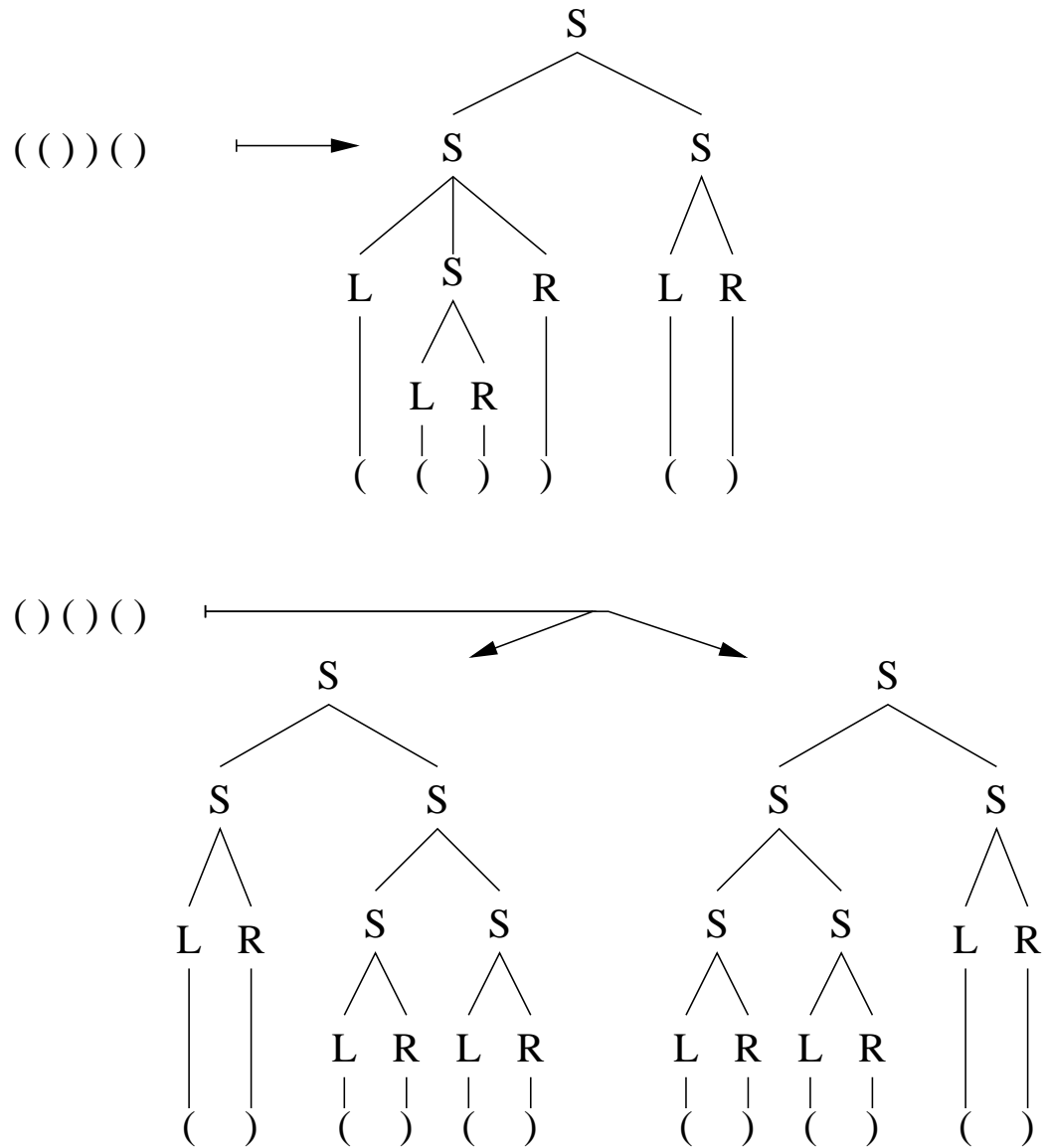
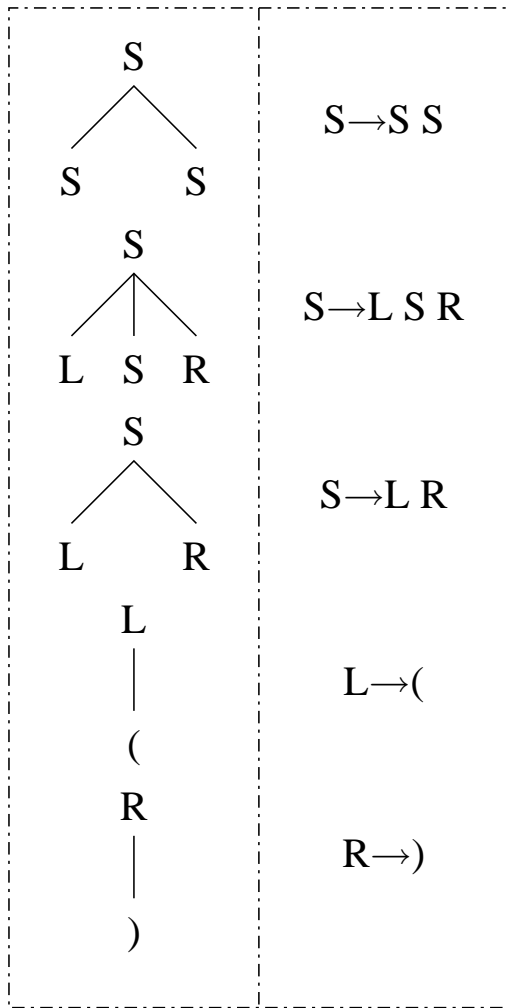


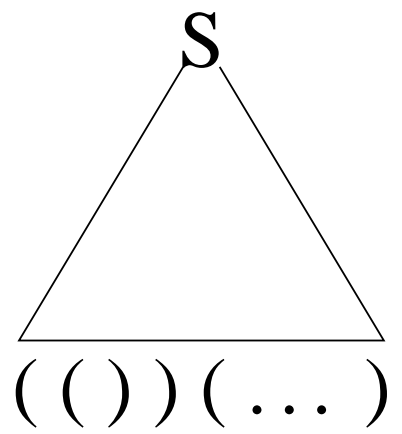
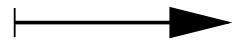
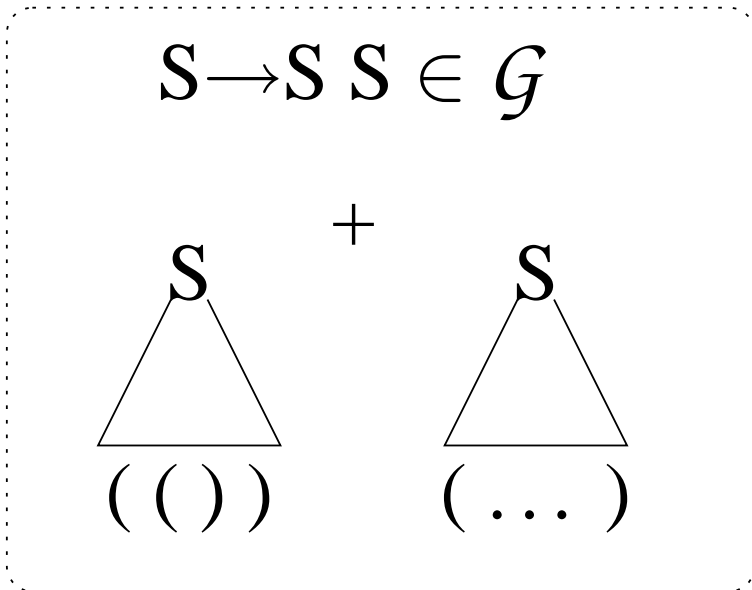
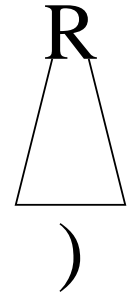
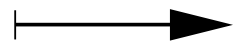
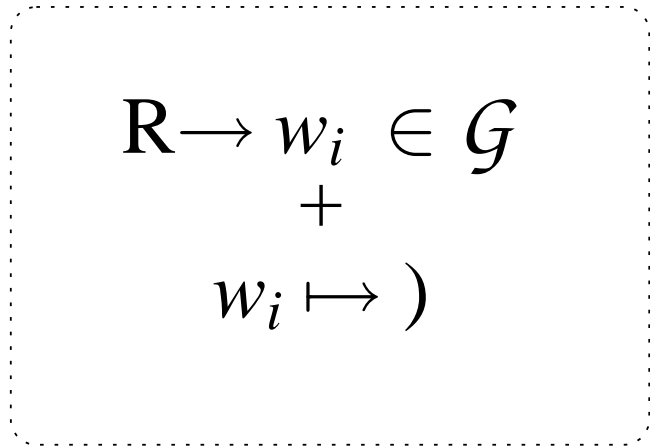
# A Parallel Extension of Earley's Parsing Algorithm

Greg Sandstrom  
CS Senior Seminar

# What is parsing?



# CKY Algorithm as Dynamic Programming



# Inference Rules for CKY Algorithm

**Item:**  $[A, i, j]$   $A \Rightarrow w_i \dots w_{j-1}$

**Rules:**

Scan  $[A, i, i + 1]$   $A \rightarrow w_i$

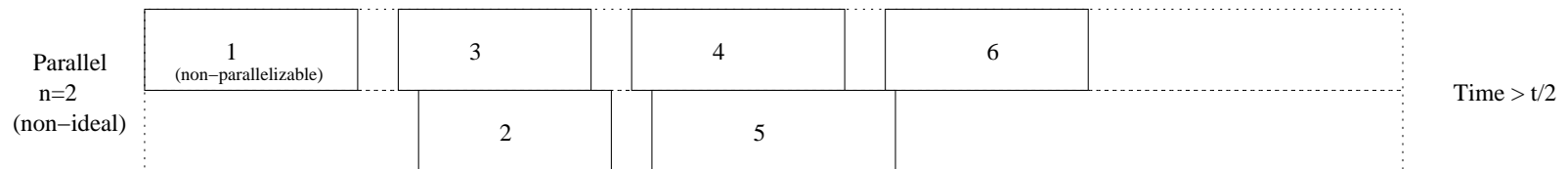
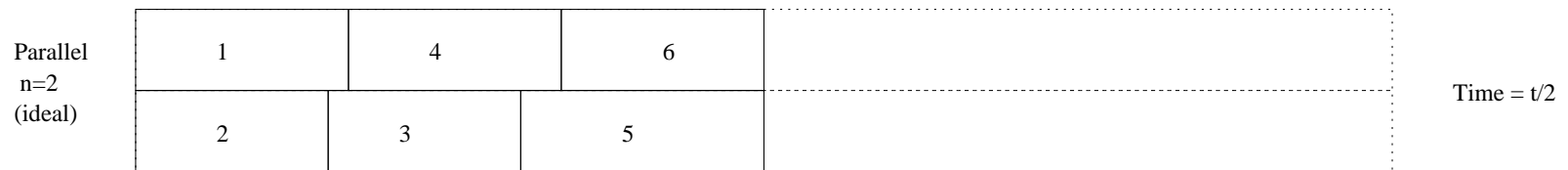
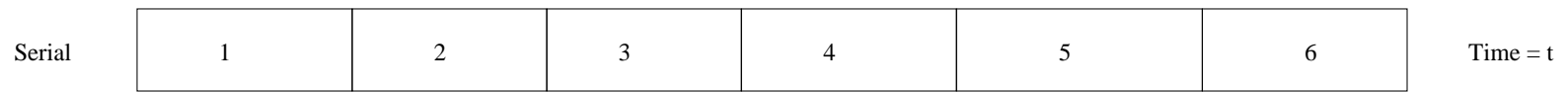
Complete  $\frac{[B, i, k] [C, k, j]}{[A, i, j]}$   $A \rightarrow BC \in \mathcal{G}$

$\mathcal{G}$  :  
*Sentence*  $\rightarrow$  *NP Verb*  
*NP*  $\rightarrow$  *Det Noun*  
*Det*  $\rightarrow$  The  
*Noun*  $\rightarrow$  Man  
*Verb*  $\rightarrow$  Runs

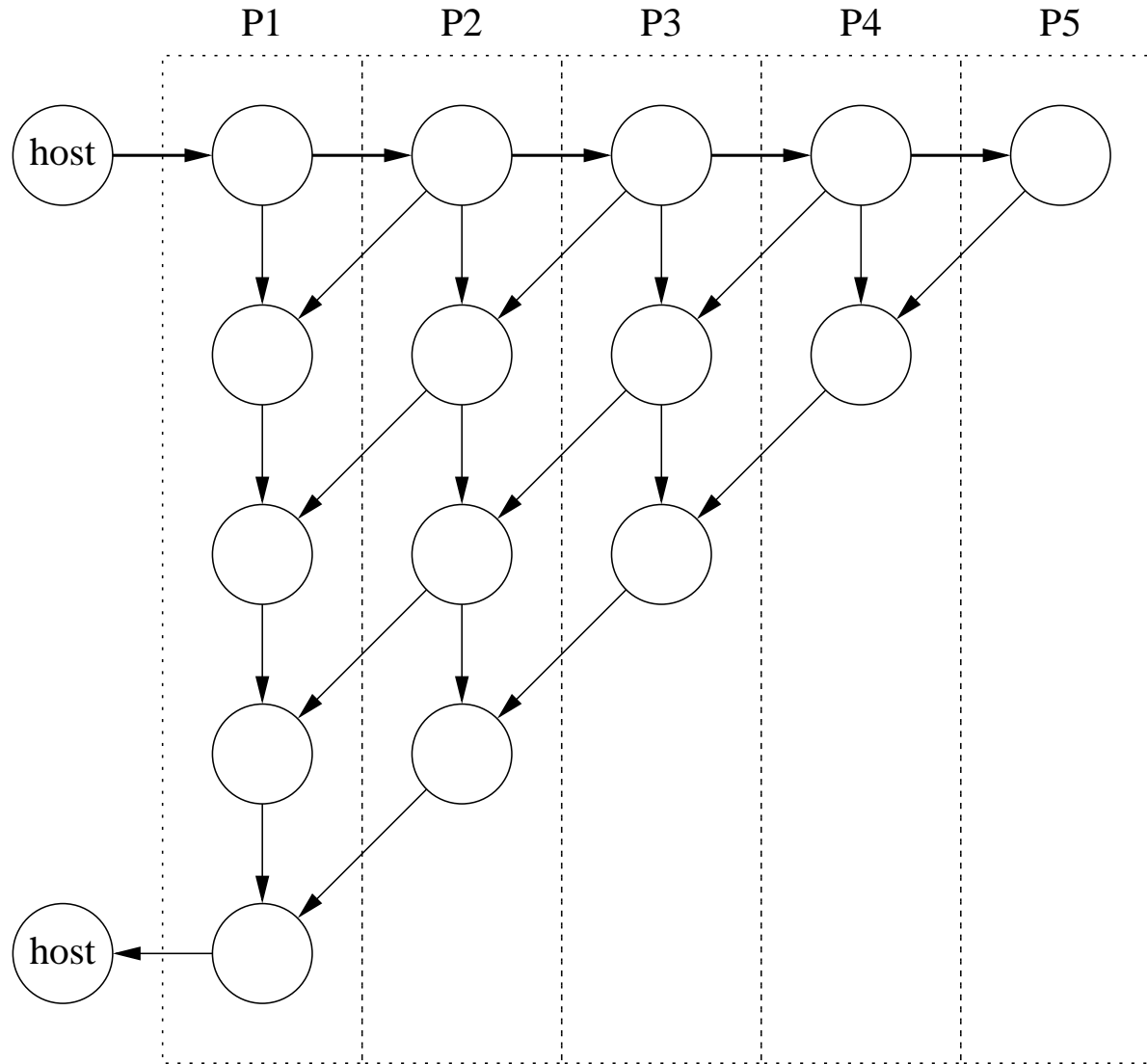
Scan	<u>The</u>		<u>Man</u>		<u>Runs</u>
Complete	<u>[Det, 0, 1]</u>		<u>[Noun, 1, 2]</u>		<u>[Verb, 2, 3]</u>
Complete	<u>[NP, 0, 2]</u>				
	<u>[Sentence, 0, 3]</u>				



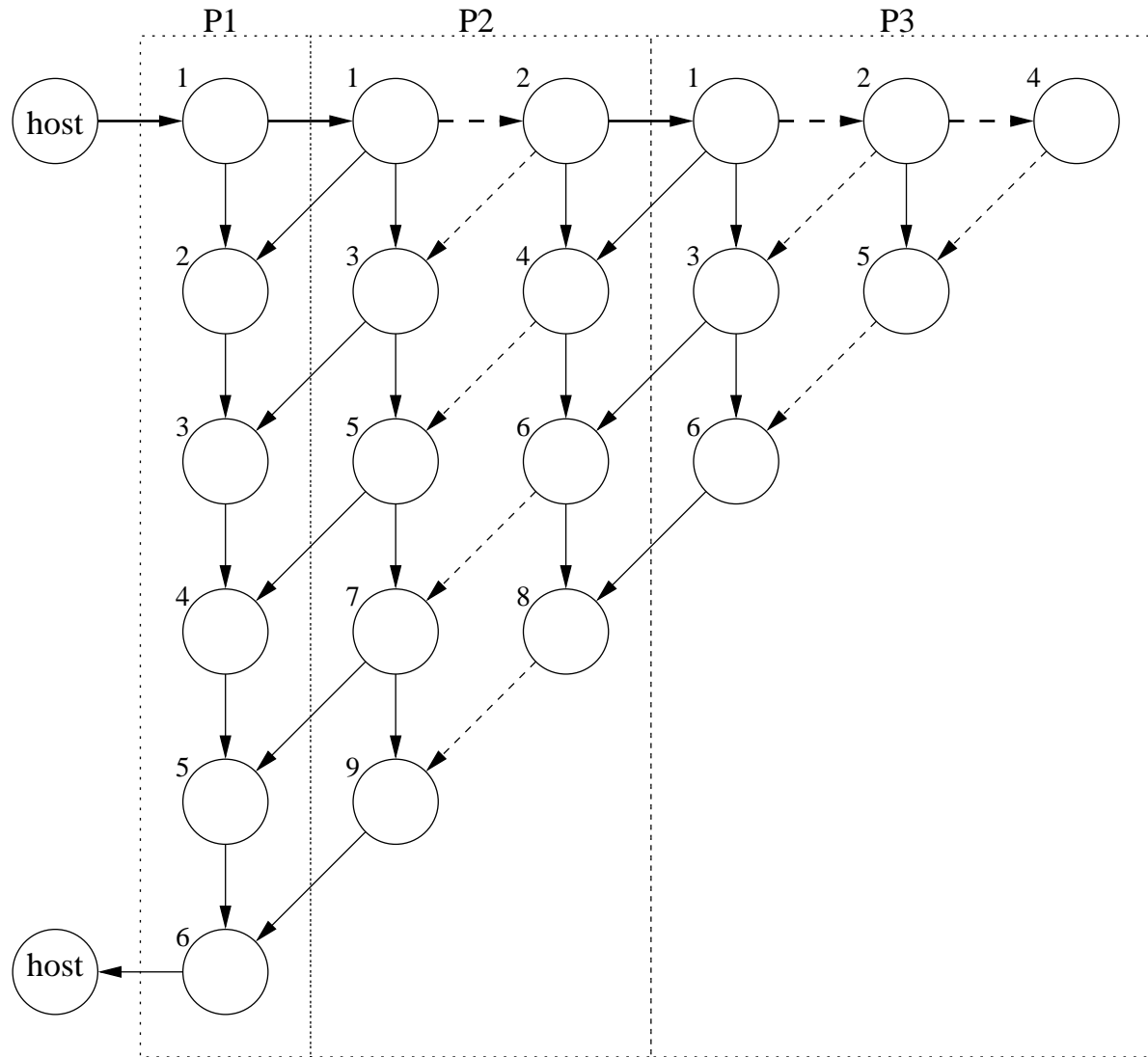
# Parallelization



# Hill & Wayne's Original Parallel CKY Algorithm



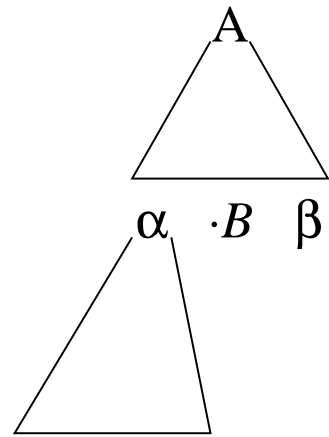
# Hill & Wayne's Improved Parallel CKY Algorithm



# Earley's Algorithm

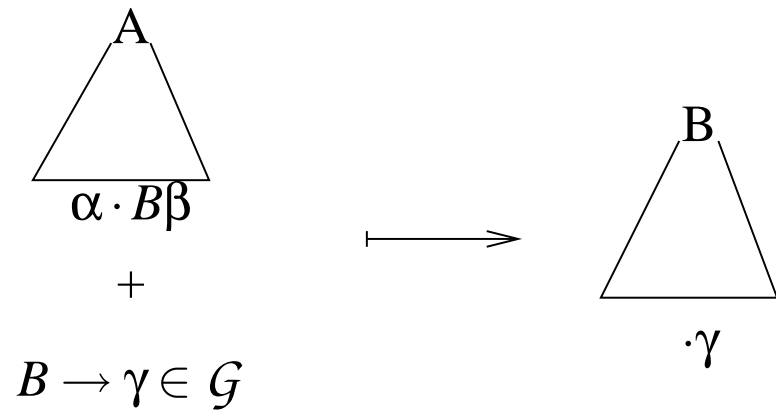
The dotted rule:

$$[i, A \rightarrow \alpha \cdot B \beta, j]$$



$w_i \dots w_{j-1}.$

Prediction:



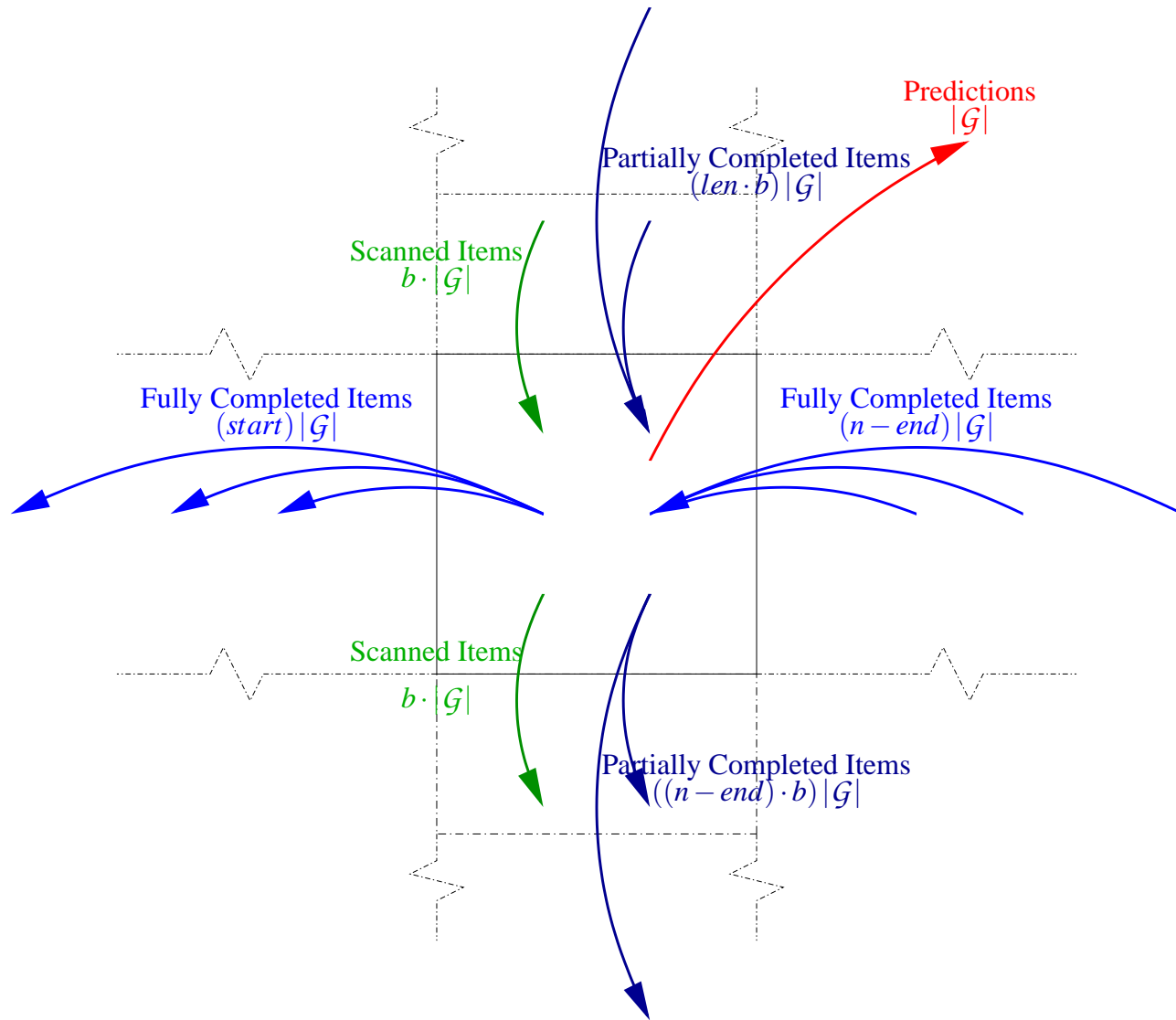
## Inference Rules For Earley's Algorithm

<b>Item:</b>	$[i, A \rightarrow \alpha \cdot B\beta, j]$	$A \rightarrow \alpha B\beta \in \mathcal{G}$ $\alpha \Rightarrow w_i \dots w_{j-1}$
<b>Rules:</b>		
Scan	$\frac{[i, A \rightarrow \alpha \cdot a\beta, j]}{[i, A \rightarrow \alpha a \cdot \beta, j + 1]}$	$a = w_j$
Predict	$\frac{[i, A \rightarrow \alpha \cdot C\beta, j]}{[j, C \rightarrow \cdot \gamma, j]}$	$C \rightarrow \gamma \in \mathcal{G}$
Complete	$\frac{[i, A \rightarrow \alpha \cdot C\beta, k] \quad [k, C \rightarrow \gamma \cdot, j]}{[i, A \rightarrow \alpha C \cdot \beta, j]}$	$i \leq k \leq j \leq n$

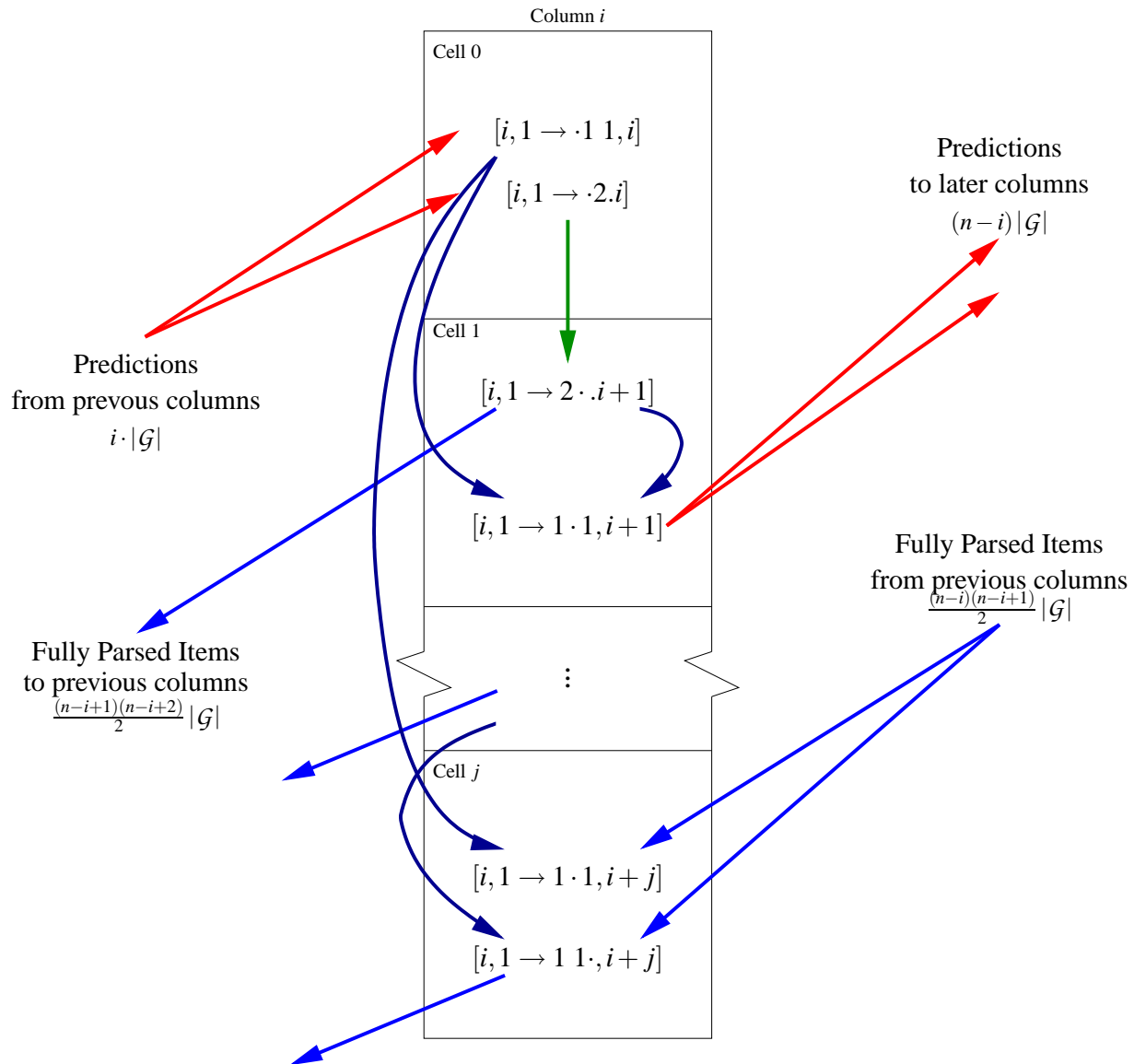
# Earley Table

(	)	(	)
[0,S→· S S,0]	[1,S→· S S,1]	[2,S→· S S,2]	[3,S→· S S,3]
[0,S→· L S R,0]	[1,S→· L S R,1]	[2,S→· L S R,2]	[3,S→· L S R,3]
[0,S→· L R,0]	[1,S→· L R,1]	[2,S→· L R,2]	[3,S→· L R,3]
[0,L→· (,0]	[1,R→· ),1]	[2,L→· (,2]	[3,R→· ),3]
[0,L→(·,1]		[2,L→(·,3]	
[0,S→L· S R,1]	[1,R→)·,2]	[2,S→L· S R,3]	[3,R→)·,4]
[0,S→L· R,1]		[2,S→L· R,3]	
[0,S→L R·,2]		[2,S→L R·,4]	
[0,S→· S S,2]		[2,S→· S S,4]	
[0,S→ S S,4]			

# Worst Case Message Analysis



# Per-Column Parallel Earley Communications Map



# Performance Analysis for Fully Ambiguous Grammar

Length=16

Processors	Runtime	Speedup	Efficiency
1	1.73 s	1	100%
2	1.49 s	1.16	57.95%
4	1.21 s	1.43	35.76%
8	0.8 s	2.17	27.13%
16	0.79 s	2.19	13.68%

Length=32

Processors	Runtime	Speedup	Efficiency
1	7.99 s	1	100%
2	4.98 s	1.61	80.25%
4	2.78 s	2.88	71.97%
8	1.56 s	5.11	63.91%
16	1.03 s	7.77	48.55%

Length=48

2	11.31 s	1	100% <sup>1</sup>
4	5.92 s	1.91	95.52%
8	3.22 s	3.51	87.84%
16	2.1 s	5.38	67.21%

Length=64

2	31.74 s	1	100% <sup>1</sup>
4	15.58 s	2.04	101.84%
8	8.45 s	3.76	93.91%
16	4.66 s	6.81	85.18%

Length=128

4	916.75 s	1	100% <sup>1</sup>
8	464.23 s	1.97	98.84%
16	232.6 s	3.94	98.53%

footnote<sup>1</sup>: speedup and efficiency based on least processors tested.

## **Possibilities for Future Work**

- Reduce communication overhead to communication payload ratio.
- Group columns together as per Hill & Wayne.