

# An Introduction to Algorithms

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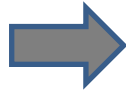
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Intro



Complexity



Data Structure



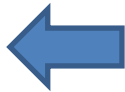
Trees



Hash Functions



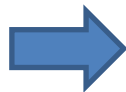
Sorting



Dynamic  
Programming



Greedy Algorithm



Misc Graph/Tree  
Algorithms

# Languages

# Languages

A language is a set of **strings**

**String:** A sequence of letters

Examples: **“cat”, “dog”, “house”, ...**

Defined over an alphabet:

$$\Sigma = \{a, b, c, \dots, z\}$$

# Alphabets and Strings

We will use small alphabets:  $\Sigma = \{a, b\}$

Strings <sup>*a*</sup>

*ab*

$u = ab$

*abba*

$v = bbbaaa$

*baba*

$w = abba$

*aaabbbbaabab*

# Grammars

# Grammars

Grammars express languages

Example: **the English language**

$$\langle sentence \rangle \rightarrow \langle noun\_phrase \rangle \langle predicate \rangle$$
$$\langle noun\_phrase \rangle \rightarrow \langle article \rangle \langle noun \rangle$$

$\langle \textit{article} \rangle \rightarrow a$

$\langle \textit{article} \rangle \rightarrow \textit{the}$

$\langle \textit{noun} \rangle \rightarrow \textit{boy}$

$\langle \textit{noun} \rangle \rightarrow \textit{dog}$

$\langle \textit{verb} \rangle \rightarrow \textit{runs}$

$\langle \textit{verb} \rangle \rightarrow \textit{walks}$



A derivation of “the boy walks”:

$\langle sentence \rangle \Rightarrow \langle noun\_phrase \rangle \langle predicate \rangle$   
 $\Rightarrow \langle noun\_phrase \rangle \langle verb \rangle$   
 $\Rightarrow \langle article \rangle \langle noun \rangle \langle verb \rangle$   
 $\Rightarrow the \langle noun \rangle \langle verb \rangle$   
 $\Rightarrow the \ boy \langle verb \rangle$   
 $\Rightarrow the \ boy \ walks$

A derivation of “a dog runs”:

$\langle sentence \rangle \Rightarrow \langle noun\_phrase \rangle \langle predicate \rangle$   
 $\Rightarrow \langle noun\_phrase \rangle \langle verb \rangle$   
 $\Rightarrow \langle article \rangle \langle noun \rangle \langle verb \rangle$   
 $\Rightarrow a \langle noun \rangle \langle verb \rangle$   
 $\Rightarrow a \text{ dog } \langle verb \rangle$   
 $\Rightarrow a \text{ dog runs}$

Language of the grammar:

$$L = \{ \text{"a boy runs"}, \\ \text{"a boy walks"}, \\ \text{"the boy runs"}, \\ \text{"the boy walks"}, \\ \text{"a dog runs"}, \\ \text{"a dog walks"}, \\ \text{"the dog runs"}, \\ \text{"the dog walks"} \}$$

# Notation

$\langle noun \rangle \rightarrow boy$

$\langle noun \rangle \rightarrow dog$

Variable  
or  
Non-terminal



Production  
rule

Terminal

# Another Example

$$S \rightarrow aSb$$

Grammar:  $S \rightarrow \lambda$

Derivation of sentence  $ab$ :

$$S \Rightarrow aSb \Rightarrow ab$$
$$S \rightarrow aSb \qquad S \rightarrow \lambda$$

Grammar:  $S \rightarrow aSb$   
 $S \rightarrow \lambda$

Derivation of sentence  $aabb$

$S \Rightarrow aSb \Rightarrow aaSbb \Rightarrow aabb$

$S \rightarrow aSb$        $S \rightarrow \lambda$

Other derivations:

$$S \Rightarrow aSb \Rightarrow aaSbb \Rightarrow aaaSbbb \Rightarrow aaabbbb$$

$$\begin{aligned} S &\Rightarrow aSb \Rightarrow aaSbb \Rightarrow aaaSbbb \\ &\Rightarrow aaaaSbbbb \Rightarrow aaabbbbb \end{aligned}$$

Language of the grammar

$$S \rightarrow aSb$$

$$S \rightarrow \lambda$$

$$L = \{a^n b^n : n \geq 0\}$$



## Example

$$S \rightarrow Ab$$

For grammar  $G$ :

$$A \rightarrow aAb$$

$$A \rightarrow \lambda$$

$$L(G) = \{???\}$$

## Example

$$S \rightarrow Ab$$

For grammar  $G$ :

$$A \rightarrow aAb$$

$$A \rightarrow \lambda$$

$$L(G) = \{a^n b^n b : n \geq 0\}$$

Since:  $S \xRightarrow{*} a^n b^n b$

A grammar

$$G : \quad S \rightarrow aSb$$

$$S \rightarrow SS$$

$$S \rightarrow \lambda$$

A derivation:

$$S \Rightarrow SS \Rightarrow aSbS \Rightarrow abS \Rightarrow abaSb \Rightarrow abab$$

$$S \rightarrow aSb$$

$$S \rightarrow SS$$

$$S \rightarrow \lambda$$

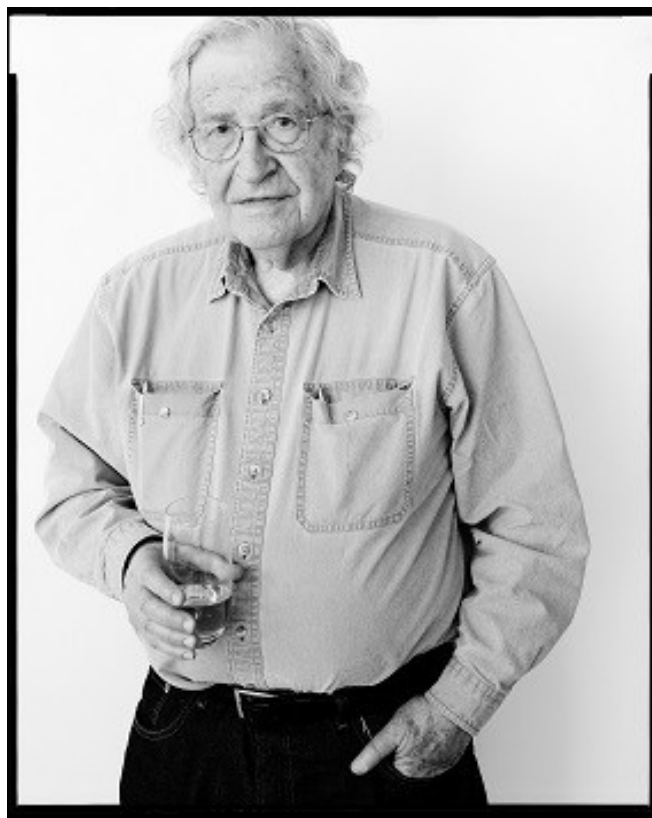
$$L(G) = \{w : n_a(w) = n_b(w),$$

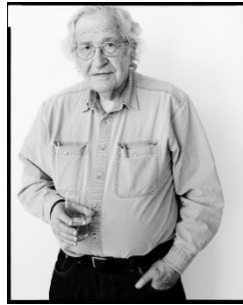
and  $n_a(v) \geq n_b(v)$

in any prefix  $v\}$

$() ((( ))) (( ))$

# Chomsky Normal Form



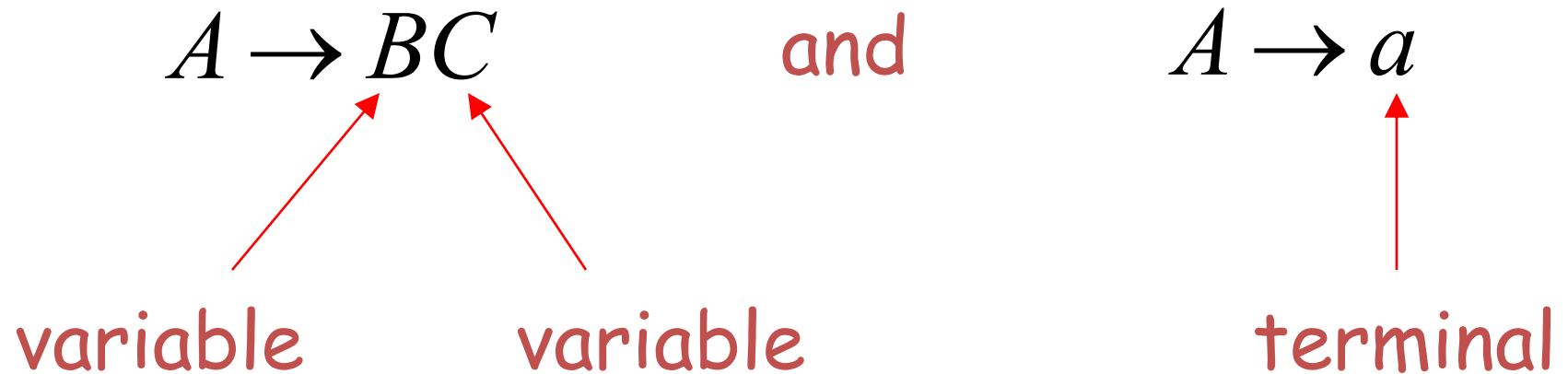


**Avram Noam Chomsky** (/ˈnoʊm ˈtʃɒmski/; born December 7, 1928) is an American linguist, philosopher, cognitive scientist, historian, logician, social critic, and political activist. Sometimes described as "the father of modern linguistics," Chomsky is also a major figure in analytic philosophy, and one of the founders of the field of cognitive science. He has spent more than half a century at the Massachusetts Institute of Technology (MIT), where he is Institute Professor Emeritus, and is the author of over 100 books on topics such as linguistics, war, politics, and mass media. Ideologically, he aligns with anarcho-syndicalism and libertarian socialism.

Noam Chomsky: The United States, Not Iran, Poses  
Greatest Threat to World Peace

# Chomsky Normal Form

All productions have form:



## Examples:

$$S \rightarrow AS$$

$$S \rightarrow a$$

$$A \rightarrow SA$$

$$A \rightarrow b$$

Chomsky  
Normal Form

$$S \rightarrow AS$$

$$S \rightarrow AAS$$

$$A \rightarrow SA$$

$$A \rightarrow aa$$

Not Chomsky  
Normal Form



# The CYK Membership Algorithm

(J. Cocke, D. H. Younger, and T. Kasami)

## Input:

- Grammar  $G$  in Chomsky Normal Form
- String  $w$

## Output:

find if  $w \in L(G)$

# Construction: Dynamic Programming

$$w = a_1 a_2 \dots a_n$$

$$w[i, j] = a_i a_{i+1} \dots a_j$$

$$V[i, j] = \{A \in V : A \Rightarrow_G^* w[i, j]\}$$

$$A \Rightarrow_G^* w[i, j]$$

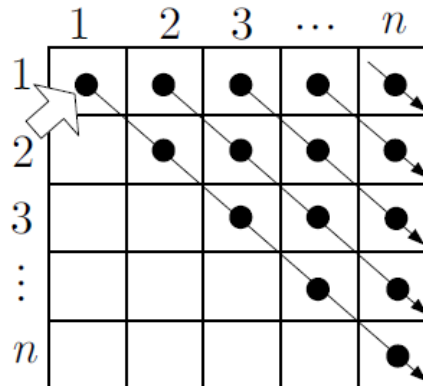
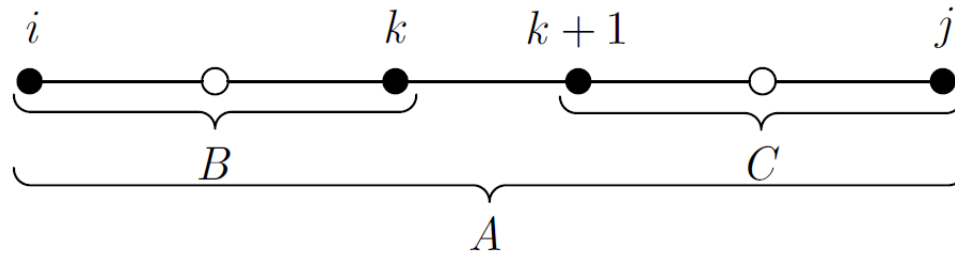
$$A \rightarrow BC \qquad B \Rightarrow^* w[i, k] \qquad C \Rightarrow^* w[k + 1, j]$$

$$i \leq k < j$$

# Construction: Dynamic Programming

$$V[i, i] = \{A \in V : A \rightarrow a_i\}$$

$$V[i, j] = \bigcup_{i \leq k < j} \{A : A \rightarrow BC, B \in V[i, k] \wedge C \in V[k+1, j]\}$$



$$w \in L(G) \Leftrightarrow S \in V[1, n]$$

# The Algorithm

Input example:

- Grammar  $G$ :
  - $S \rightarrow AB$
  - $A \rightarrow BB$
  - $A \rightarrow a$
  - $B \rightarrow AB$
  - $B \rightarrow b$
- String  $w$ :  $aabbbb$

*aabbbb*

$$V[i, i] = \{A \in V : A \rightarrow a_i\}$$

a            a            b            b            b

aa           ab           bb           bb

aab           abb           bbb

aabb           abbb

aabbb

$$S \rightarrow AB$$

$$V[i, i] = \{A \in V : A \rightarrow a_i\}$$

$$A \rightarrow BB$$

$$A \rightarrow a$$

$$B \rightarrow AB$$

$$B \rightarrow b$$

a	a	b	b	b
---	---	---	---	---

A	A	B	B	B
---	---	---	---	---

---

aa	ab	bb	bb
----	----	----	----

aab	abb	bbb
-----	-----	-----

aabb	abbb
------	------

aabbb

$$S \rightarrow AB$$

$$V[i, j] = \bigcup_{i \leq k < j} \{A : A \rightarrow BC, B \in V[i, k] \wedge C \in V[k + 1, j]\}$$

$$A \rightarrow BB$$

$$A \rightarrow a$$

$$B \rightarrow AB$$

$$B \rightarrow b$$

a	a	b	b	b
A	A	B	B	B
<hr/>				
aa	ab	bb	bb	
	S,B	A	A	
<hr/>				
aab	abb	bbb		
aabb	abbb			
aabbb				

$S \rightarrow AB$

$A \rightarrow BB$

$A \rightarrow a$

$B \rightarrow AB$

$B \rightarrow b$

a

a

b

b

b

A

A

B

B

B

---

aa

ab

bb

bb

S,B

A

A

---

aab

abb

bbb

S,B

A

S,B

---

aabb

abbb

A

S,B

---

aabbb

S,B



Therefore:  $aabbb \in L(G)$

Time Complexity:  $|w|^3$

Observation: The CYK algorithm can be easily converted to a parser



# Quiz 1



- Grammar G:
  - $S \rightarrow AB \mid BC$
  - $A \rightarrow BA \mid a$
  - $B \rightarrow CC \mid b$
  - $C \rightarrow AB \mid a$

Question Is **ababa** in  $L(G)$ ? Use dynamic programming.

# Quiz 2

Productions;

- $S \rightarrow AA | AS | b$
- $A \rightarrow SA | AS | a$

Input string; abaab(n=5)

- Is input string generated by Grammar G?