

SYNTAX



Matt Post
IntroHLT class
~~to~~ 14 September 2026

Languages

	GOOD	BAD
<i>python program</i>	<pre>for i in range(args.N): print(i)</pre>	<pre>i in ? : j for range(print)</pre>
<i>JSON</i>	<pre>{ "name": "Pierre", "age": 61, "tags": ["board", "director"] }</pre>	<pre>"age": { 61, "Pierre" ["board": "director"] 'name' "tags" }</pre>
<i>URLs</i>	<pre>http://google.com</pre>	<pre>gsd@ht//:ww</pre>
<i>language</i>	<pre>The crowd could not keep back gasps of admiration</pre>	<pre>not of could back gasps The crowd admiration</pre>

What are the abstractions and tools that explain these good and bad examples?

*This is a question of **syntax***

Today we will cover

math

formal
language
theory

*abstractions
for reasoning
about
structure*

linguistics

natural
language

*applying
structure to
natural
phenomena*

engineering

parsing

*making them
usable by a
computer*

Goals for today

- After today, you should be able to
 - **define** a language
 - **describe syntax** both mathematically and linguistically
 - **enumerate** the formal language (Chomsky) hierarchy
 - **provide a description** of constituent grammars
 - **sketch the algorithm** for CKY parsing

Outline

formal
language
theory

natural
language

parsing

Formal Language Theory

- A **language** is a set of strings under some alphabet, Σ
 - Σ = a set of symbols (letters, words, numbers, etc)
 - string = a sequence of symbols from Σ
- e.g., the set of valid English sentences (where the “alphabet” is English words), or the set of valid Python programs

Some notes

- Σ^* (“sigma star”) is the set of all strings in the vocabulary
- ϵ is the *empty string*
- A language $\mathcal{L}$ can be very large—even infinite!

Languages as sets

- $\Sigma = \{0, 1, 2, 3, 4, 5, 6, 7, 8, 9, ., -\}$
- What do you think these languages describe (in words?)

$$\mathcal{L}_1 = \{0, 1, 2, 3, 4, 5, \dots\}$$

$$\mathcal{L}_2 = \{-12.4, 0, 142, 142.1, 142.01, 142.001, \dots\}$$

Formal Language Theory

- Formal Language Theory provides a common framework for studying properties of these languages, e.g.,
 - Is this file a valid C++ program? A valid Czech sentence?
 - What is the structure? $\Leftrightarrow$ How do I find its meaning?
 - How hard / time-consuming is it to answer these questions?

Generative descriptions of lang.

- A definition of languages as **sets** is not very useful
 - Why not?
- A better approach:
 - Develop a process that can describe how strings can be determined to be in a language
 - New membership criteria:
 - **IN**: can be generated by this process
 - **OUT**: cannot be generated by this process
-

Regular expression examples

- $\Sigma = \{0,1,2,3,4,5,6,7,8,9\}$
- A more compact representation: **regular expressions**
- What do these languages describe (in words?)
 $\mathcal{L}_1 = \Sigma^*$
 $\mathcal{L}_2 = 0 \mid [1 - 9][0 - 9]^*$
- Notes:
 - $\mid$ = “or”
 - $[]$ = “choose one of these”
 - $+$ = “one or more of the previous”
 - $*$ = “zero or more of the previous”

Generating from a language

- Imagine a process that repeatedly
 - begins by choosing a symbol
 - continues to do so until it decides to terminate
- How can we formalize this?

Regular languages with rules

- The “regular expression” syntax is a shortcut representation
- We can describe the generative process more formally using a set of *rules* that are recursively applied

$$A \rightarrow aA$$
$$A \rightarrow a$$

terminal
means
“end”

- Rules have two types of symbols:
 - *nonterminal* symbols (capital letters) are recursively replaced until there are no more of them
 - *terminal* symbols (lowercase letters) are normal vocabulary items

With rules: all sequences of digits

- Alphabet: $\Sigma = \{0,1,2,3,4,5,6,7,8,9\}$
- Language: $\mathcal{L}_1 = \Sigma^*$
- Generative rules: $S \rightarrow A$

$A \rightarrow 0A$

$A \rightarrow 1A$

$A \rightarrow 2A$

...

$A \rightarrow 9A$

$A \rightarrow \epsilon$

S is a
designated
start symbol

Generation
can pick any
of these
expansions

We finish by
generating the
empty string

Generate 0429

step	current string	apply rule
1	S	$S \rightarrow A$
2	<u>A</u>	$A \rightarrow 0A$
3	<u>$0A$</u>	$A \rightarrow 4A$
3	04 <u>A</u>	$A \rightarrow 2A$
4	042 <u>A</u>	$A \rightarrow 9A$
5	0429 <u>A</u>	$A \rightarrow \epsilon$
6	0429	DONE

With rules: whole numbers

- Alphabet: $\Sigma = \{0,1,2,3,4,5,6,7,8,9\}$
- Language: $\mathcal{L}_2 = 0 \mid [1 - 9][0 - 9]^*$
- Generative rules:

$S \rightarrow A$	$A \rightarrow 0$
$S \rightarrow B$	$C \rightarrow 0C$
$B \rightarrow 1C$	$C \rightarrow 1C$
...	...
$B \rightarrow 9C$	$C \rightarrow 9C$
	$C \rightarrow \epsilon$

Nonterminals capture “state” semantically. A =“just a zero”, B =“leading nonzero digit”, etc

“A 0, or a nonzero digit followed by zero or digits”

Generate 0

1	S	$S \rightarrow A$
2	$\underline{A}$	$A \rightarrow 0$
3	$\underline{0}$	DONE

Generate 429

1	S	$S \rightarrow B$
2	$\underline{B}$	$B \rightarrow 4C$
3	$4\underline{C}$	$C \rightarrow 2C$
4	$42\underline{C}$	$C \rightarrow 9C$
5	$429\underline{C}$	$C \rightarrow \epsilon$
6	429	DONE

Formal definition of a language

- Definitions: consider the set $(\Sigma, N, S \in N, R)$, where
 - Σ is the *vocabulary* which is a finite set of *terminal symbols*
 - N is a finite set of *nonterminals symbols*
 - $S \in N$ is a special nonterminal called the *start symbol*
 - α, β , and γ are *strings* of zero or more terminal and nonterminal symbols
 - R is a set of *rules* of the form $\alpha N \beta \rightarrow \gamma$

The Chomsky Hierarchy

- Named after Noam Chomsky, the MIT linguist
- Different constraints on the grammar rules changes the complexity of the kinds of languages that can be described
 - Language *generation* (rules → examples in the language) is always easy
 - Language *recognition* is harder (meaning, more compute-intensive) for higher languages
- More powerful languages are harder (meaning, more compute-intensive) to recognize

The Chomsky Hierarchy

Type	Rules	Name	Recognized by	Complexity
3	$A \rightarrow aB$	regular	finite-state automata	$\mathcal{O}(n)$
2	$A \rightarrow \alpha$	context-free	pushdown automata	$\mathcal{O}(n^3)$
1	$\alpha A \beta \rightarrow \alpha \gamma \beta$	context-sensitive	linear-bounded Turing machine	$\mathcal{O}(2^n)$
0	$\alpha A \beta \rightarrow \gamma$	recursively enumerable	Turing machines	undecidable

- α , β , and γ are strings of zero or more terminals and nonterminals

Regular languages

- Definitions: consider the set $(\Sigma, N, S \in N, R)$, where
 - Σ is the *vocabulary* which is a finite set of *terminal symbols*
 - N is a finite set of *nonterminals symbols*
 - $S \in N$ is a special nonterminal called the *start symbol*
 - α, β , and γ are *strings* of zero or more terminal and nonterminal symbols
 - R is a set of *rules* of the form $\alpha N \beta \rightarrow \gamma$

Type	Rules	Name	Recognized by
3	$A \rightarrow aB$	regular	finite-state automata

- All the languages we created earlier can be described with such rules

Context-free languages

- Definitions: consider the set $(\Sigma, N, S \in N, R)$, where
 - Σ is the *vocabulary* which is a finite set of *terminal symbols*
 - N is a finite set of *nonterminals symbols*
 - $S \in N$ is a special nonterminal called the *start symbol*
 - α, β , and γ are *strings* of zero or more terminal and nonterminal symbols
 - R is a set of *rules* of the form $\alpha N \beta \rightarrow \gamma$

Type	Rules	Name	Recognized by
2	$A \rightarrow \alpha$	Context-free	Pushdown automata

- This change might seem small, but it fundamentally alters the kinds of languages that can be generated

Context-free and not regular

- $\Sigma = \{a, b, c, \dots, z\}$
- Create a context-free language for $\mathcal{L}$, the set of palindromes
- $S \rightarrow A$

$A \rightarrow aAa$	$A \rightarrow a$
$A \rightarrow bAb$	$A \rightarrow b$
...	...
$A \rightarrow zAz$	$A \rightarrow z$
	$A \rightarrow \epsilon$
- Can you do this with the regular language constraint on rules?

Summary

- This view of languages (not sets, but “capturing” generative processes) is very productive
- We can generalize this discussion to make a connection between natural and other kinds of languages
- Consider, for example, *computer programs*
 - They either compile or don’t compile
 - *Their structure determines their interpretation*
- What is the structure?

Outline

formal
language
theory

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parsing

Linguistic fields of study

- Phonetics: sounds
- Phonology: sound systems
- Morphology: internal word structure
- **Syntax**: external word structure (sentences)
- Semantics: sentence meaning
- Pragmatics: contextualized meaning and communicative goals

Today's focus



MORGAN & CLAYPOOL PUBLISHERS

Linguistic Fundamentals for Natural Language Processing

*100 Essentials from
Morphology and Syntax*

Emily M. Bender

**SYNTHESIS LECTURES ON
HUMAN LANGUAGE TECHNOLOGIES**

Graeme Hirst, *Series Editor*

- Excellent book
- Organized into 100 mini-lectures
- PDF available for free via JHU library (along with tens of others in the series)
- <https://tinyurl.com/linguistic-fundamentals>

What is syntax?

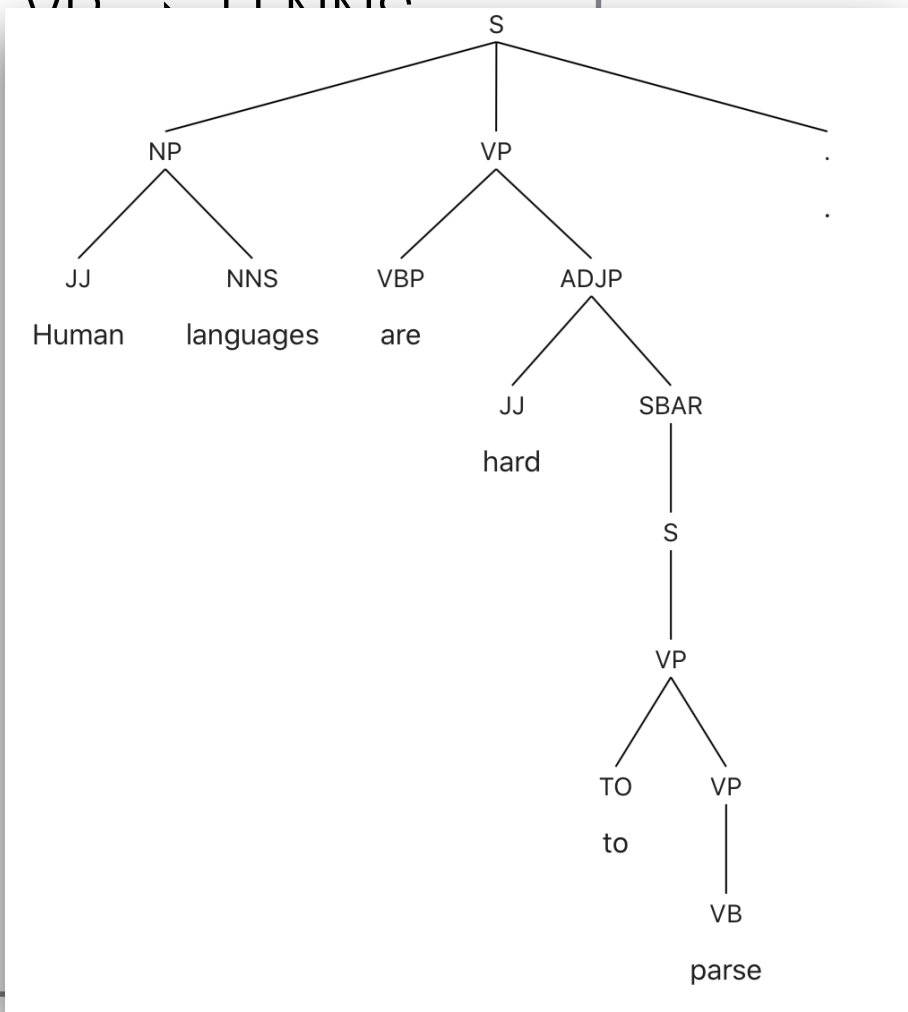
- A set of constraints on the possible sentences in the language
- * = “ungrammatical”
 - *A set of constraint on the possible sentence.
 - Dipanjan had *(a) question.
 - *You are on class.
- At a coarse level, we can divide all possible sequences of words into two groups: *valid* and *invalid* (or *grammatical* and *ungrammatical*)

Can you see the connection to formal language theory?

Example

S
S → NP VP .
S → [JJ NNS] VP .
S → [Human] NNS VP .
S → Human [languages] VP .
S → Human languages [VBP ADJP] .
S → Human languages [are] ADJP .
S → Human languages are [JJ SBAR] .
S → Human languages are [hard] SBAR .
S → Human languages are hard [VP] .
S → Human languages are hard [TO VP] .
S → Human languages are hard [to] VP .
S → Human languages are hard to [VB] .
S → Human languages are hard to [parse] .
S → Human languages are hard to parse .

S → NP VP



Nonterminals: parts of speech

- Functionally, parts of speech are unary rules that rewrite into words (the terminals)
- In grammar school, you may have learned “notional” definitions of parts of speech, e.g.,
 - noun: *a person, place, thing, or idea*
 - verb: *a word that shows action*
 - adjective: *a word that describes a noun*
- We typically instead use *distributional* definitions: parts of speech group words and phrases that can be substituted for each other

Phrases and Constituents

- Longer sequences of words can perform the same function as individual parts of speech:
 - I saw [a_{DT} kid_N]_{NP}
 - I saw [a kid playing basketball]_{NP}
 - I saw [a kid playing basketball alone on the court]_{NP}
- This gives rise to the idea of a **phrasal constituent**, which functions as a unit in relation to the rest of the sentence
- Constituents also can be grouped semantically with a nonterminal:
 - noun phrases, verb phrases, prepositional phrases, etc

Constituent tests

- How do you know if a phrase functions as a constituent?
- A few tests
 - *Coordination*
 - Kim [read a book], [gave it to Sandy], and [left].
 - *Substitution with a word*
 - Kim read [a very interesting book about grammar].
 - Kim read [it].
 - See Bender #51

What *isn't* syntax?

- Syntax is a scaffolding for meaning, but is not the same as meaning

I am here

grammatical
& meaningful

grammatical
& meaningless

Slick flat
anemones
drily type

You is tall

ungrammatical
& meaningful

ungrammatical
& meaningless

very
pancake
up

Human judgments

- “Ungrammatical” = “not in the language”
- Humans play a unique role in this
 - How do we know what’s grammatical? We ask native speakers to make judgments
- But how do native speakers know? We don’t know...
 - ...but we can use formal language theory to try to explain it
 - syntactic theories are grammars

Language as a CFG

- e.g., some rules
 - [sentence] → [subject] [predicate]
 - [subject] → [noun phrase]
 - [noun phrase] → [determiner]? [adjective]* [noun]
 - [predicate] → [verb phrase] [adjunct]
- Rules are *phrasal* or *terminal*
 - Phrasal rules form **constituents** in a tree
 - Terminal rules are **parts of speech** and produce words

Chomsky formal language hierarchy refresher

regular grammar
context-free grammar
context-sensitive grammar
Turing machine

Treebanks

- Collections of natural text that are annotated according to a particular syntactic theory
 - Usually created by linguistic experts
 - Ideally as large as possible
 - Theories are usually coarsely divided into *constituent/phrase* or *dependency* structure (not discussed)

The Penn Treebank

- Syntactic annotation of a million words of the 1989 Wall Street Journal, plus other corpora (released in 1993)
 - (Trivia: People often discuss “The Penn Treebank” when they mean the WSJ portion of it)
- Contains 74 total tags: 36 parts of speech, 12 punctuation and currency tags, and 31 phrasal constituent tags, plus some relation markings
- Was the foundation for an entire field of research and applications for over twenty years

Generative story

- The “generative story” is that a grammar was used to generate every sentence
- Linguists annotate the parse trees, and we can read this “story” as a CFG that produced each sentence
- We can extract all rules over the entire Treebank and use them to determine the “language” of English
 - This is the connection between formal language theory and linguistic syntax

((S
 (NP-SBJ
 (NP (NNP Pierre) (NNP Vinken))
 (, ,)
 (ADJP
 (NP (CD 61) (S years))
 (JJ old))
 (, ,))
 (VP (MD will))
 (VP (VB join)
 (NP (DT the) (NN board))
 (PP-CLR (IN as)
 (NP (DT a) (JJ nonexecutive) (NN director)))
 (NP-TMP (NNP Nov.) (CD 29))))
 (. .)))

x 49,208



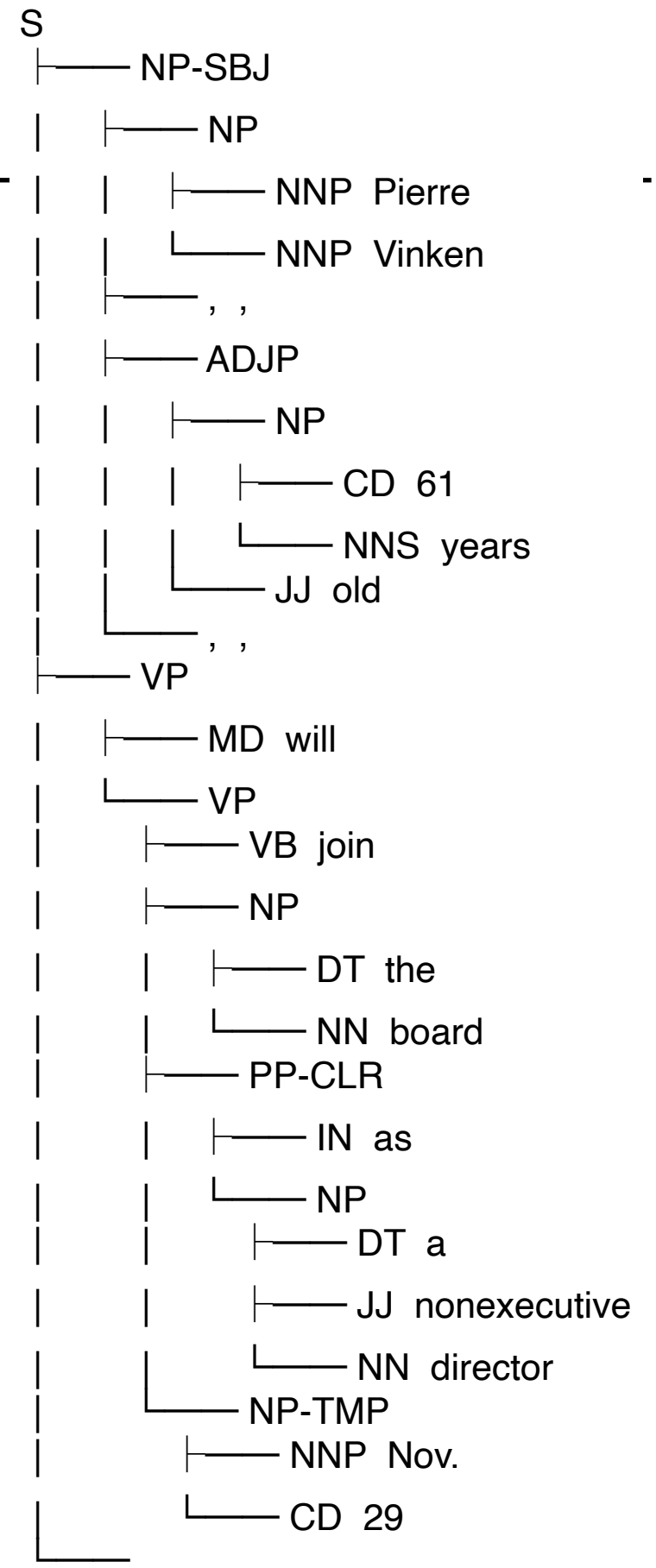
<https://commons.wikimedia.org/wiki/File:PierreVinken.jpg>

Pierre Vinken, 61 years old, will join the board as a nonexecutive director Nov. 29.

Rule extraction

- Here the parse has been rewritten for readability
- Rules can be read from the indentation, e.g.,
S → NP-SBJ VP .
NP-SBJ → NP , ADJP ,
NP → NNP NNP
NNP → Pierre
NNP → Vinken
VP → MD VP
VP → VB NP PP-CLR NP-TMP
...

Pierre Vinken, 61 years old, will join the board as a nonexecutive director Nov. 29.



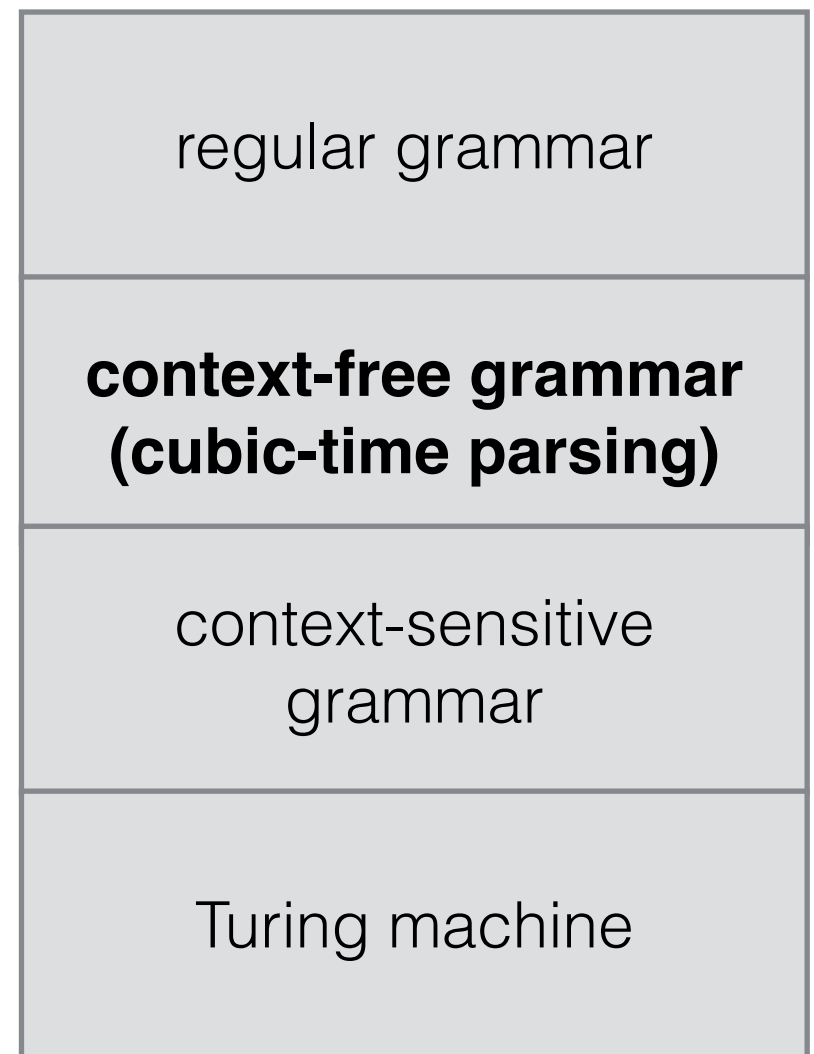
Some notes

- Nonterminals are finer-grained, e.g., NP-TMP
- This isn't perfect
 - There are thousands and thousands of rules
 - The grammar over-generates wildly, including many invalid English sentences
- Not discussed: probabilities
 - We can annotate all rules with a probability distribution
 - For example, the sum of all rules $S \rightarrow ?$ will sum to 1
 - Relative frequencies can be read from the data

Where does English fall?

- How much expressive power do we need to model English?
- There are languages that exhibit non context-free phenomena (Swiss-German and its cross-serial dependencies, notoriously), but we typically use CFGs for efficiency reasons

Chomsky formal language hierarchy refresher



Summary so far

- Formal language theory is a theory that does the following:
 - provides a compact representation of a language
 - provides an account for how strings within a language are generated
- It's very useful for describing many simple languages
- It can also be applied to natural language
- Treebanks were used to annotate real data according to theories of syntax

Outline

formal
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natural
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parsing

Where we are

- We discussed formal language theory
- We showed how it might apply to human language
- But how do we get a computer to use it?
 - Sentences (or other strings we wish to parse) are observed; the structure is *latent* (hidden) and needs to be inferred
- Assume: the text was generated by a model
 - We need
 - An algorithm for finding the sequence of actions under that model, most likely to have produced it
 - A way to learn that model

Parsing

- If the grammar has certain properties, we can efficiently answer the first question (find the hidden structure) with a **parser**
 - Q1: is the sentence in the language of the grammar?
 - Q2: *what* is the structure above that sentence?

Important properties

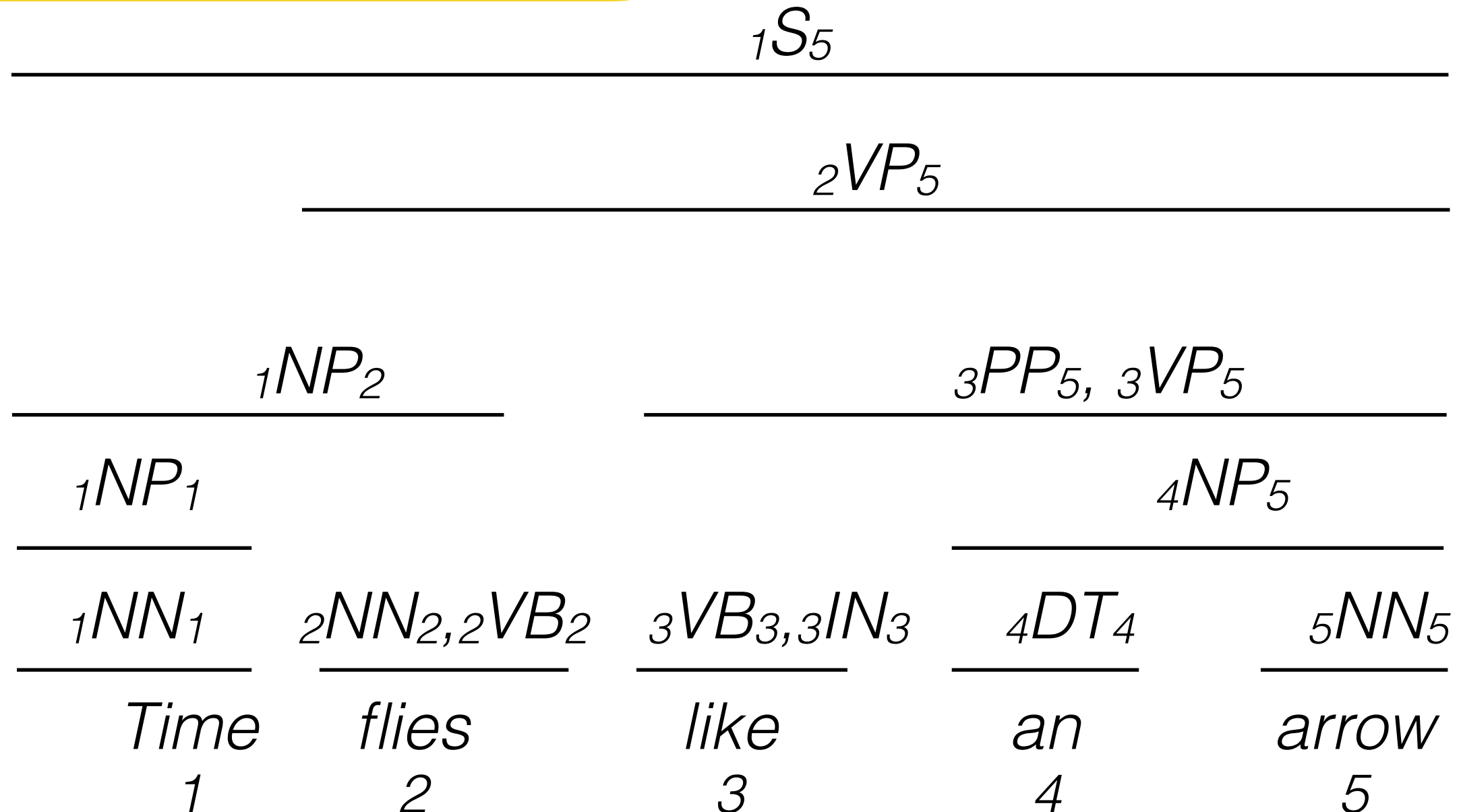
- *Chomsky Normal Form*
 - Every rule is either binary ($S \rightarrow A B$) or terminal ($A \rightarrow a$)
 - Longer rules must be binarized, e.g., $S \rightarrow A B C$
 $S \rightarrow A X_1$
 $X_1 \rightarrow B C$
- We need special handling for unary rules to prevent infinite inference loops
 - If the grammar has $A \rightarrow B$ *and* $B \rightarrow A$, we need to take care not to infer a (useless) infinite chain
 $A \rightarrow B \rightarrow A \rightarrow B \rightarrow A \rightarrow \dots$

Chart parsing for constituency grammars

- Maintains a chart of nonterminals spanning words, e.g.,
 - NP over words 1..4 and 2..5
 - VP over words 4..6 and 4..8
 - etc
- If we can build an S over the whole sentence, the sentence is in the language

Chart parsing for constituency grammars

If we can build S over the whole sentence, the sentence is **in** the grammar



Cocke-Kasami-Younger algorithm

- Basic idea: work bottom-up, applying all matching rules, (recursively) building larger constituents from smaller one

```
# base case
```

```
for i in 1..N
```

```
  for all rules  $A \rightarrow w_i$ 
```

```
    create  $_iA_i$ 
```

```
# inductive case
```

```
for width in 2..N
```

```
  for i in 1..{N - width + 1}
```

```
    j = i + width - 1
```

```
    for split k in i..{j - 1}
```

```
      for all rules  $A \rightarrow B C$ 
```

```
        create  $_iA_j$  if  $_iB_k$  and  $_{(k+1)}C_j$ 
```

Note the normal
form (binary rule)
assumption

Not handled here:
unary rules

CKY algorithm

The two decompositions correspond to different semantics

$S \rightarrow {}_1NP {}_2{}_3VP {}_5$

Funny meaning

$S \rightarrow {}_1NP {}_1{}_2VP {}_5$

Normal meaning

$VP \rightarrow VB PP$

$VP \rightarrow {}_3VB {}_3{}_4NP {}_5$

$PP \rightarrow {}_3IN {}_3{}_4NP {}_5$

$NP \rightarrow NN NN$

$NP \rightarrow NN$

NN

Time

1

NN, VB

flies

2

VB, IN

like

3

$NP \rightarrow DT NN$

DT

an

4

NN

arrow

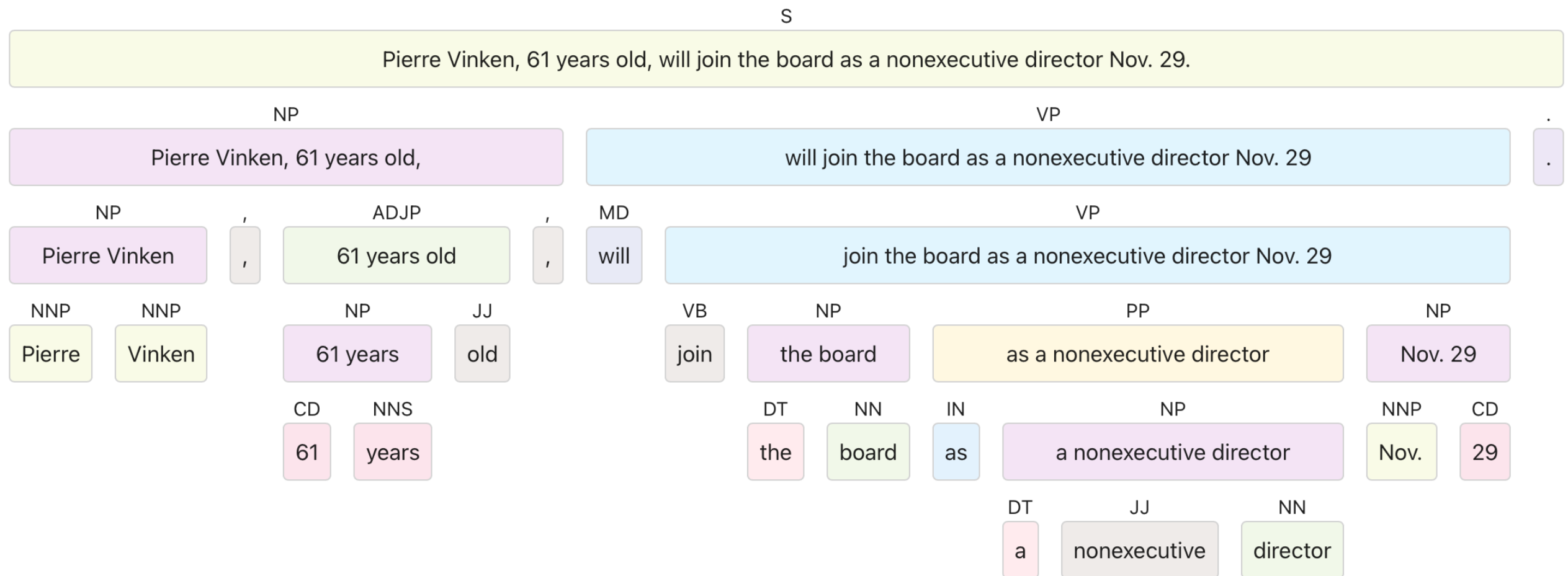
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CKY algorithm

- Parsing questions:
 - **Q1**: is a given sentence in the language of the grammar?
 - **Q2**: What is the structure above that sentence?
- Termination: is there a chart entry at $_1S_N$?
 - ✓ string is in the language (Q1)
 - Structures can be obtained by following backpointers in dynamic programming chart (Q2, not covered today)
- Other technical details not covered today:
 - We can disambiguate by assigning probabilities to rules

Demos

- Berkeley Neural Parser:
<https://parser.kitaev.io/>
(certificate expired, but seems okay...)



Summary

formal
language
theory

*provides a
framework for
reasoning
about
languages of
all kinds*

natural
language

*a real-world (if
messy)
application
area for
formal
language
theory*

parsing

*a means of
making text
useable
under formal
language
theory*