

Natural Language Processing

6: Syntax. Trees and Dependencies. Part 1





Objectives

to be able to answer questions

- (1) What is syntax, grammar?
- (2) What are most common Syntactic Representations?
- (3) How grammars work?
- (4) How phrase structure grammar work?
- (5) What are the Phrasal categories, why are they useful?

Basic Background: Syntax, Grammar

SYNTAX?

**I ALREADY PAY THE
GOVERNMENT ENOUGH!**

Grammaticality

(1) We recognise some word strings are well-formed or grammatical sentences, and others not, e.g.

- (a) The dog bit the cat.
- (b) *The the bit cat dog.

* means ungrammatical

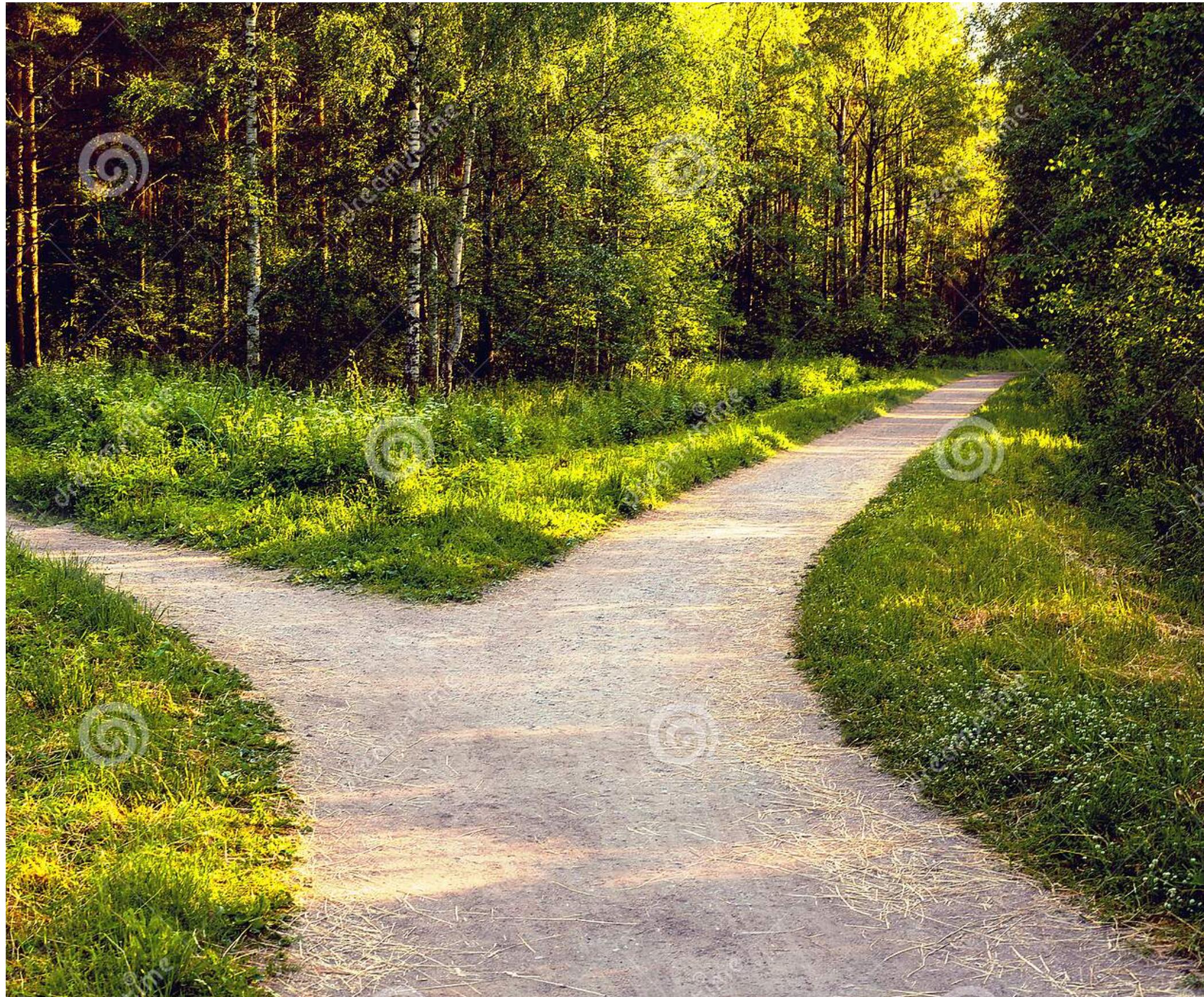
(2)

A sentence may be grammatical but **not acceptable**.

Grammaticality

Examples

- (1) acceptability affected by performance factors
 - (1) e.g. multiple centre embeddings:
The malt (the rat (the cat chased) ate) stank
 - (2) e.g. so-called garden path sentences:
The horse raced past the barn fell



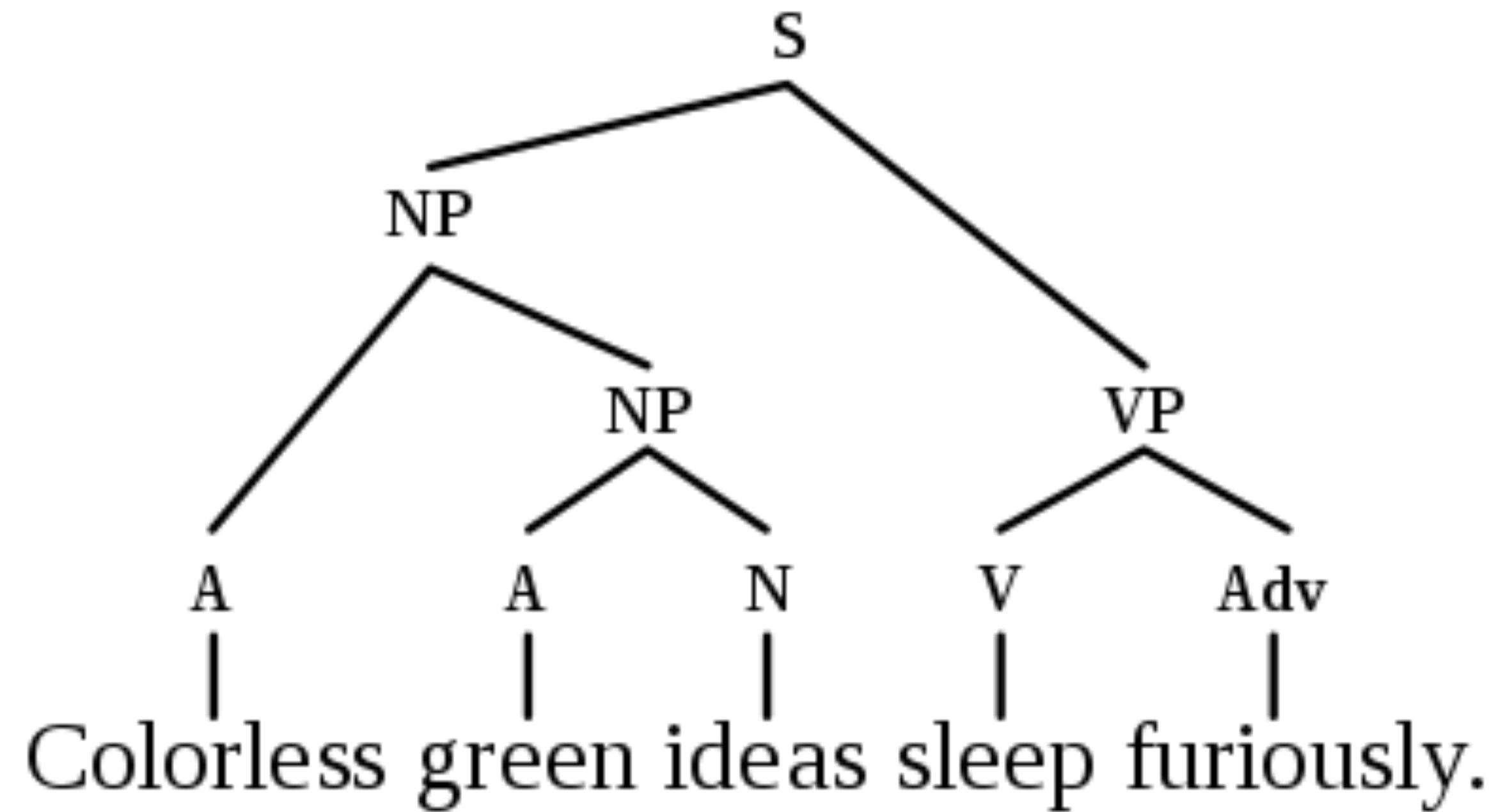
Grammaticality

Grammaticality is independent of ‘semantic appropriateness’

- (1) a famous example: sentence grammatical, even though it is nonsensical:
 - (a) Colourless green ideas sleep furiously.
- (2) contrasts with ungrammatical (b):
 - (b) *Furiously sleep ideas green colourless.
- (3) even following minor variants ungrammatical:
 - (c) *Colourless green idea sleep furiously.
 - (d) *Colourless green ideas sleeps furiously.

Syntactic Theory and Natural Language

- (1) The task of explaining why some strings are grammatical and others not is addressed by **syntactic theory**
- (2) Syntactic theory is the study of the principles governing how words are combined to form sentences



A formal grammar or generative grammar

- (1) In the generative paradigm of syntactic research, this goal pursued via the specification of **formal grammars**
- (2) A formal grammar or generative grammar is . . .
an abstract system of **rules and principles** that formally characterise the properties of the well-formed sentences of a language, distinguishing them from ungrammatical strings
- (3) Such a grammar is said to **generate the language**

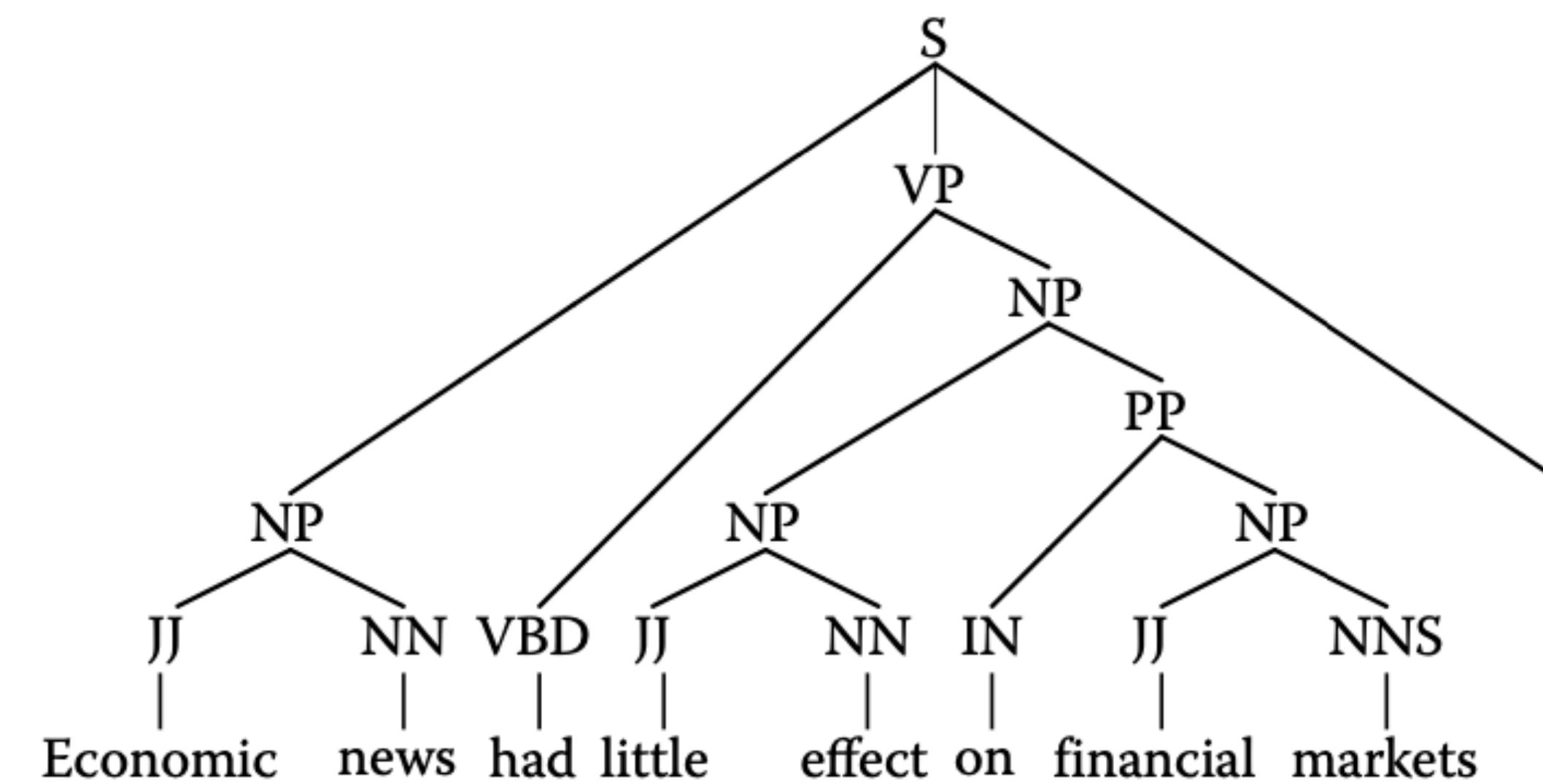
Why Should Natural Language Have Syntax?

- (1) Syntax plays a vital role in making language useful for communication
- (2) Syntax limits possible sentence forms:
 - (a) John found Mary.
 - (b) Mary found John.
 - (c) *Found John Mary
- (3) But ALSO limits the possible sentence forms for a given meaning
 - e.g. the meanings of (a) and (b) distinct
- (4) Word order in English plays crucial role in allowing us to determine the precise relation between word meanings (in other languages?)

Why Should Natural Language Have Syntax?

- (1) This information – the precise relations between the meanings of words – can be signalled in other ways (but some mechanism is required)
- (2) Japanese, for example, has greater freedom of word order
 - (1) roles are instead signalled by case-marking
 - i.e. by the morphological form of words, especially the affixes that appear
 - (1) **John-ga Mary-o mituketa** (= John found Mary)
 - (2) **Mary-o John-ga mituketa** (= John found Mary)

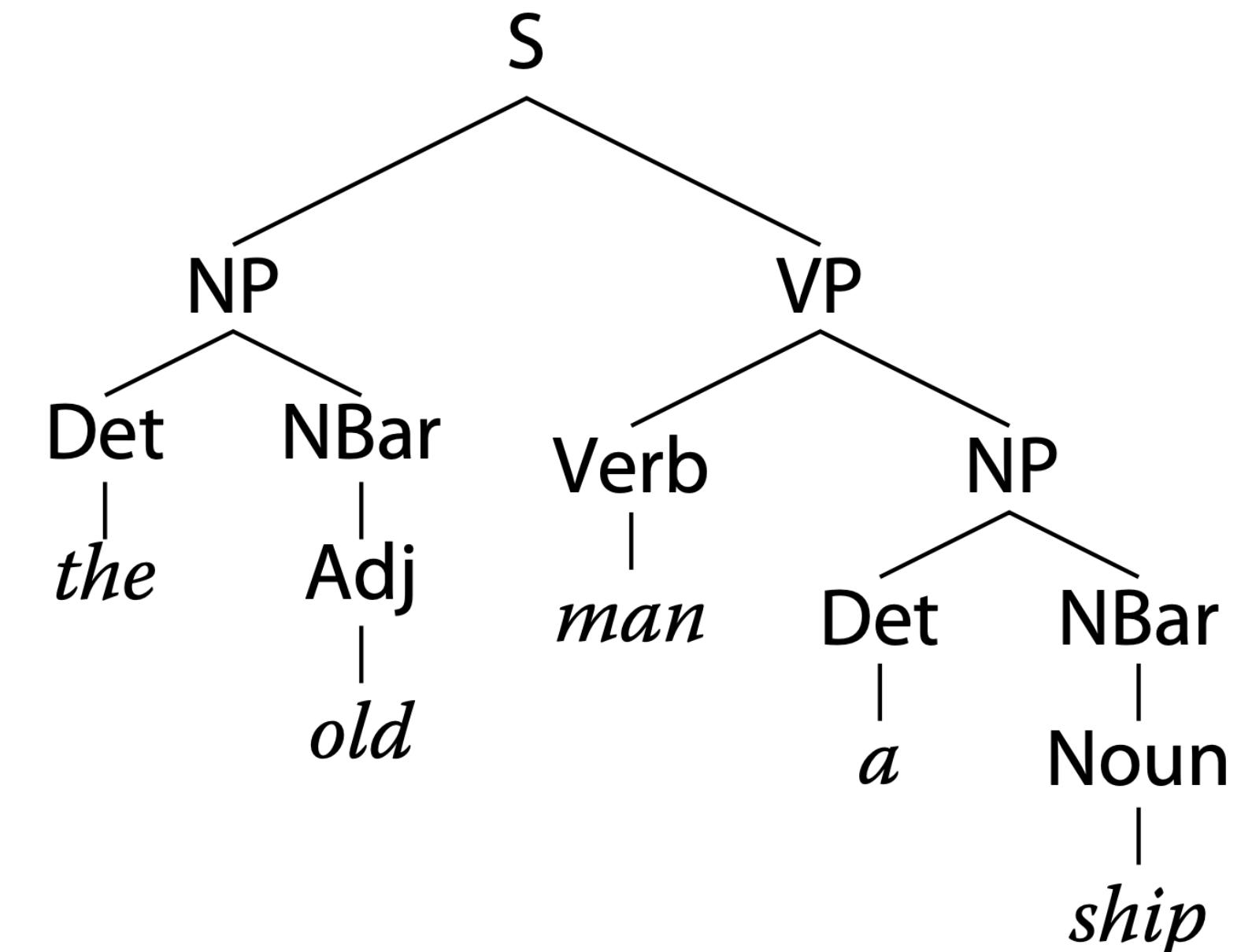
Phrase Structure Grammar



Definition of PSG

just in case if a professor will ask you about it...

- (1) N a set of **non-terminal symbols**
- (2) Σ a set of **terminal symbols** (disjoint from N)
- (3) R a set of **productions or rules** of the form
 $A \rightarrow \beta$, where A is a non-terminal and β is a string of symbols from $(\Sigma \cup N)^*$
- (4) S , a designated non-terminal called the **start symbol**



`[S [NP [Det the][NBar [Adj old]]][VP [Verb man][NP [Det a][NBar [Noun ship]]]]]`

Phrase Structure Grammar

Basics

- (1) A Phrase Structure Grammar (PSG) has two key components:
a lexicon and phrase structure rules
- (2) **Lexicon**
Words are categorised into word classes
a.k.a. parts of speech, form classes, lexical categories
- (3) A lexicon (dictionary) is supplied as part of a PSG
 - (1) provides an assignment of lexical categories to words
 - (2) note that many words may fall into more than one class

Lexicon

Examples

(1) Some examples (with abbreviation in brackets):

- (1) Determiner (Det) e.g. a, the
- (2) Noun (N) e.g. man, fish
- (3) Proper Name (PN) e.g. John, Mary
- (4) Verb (V) e.g. run, eat, sit, see
- (5) Preposition (P) e.g. in, to, by
- (6) Adjective (Adj) e.g. red, small, angry

Phrase structure rules

- (1) words are grouped into larger units called **phrases or constituents**
phrases in turn may group into larger phrases
- (2) each phrase is marked with a phrasal category
- (3) the ways that words/phrases may group into larger phrases is stated by a set of rules
 - known as **phrase structure rules** (a.k.a. rewrite rules, context-free rules)
- (4) Example — the rule: $\text{NP} \rightarrow \text{Det N}$
 - says Det followed by N may be grouped to give Noun Phrase (NP)

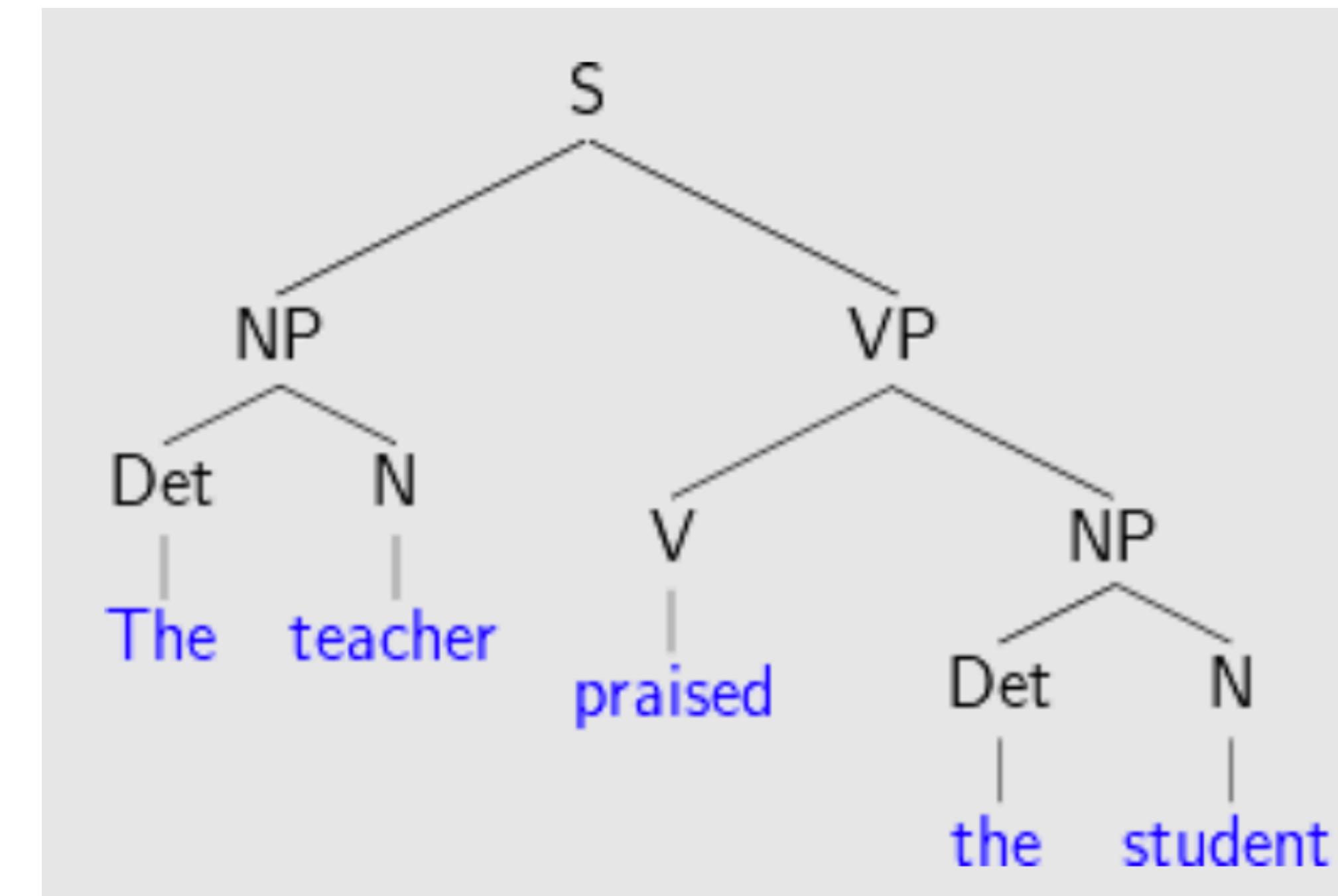
Phrase structure rules

Some other noun phrases rules

- (1) $\text{NP} \rightarrow \text{PN}$
- (2) $\text{NP} \rightarrow \text{Det } \text{Adj } \text{N}$
- (3) $\text{NP} \rightarrow \text{NP} \quad \text{and} \quad \text{NP}$

PSG

- (1) A sentence structure is frequently displayed in the form of a **phrase structure tree**:



- (1) Alternatively, a labelled bracketting may be given, e.g.
[S [NP [Det the] [N teacher]] [VP [V praised] [NP [Det the] [N student]]]]]

What is the benefit of recognising phrases?

(1) Consider sentences:

The boy ran

John ran

The young boy ran

The young girl and John ran

(2) Might express these possibilities by a series of rules, e.g.

(1) $S \rightarrow \text{Det } N V$

(2) $S \rightarrow \text{PN } V$

(3) $S \rightarrow \text{Det Adj } N \text{ and } \text{PN } V$

(4) $S \rightarrow \text{Det } N \text{ and } \text{Det Adj } N V$

How are phrases recognised?

- (1) Phrases bearing the same category exhibit **similar distributional behaviour**
i.e. may appear in roughly the **same contexts**
- (2) Distributional similarity is tested by substitution:
! substituting one for other in range of contexts should preserve grammaticality !
i.e. so strings before and after substitution should either both be grammatical or both be ungrammatical

Phrase recognition

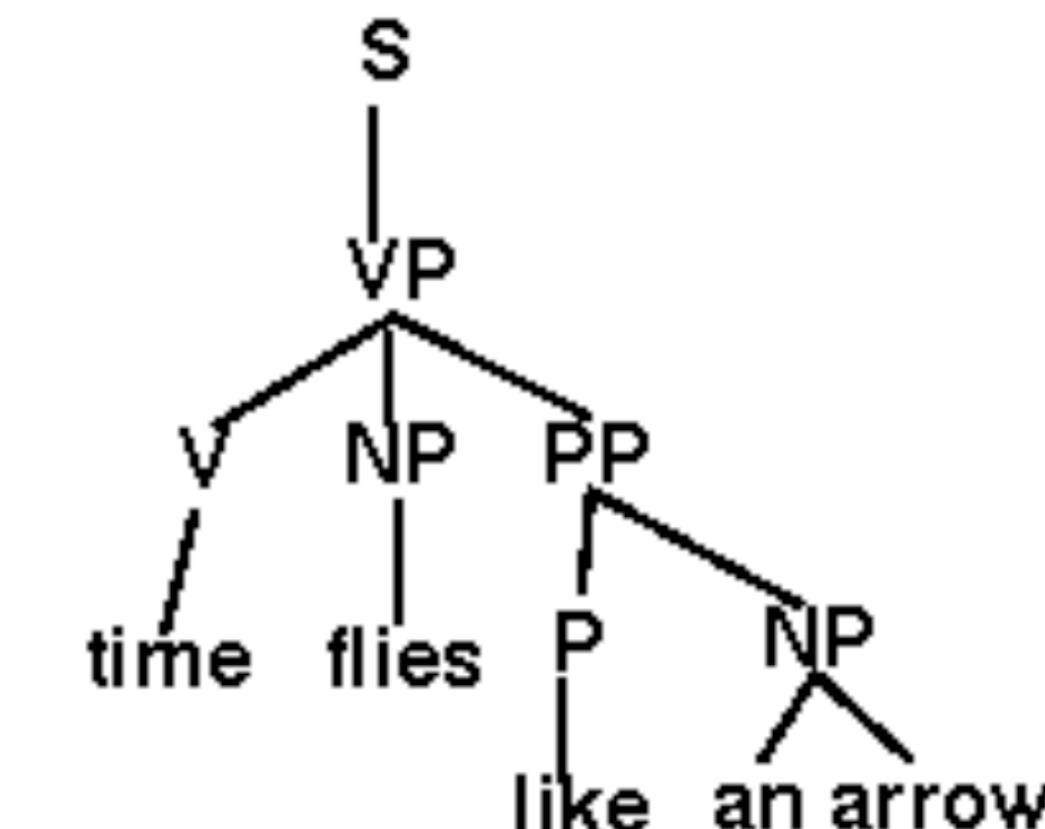
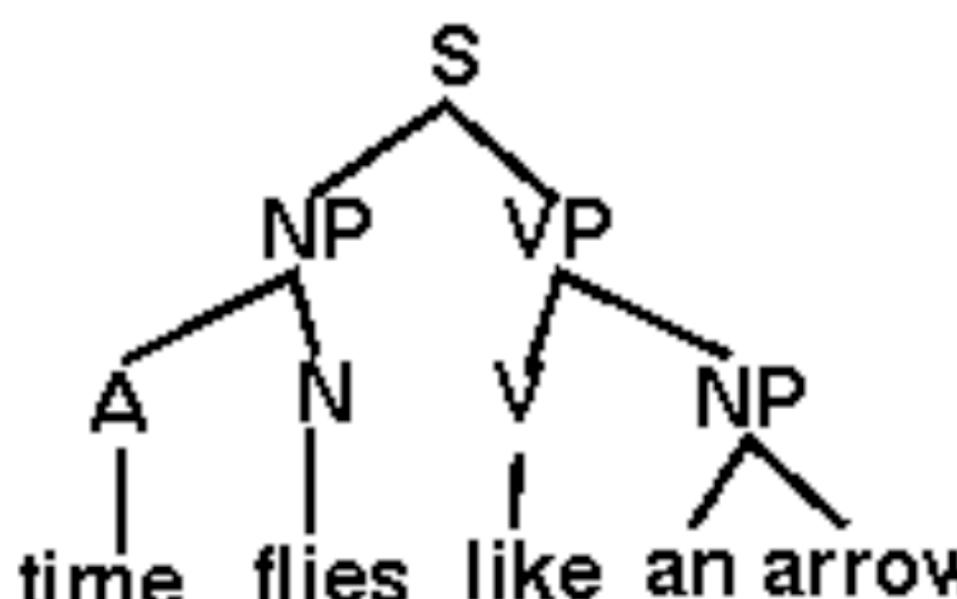
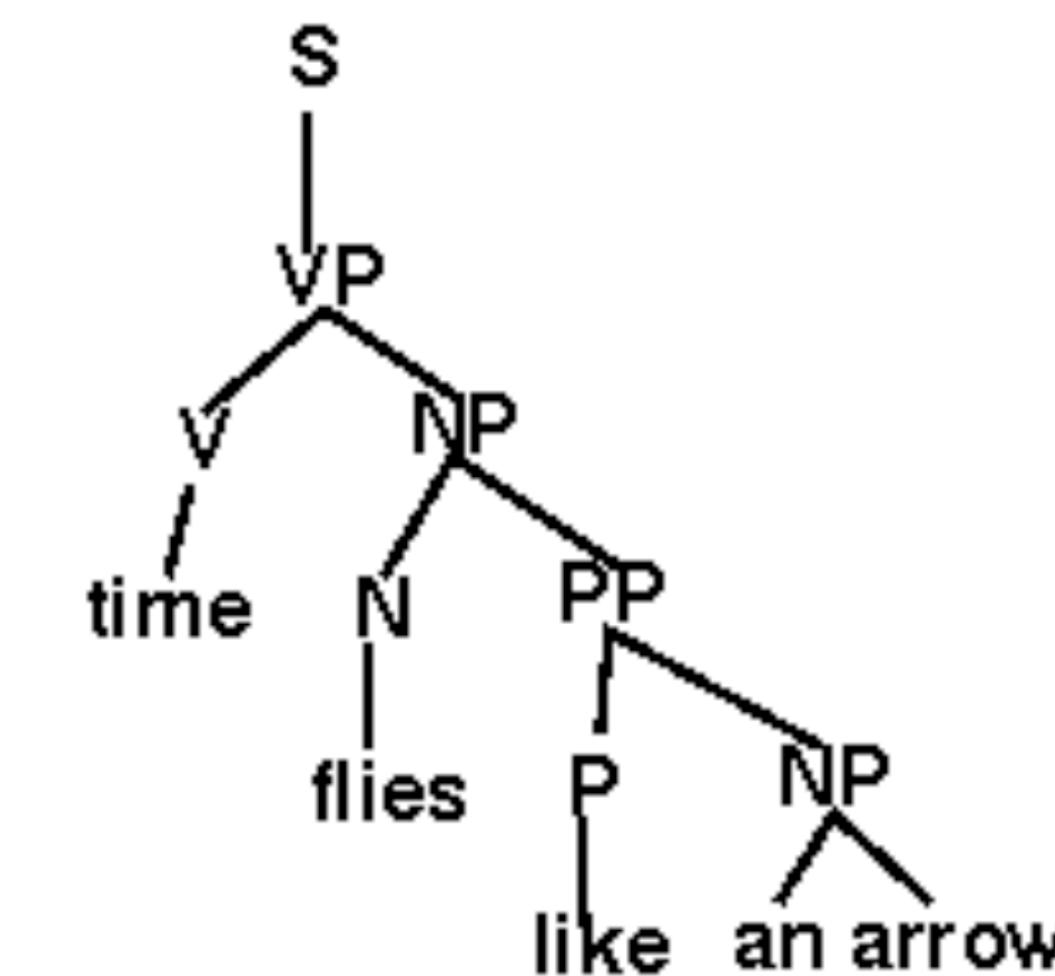
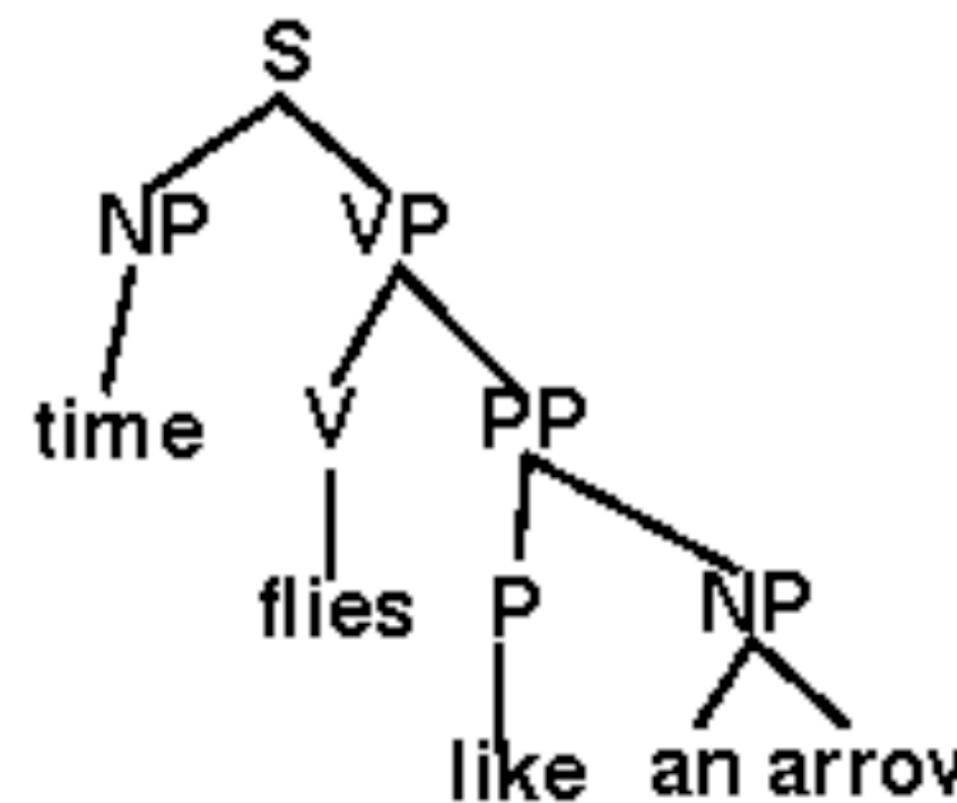
Example

the strings **a boy** and **the fish** are both noun phrases
so, we expect following substitution to preserve grammaticality

Mary admires **a boy** \Leftrightarrow Mary admires **the fish**

time flies like an arrow

how would you call this phenomenon?



Syntax Parsing

CKY = Cocke-Kasami-Younger algorithm

- (1) CKY Recogniser detects if a sentence **is** in the language defined by a grammar
- (2) CKY Parser actually gives the derivation (a tree) for a sentence
- (3) Parser may give many possible parses for a sentence, so we need to rank them
- (4) Typical approach is **neural constituency parser** using an encoder (e.g. BERT)
- (5) Details in Chapter 17.7 of the book

Break



Parsing assignment

“garden paths”

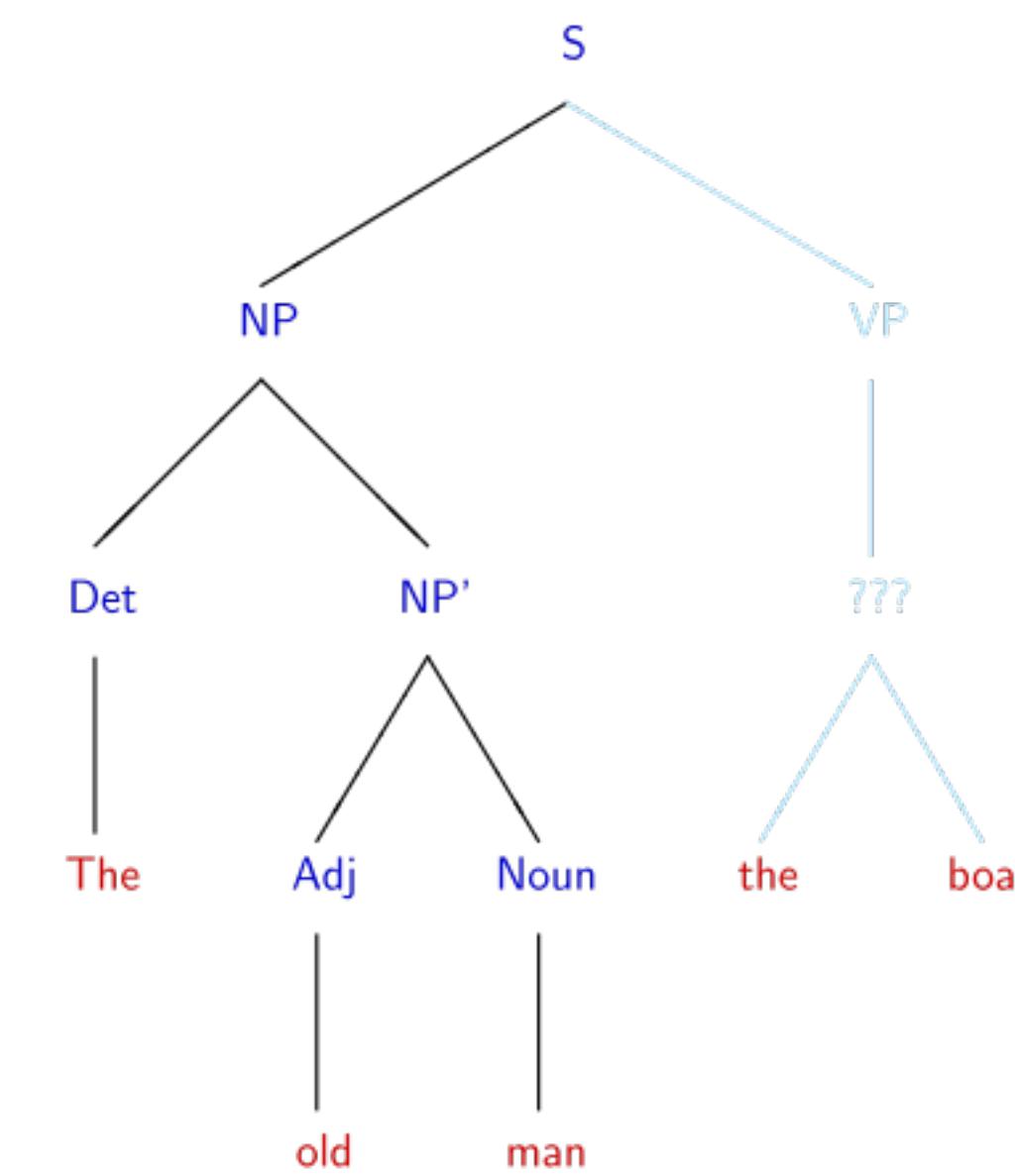
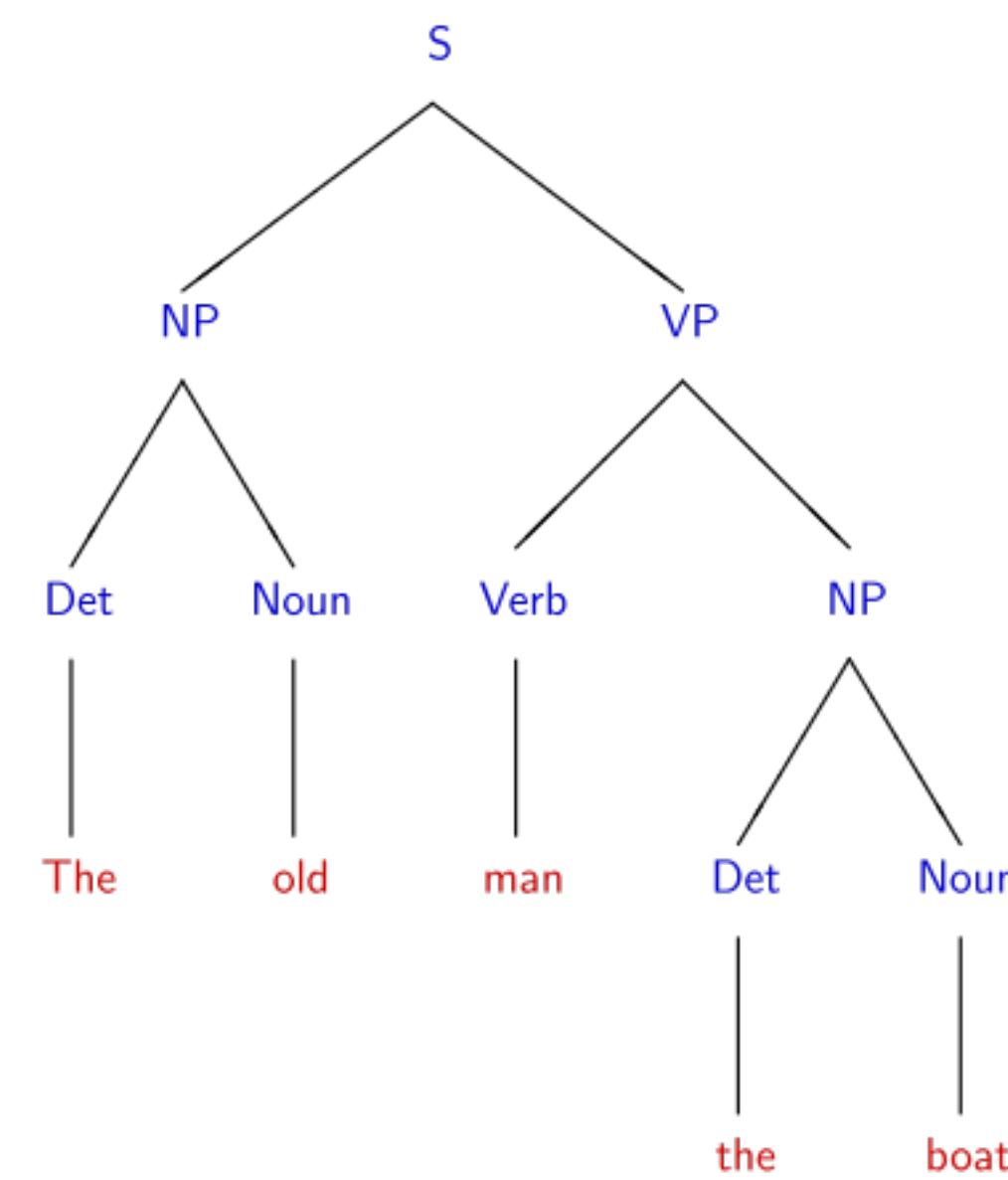
- (1) Parse sentence and draw a parse tree
 - (1) Example 1: "The old man the boat."
 - (2) Example 2: “The complex houses married and single soldiers and their families.”
- (2) Discuss your results

Parsing assignment

“garden paths”

(1) Example 1: "The old man the boat."

(2) Discuss your results



PSG

some terminology

- (1) Phrases bearing the same category exhibit **similar distributional behaviour**
i.e. may appear in roughly the same contexts
- (2) Distributional similarity is tested by substitution:
 - (1) substituting one for other in range of contexts should preserve grammaticality
 - (2) i.e. so strings before and after substitution should either both be grammatical or both be ungrammatical
- (3) Example: the strings **a boy** and **the fish** are both **noun phrases**
so, expect following substitution to preserve grammaticality
Mary admires a boy \Leftrightarrow **Mary admires the fish**

PSG. Terminology

Some standard terminology for talking about trees

(1) **dominates:**

node X dominates node Y in tree iff there a path down from X to Y.

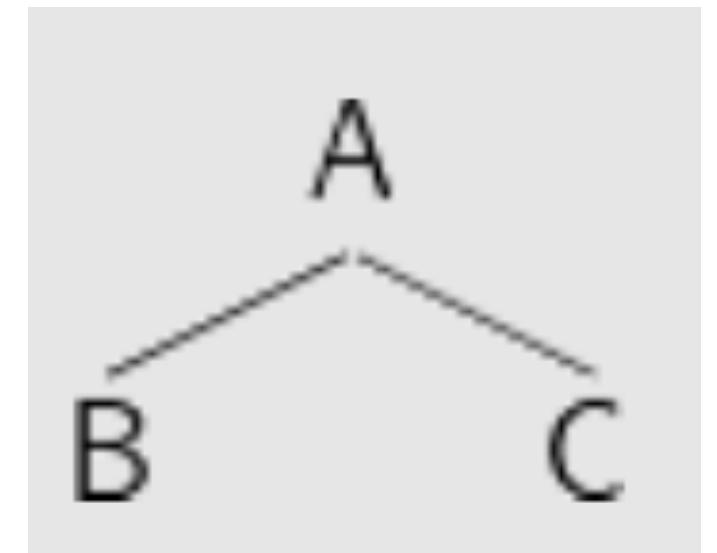
(2) **immediately dominates:**

node X immediately dominates node Y in tree iff X dominates Y and there are no intervening nodes on the path between

(3) **local tree:**

a local tree is a tree or subtree licensed by a single PS rule

(4) **mother / daughter / sisters**



PSG Terminology: Heads

- (1) Various phrasal category names make reference to a lexical category
e.g. noun phrase, verb phrase
- (2) This element is the head of the phrase
- (3) The head **principally determines the character** of the phrase, and thereby its distribution
- (4) For a given phrase type, phrase and head have **similar semantic** ‘feels’
- (5) For example, all the NP rules have a noun (or proper name) subconstituent, which is the NP’s head.
e.g. the noun boy is head of NPs:
the boy
the young boy
the young boy who lives next door

PSG Terminology: Complements

(1) A head may require other phrases to appear alongside it: called its **complements**

(1) e.g. **admires** requires (or ‘takes’) an object NP:

- (a) John admires Mary
- (b) *John admires

(2) e.g. **died** takes no complements:

- (c) John died
- (d) *John died Mary

(3) e.g. verb **put** requires an object NP and PP complements:

- (e) John put the book on the table
- (f) *John put on the table

(2) What complements a head requires is related to its **meaning**

e.g. for **admires**: meaning involves relationship between an admirer (subject NP) and an admiree (object NP)

PSG Terminology: Complements (ctd)

(1) Complements are often obligatory, but some are **optional**

e.g. compare the following

(a) John ate some cheese

(b) John ate

— in (b), the existence of something eaten is still strongly implied

(2) Heads may be further classified in terms of the **patterns of complements** which they allow

this classification is known as **subcategorisation**

PSG Terminology: Complements (ctd)

subcategorisation

- (1) A head is said to **subcategorise** for its complements
 - e.g. a transitive verb **subcategorises for** a single object NP
- (2) It is not only verbs that take complements
 - (1) e.g. nouns: **the chance of a lifetime ... the fact that he had won**
 - (2) e.g. adjectives: he was **eager** to please

PSG Terminology: Adjuncts

- (1) Adjuncts are phrases that supply additional information about events or entities, etc.
- (2) Their presence is **always optional**
- (3) An adjunct is said to **modify** the phrase with which it is associated
- (4) Some examples:
- (5) (a) John left **yesterday**
(b) John saw Mary **on Monday**
(c) John parked his car **in the carpark**
(d) John wrote a book **about flower arranging**

PSG Terminology: Adjuncts (ctd)

- (1) Can usually have multiple adjuncts:
 - (e) John left **in a hurry, yesterday**
 - (f) I saw the key **on the table, beside the book**
 - (g) John parked his car **in the carpark, near the entrance**
- (2) Can allow for optionality/multiple occurrence characteristic of adjuncts using self recursive rules

$N \rightarrow N P \ P$

$VP \rightarrow VP \ PP$

$S \rightarrow S \ PP$

CFG vs. PSG

- (1) **Context-free grammars** are the same as phrase structure grammar
- (2) Backus–Naur form (BNF) is a metasyntax notation for context-free grammars, often used to describe the syntax of languages used in computing, protocols, ...

```
<postal-address> ::= <name-part> <street-address> <zip-part>

<name-part> ::= <personal-part> <last-name> <opt-suffix-part> <EOL> | <personal-part> <name-part>

<personal-part> ::= <initial> "." | <first-name>

<street-address> ::= <house-num> <street-name> <opt-apt-num> <EOL>

<zip-part> ::= <town-name> "," <state-code> <ZIP-code> <EOL>

<opt-suffix-part> ::= "Sr." | "Jr." | <roman-numeral> | ""

<opt-apt-num> ::= <apt-num> | ""
```

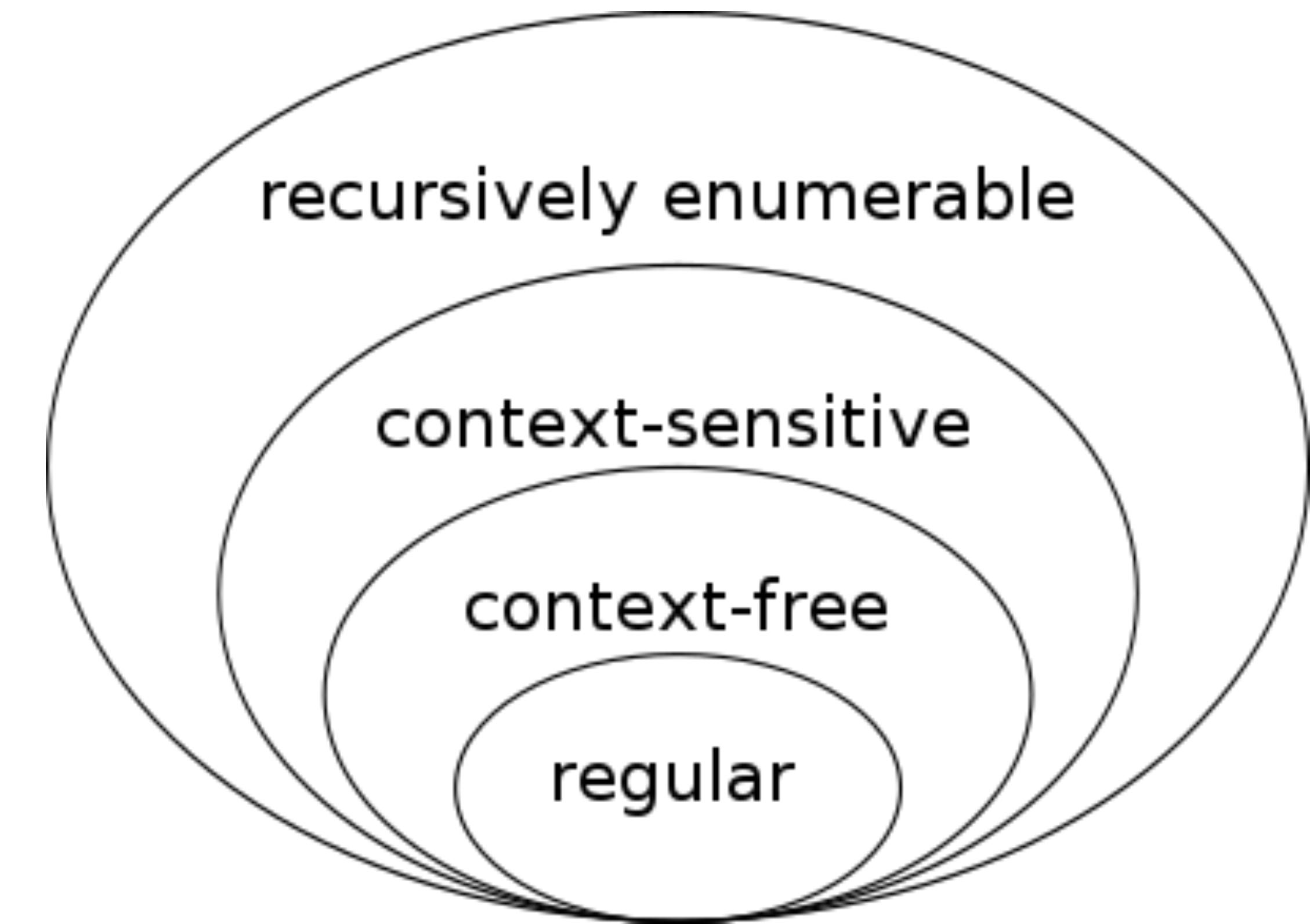


Trees and Dependencies

Chomsky's hierarchy

Some history

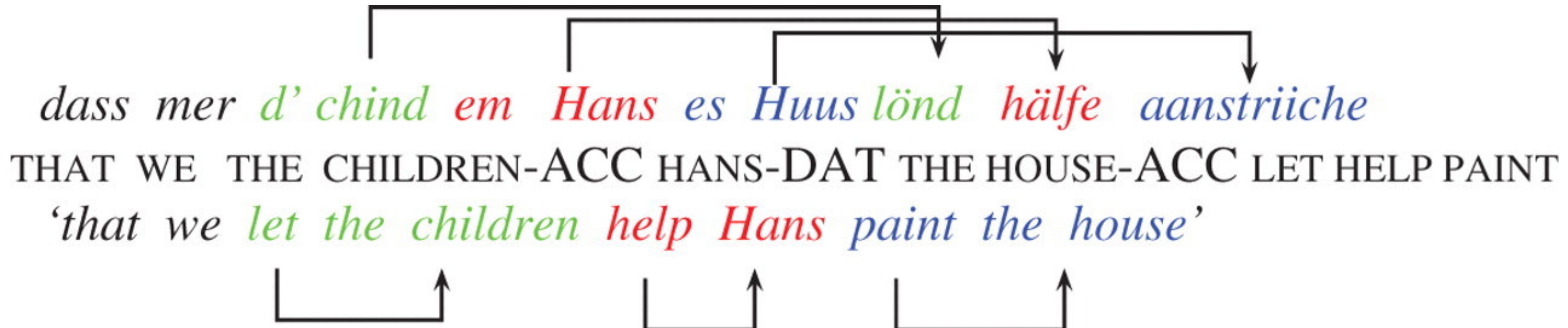
- (1) Context free grammar (CFG) was introduced by Noam Chomsky in 1956
- (2) Most grammar formalisms are derived from or can somehow be related to CFG
- (3) Context-sensitive is the next step (1959)
- (4) **Recursively enumerable** languages are exactly all languages that can be recognized by a Turing machine.



Where are natural languages located?

- (1) For sure, natural languages are not regular
- (2) Question whether they are Context-free was answered only in the mid-1980s
Context-free grammars can only handle an unbounded number of interlocked dependencies **if they are nested.**

Here, In Swiss-German number of crossing dependencies between objects and verbs are **unbounded**:

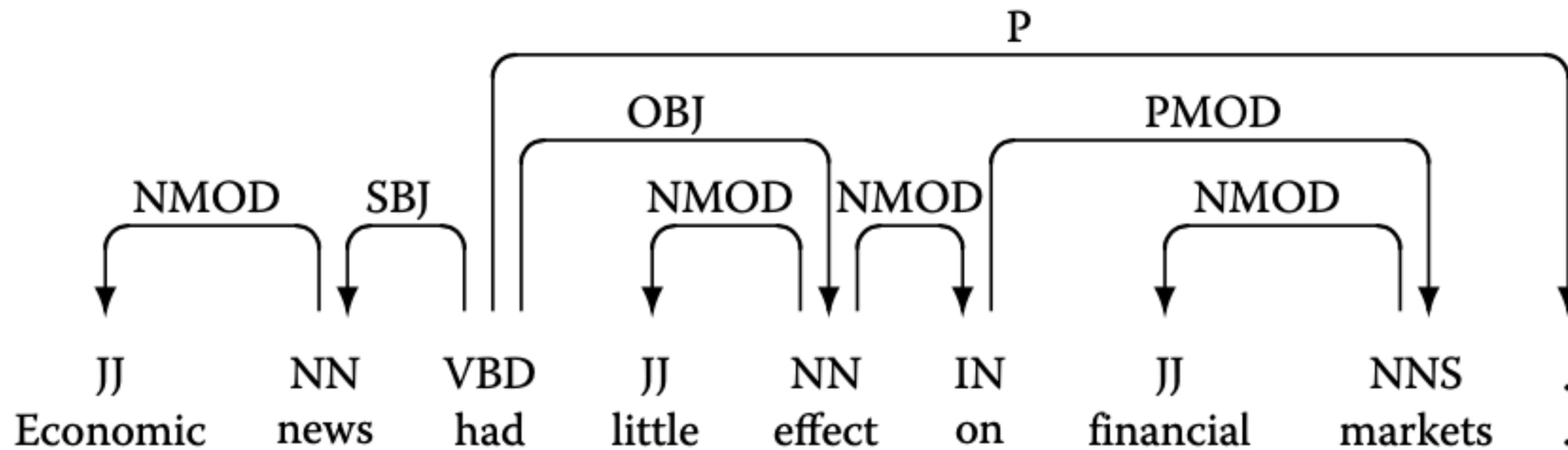


Mildly context-sensitive languages

Suggested by Joshi (1985)

- (1) Captures the precise formal power needed for defining natural languages
- (2) Conditions:
 - (1) It contains all Context Freee Languages
 - (2) It can describe a limited number of types of cross-serial dependencies
 - (3) Its membership problem has polynomial complexity (it is **false** of Context sensitive)
 - (4) All languages in it have constant growth property

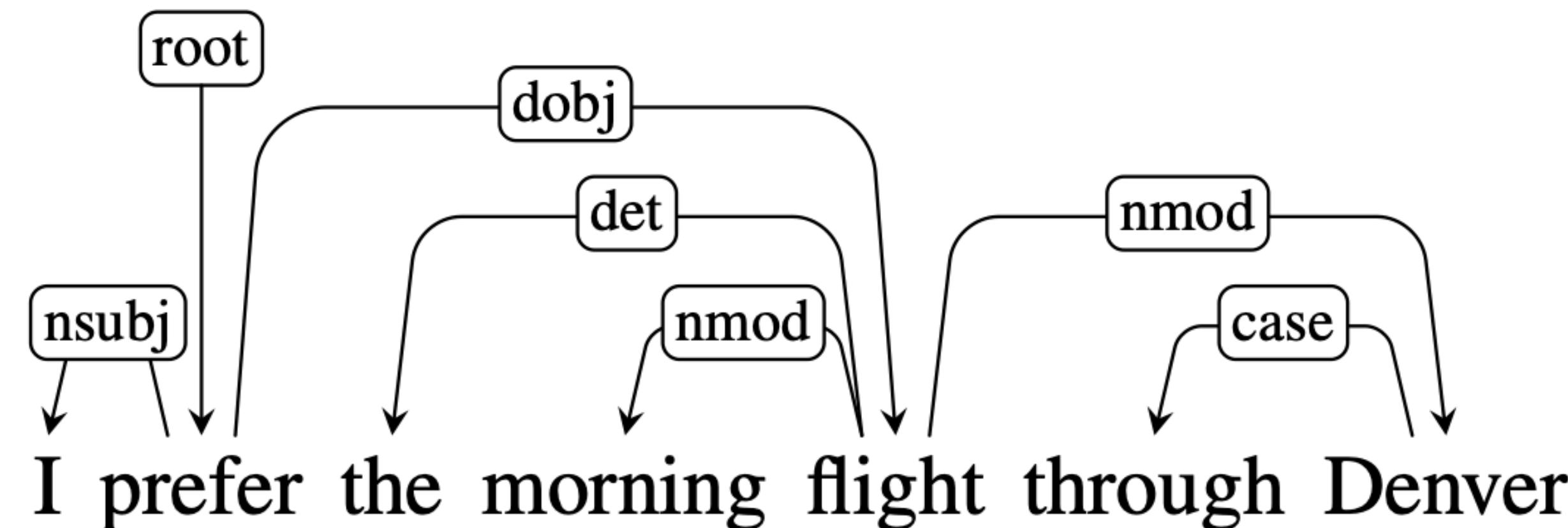
Dependency Grammar



Dependency Grammars

DAG == directed acyclic graph

- (1) dependency grammar lacks phrasal nodes;
- (2) instead the structure consists of lexical elements linked by **binary dependency relations**
- (3) It is a DAG between the words in the surface sentence edges are labeled with syntactic functions (such as SUBJ, OBJ, MOD, etc.).



Dependency Grammars

- (1) The dependency grammar tradition constitutes a diverse family of different formalisms
 - (1) different constraints on the dependency relation (such as allowing or disallowing crossing edges),
 - (2) incorporate different extensions (such as feature terms).
- (2) A major advantage of dependency grammars is their ability to deal with languages that are morphologically rich and have a **relatively free word order** (e.g. Russian)

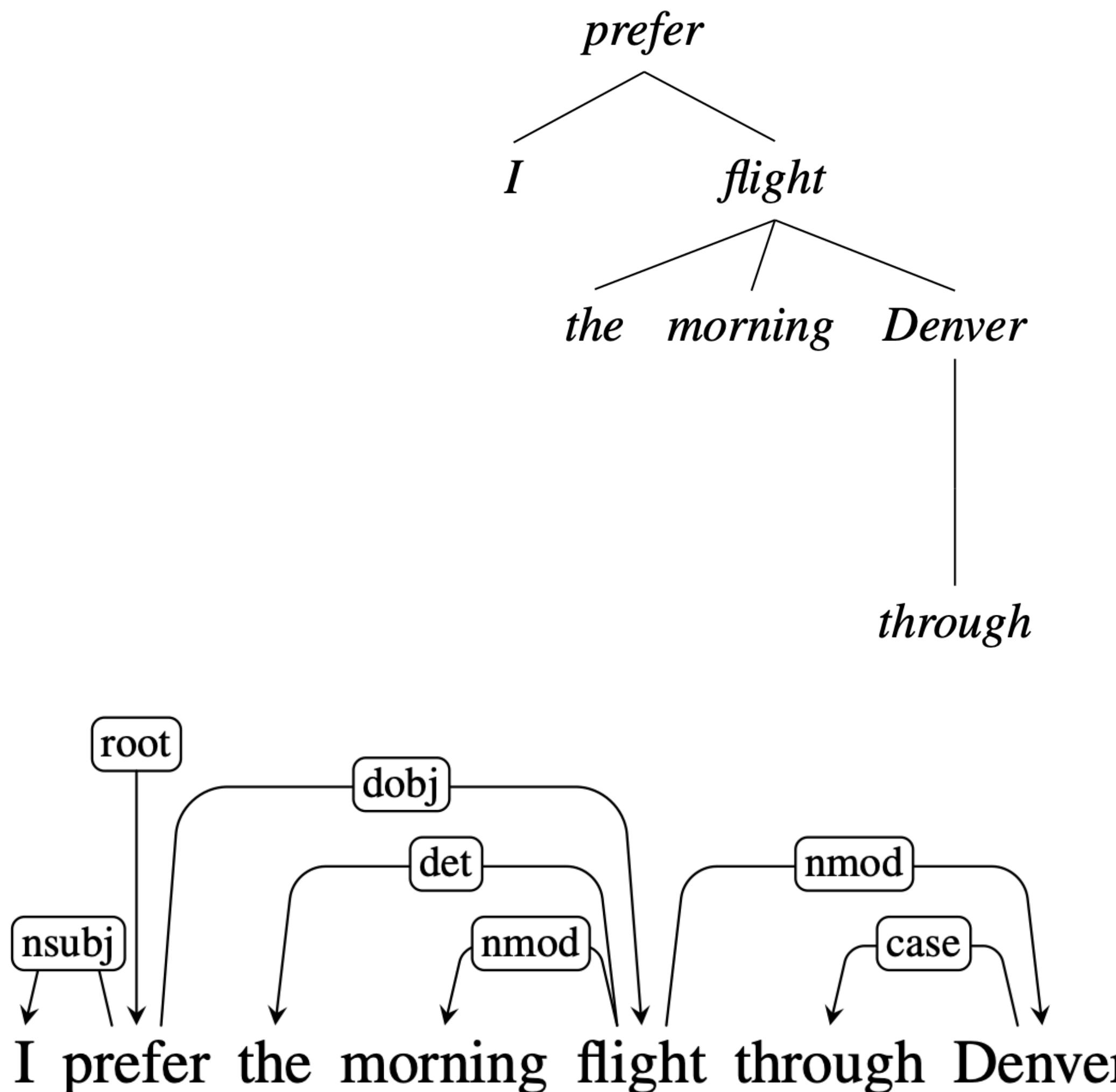
Dependency Tree

Definition

- (1) A dependency tree is a directed graph $G=(V,E)$ that satisfies the following constraints:
 - (1) There is a single designated **root node that has no incoming arcs**
 - (2) With the exception of the root node, **each vertex has exactly one incoming arc**
 - (3) There is a unique path from the root node to each vertex in V
- (2) which means that:
 - (1) each word has a single head,
 - (2) the dependency structure is connected,
 - (3) there is a single root node from which one can follow a unique directed path to each of the words in a sentence

Example. PSG vs. Dependencies

I prefer the morning flight through Denver.



Dependency Relations

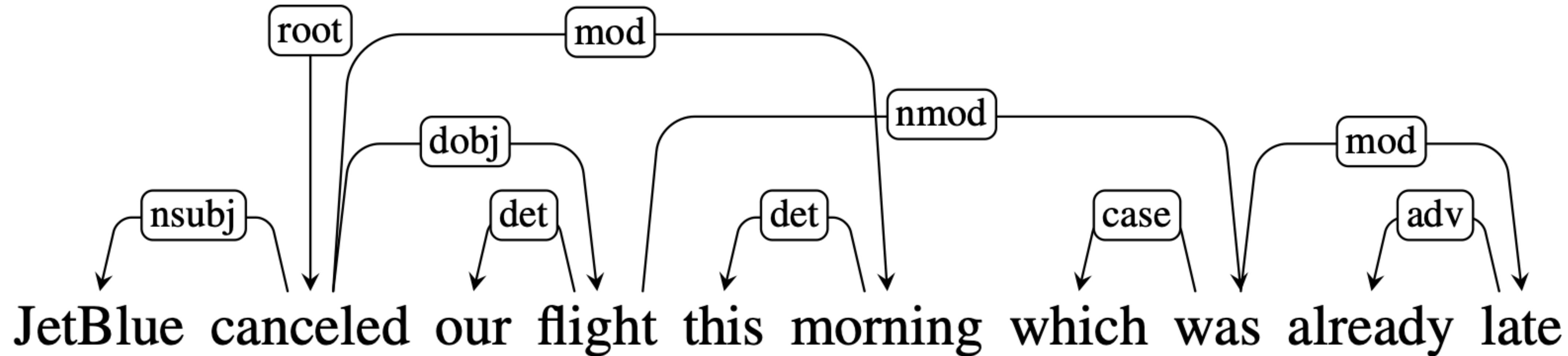
core Universal Dependency relations

Relation	Examples with <i>head</i> and dependent
NSUBJ	United <i>canceled</i> the flight.
DOBJ	United <i>diverted</i> the flight to Reno. We <i>booked</i> her the first flight to Miami.
IOBJ	We <i>booked</i> her the flight to Miami.
NMOD	We took the morning flight .
AMOD	Book the cheapest flight .
NUMMOD	Before the storm JetBlue canceled 1000 flights .
APPOS	<i>United</i> , a unit of UAL, matched the fares.
DET	The flight was canceled. Which flight was delayed?
CONJ	We <i>flew</i> to Denver and drove to Steamboat.
CC	We flew to Denver and drove to Steamboat.
CASE	Book the flight through Houston .

Projectivity

an additional constraint

- (1) Example of a non-projective arc: flight -> was
- (2) non-projective means have crossing arcs (which cannot be avoided)



Transition-Based Dependency Parsing

Shift-Reduce algorithm

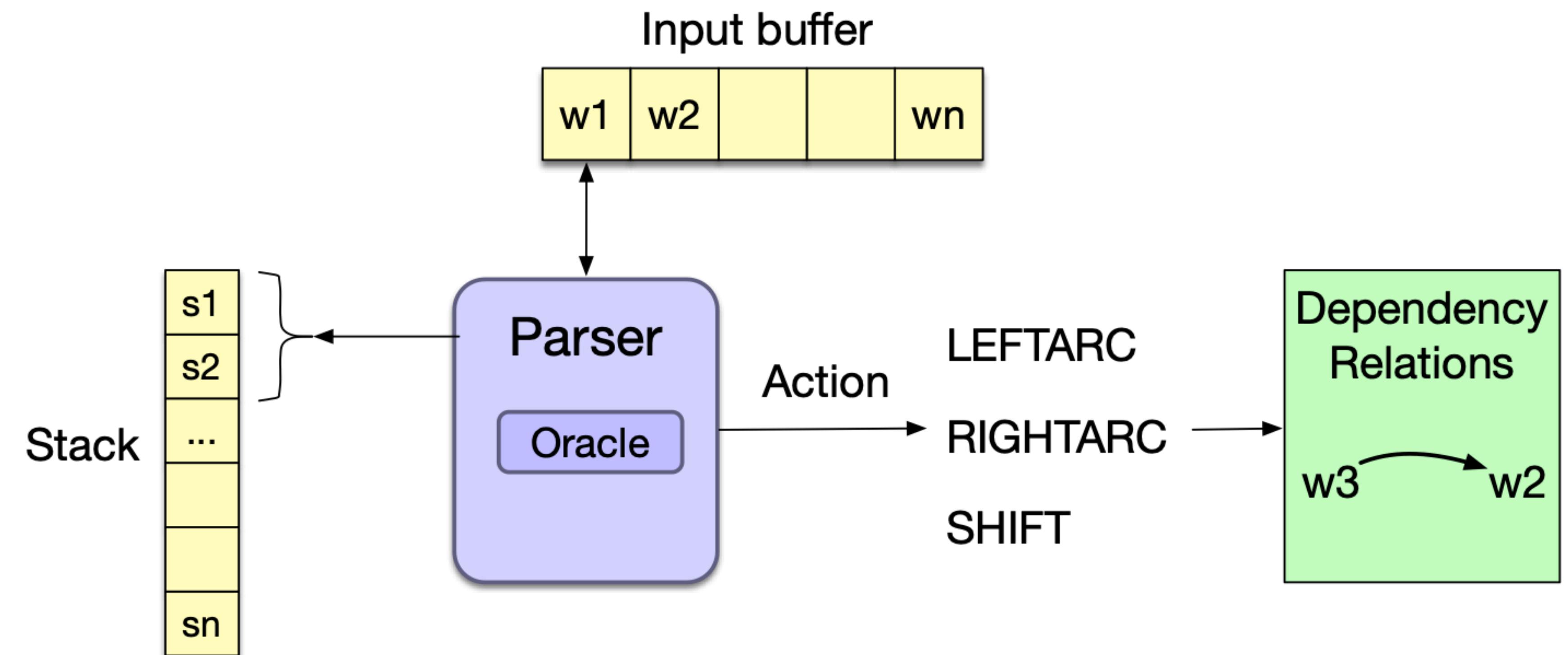
(1) Components:

(1) Stack

(2) Buffer

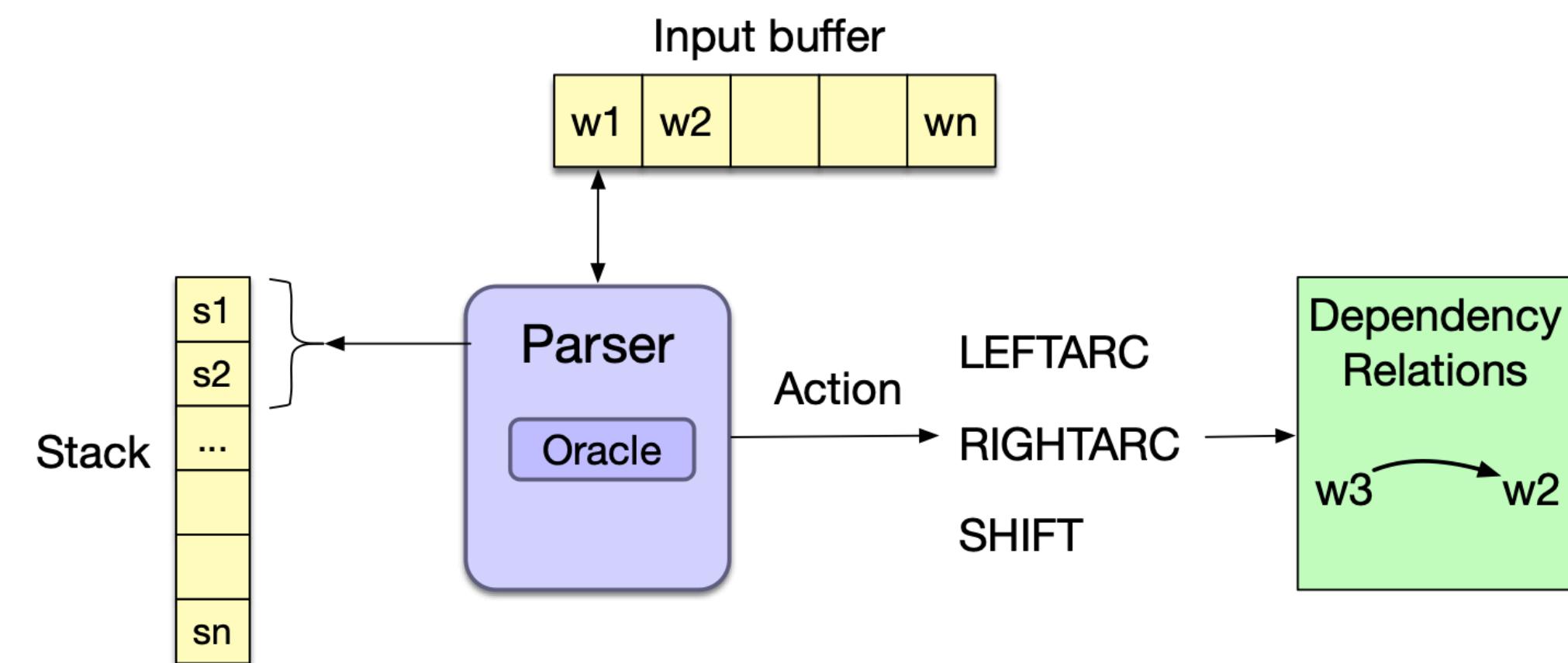
(3) Parser

(2) 3 Actions



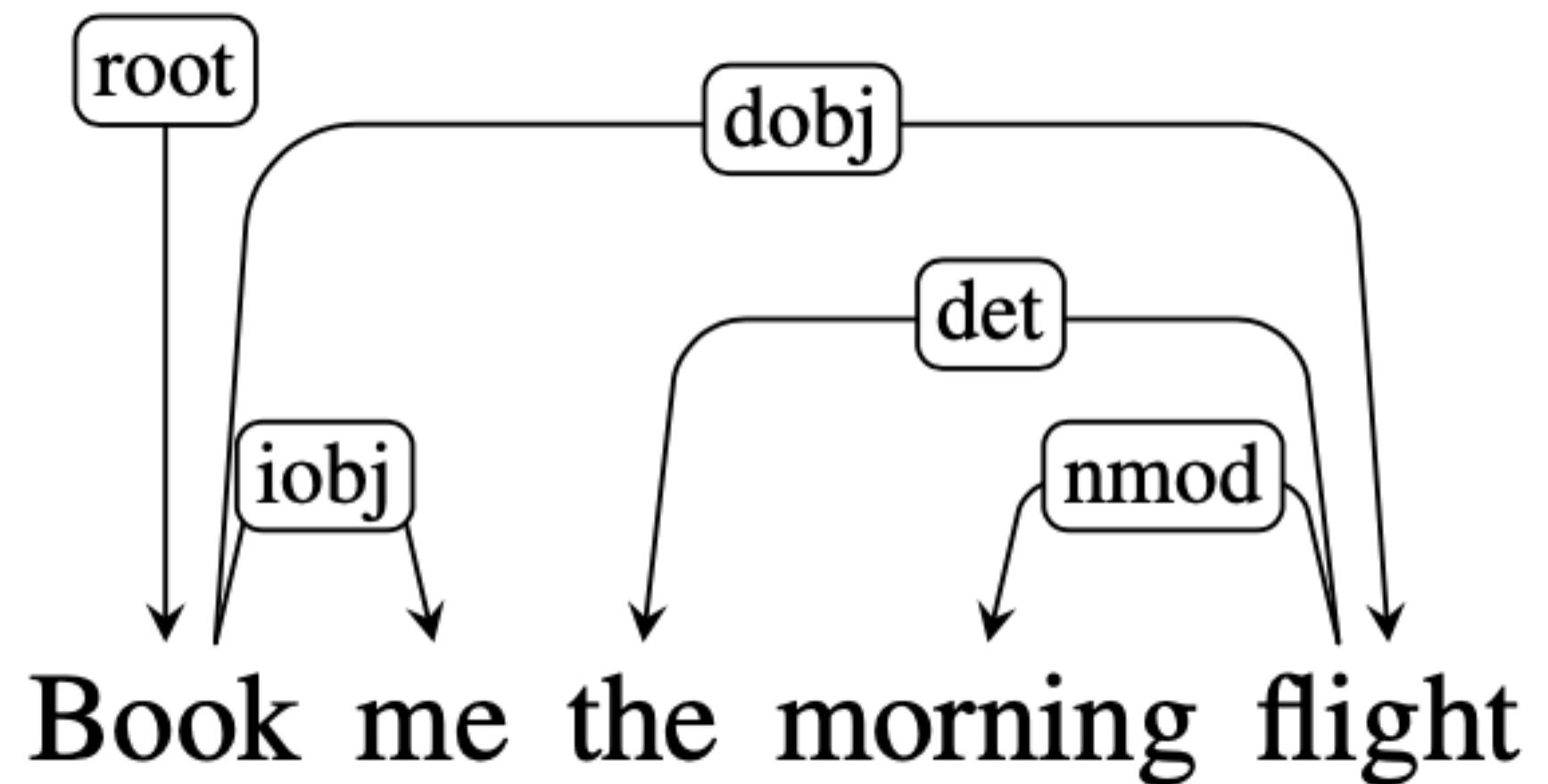
Transitions (aka Actions)

- (1) following three transition operators that will act on the **top two elements** of the stack:
- (1) **LEFTARC**: Assert a head-dependent relation between the word at the top of the stack and the second word; remove the second word from the stack.
 - (2) **RIGHTARC**: Assert a head-dependent relation between the second word on the stack and the word at the top; remove the top word from the stack;
 - (3) **SHIFT**: Remove the word from the front of the input buffer and push it onto the stack.



Configuration

- (1) the stack,
- (2) an input buffer of words or tokens, and
- (3) a set of relations representing a dependency tree.



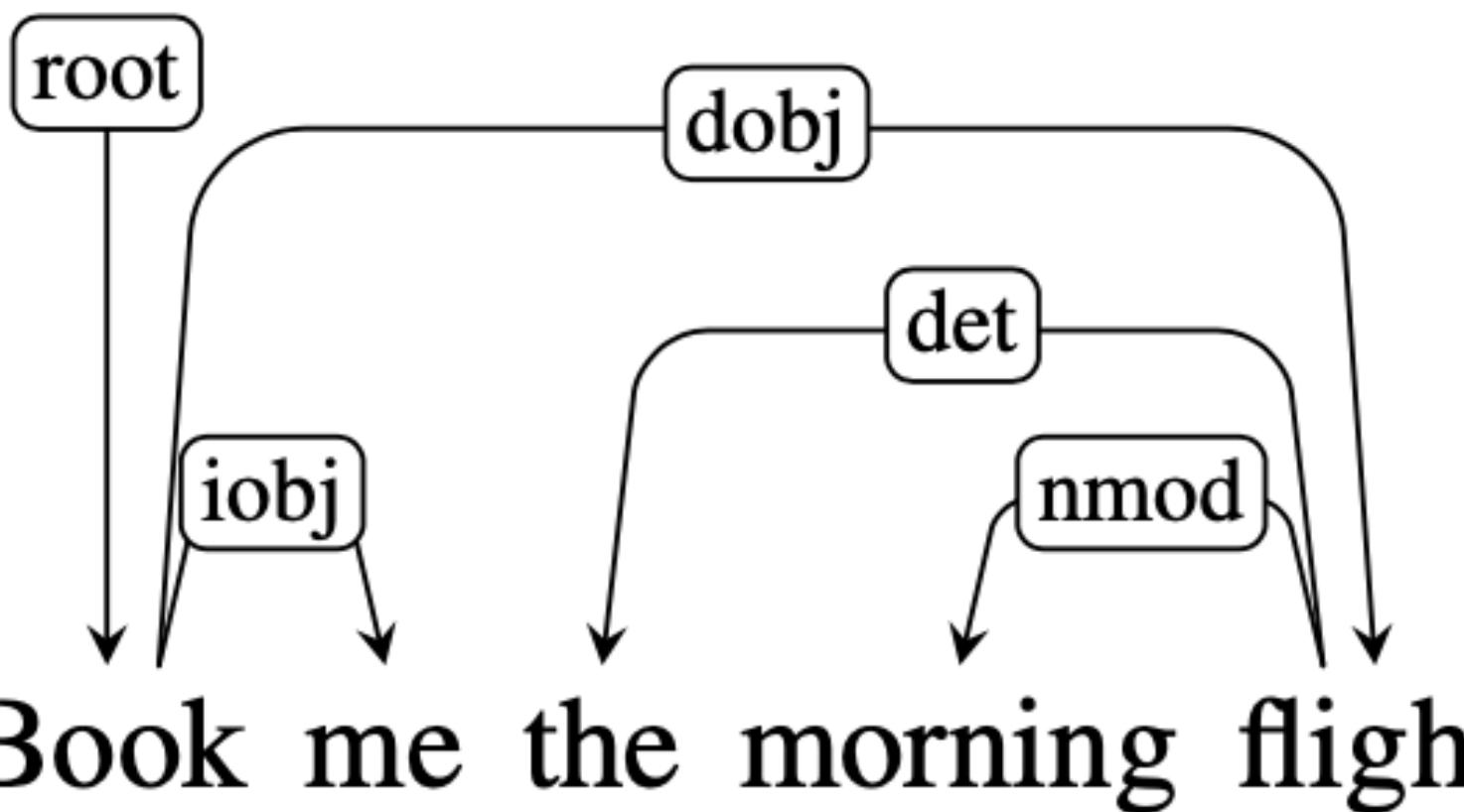
Stack	Word List	Relations
[root, book, me]	[the, morning, flight]	

Dependency parser

A generic transition-based dependency parser

```
function DEPENDENCYPARSE(words) returns dependency tree  
  
state  $\leftarrow \{[\text{root}], [\text{words}], []\}$  ; initial configuration  
while state not final  
    t  $\leftarrow \text{ORACLE}(\textit{state})$  ; choose a transition operator to apply  
    state  $\leftarrow \text{APPLY}(t, \textit{state})$  ; apply it, creating a new state  
return state
```

Example



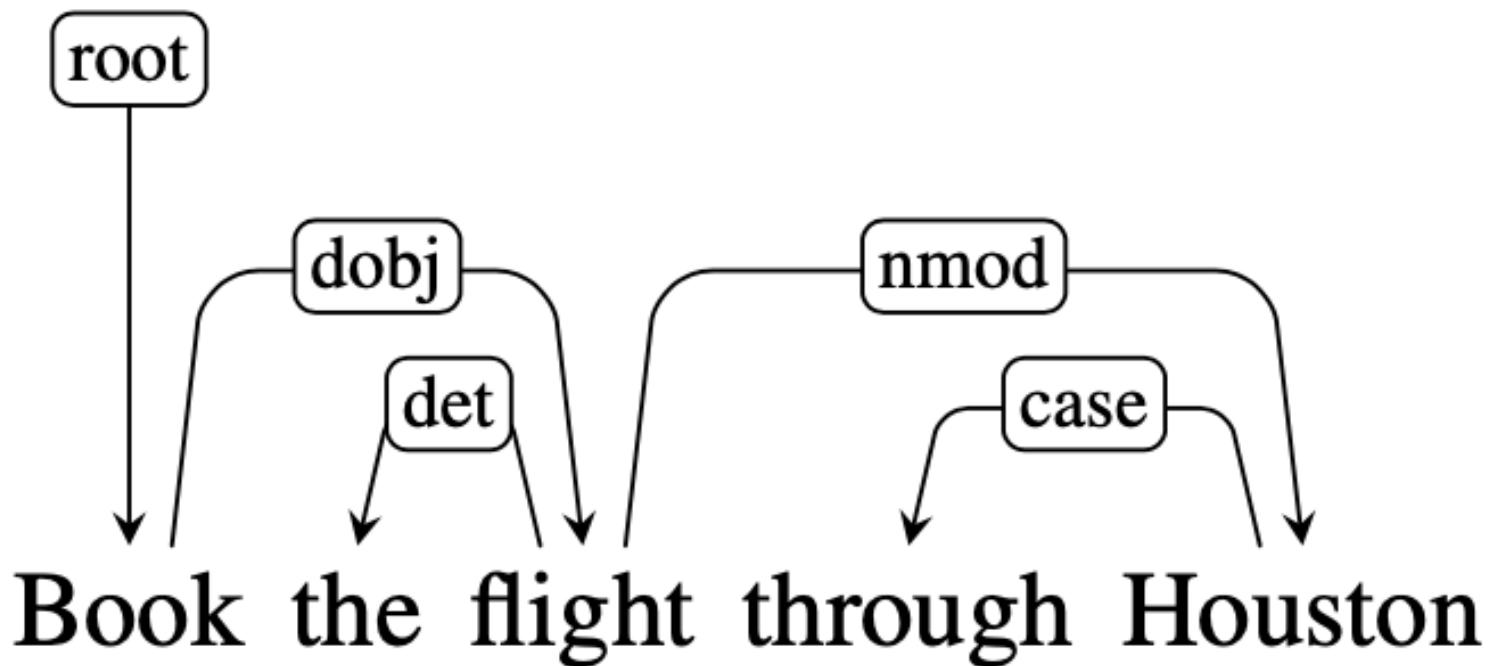
Step	Stack	Word List	Action	Relation Added
0	[root]	[book, me, the, morning, flight]	SHIFT	
1	[root, book]	[me, the, morning, flight]	SHIFT	
2	[root, book, me]	[the, morning, flight]	RIGHTARC	(book → me)
3	[root, book]	[the, morning, flight]	SHIFT	
4	[root, book, the]	[morning, flight]	SHIFT	
5	[root, book, the, morning]	[flight]	SHIFT	
6	[root, book, the, morning, flight]	[]	LEFTARC	(morning ← flight)
7	[root, book, the, flight]	[]	LEFTARC	(the ← flight)
8	[root, book, flight]	[]	RIGHTARC	(book → flight)
9	[root, book]	[]	RIGHTARC	(root → book)
10	[root]	[]	Done	

Training the Oracle

- (1) Reference parses come from TreeBanks (syntactically annotated sentences).
- (2) Given a reference parse and a configuration, the training oracle proceeds as follows:
 - (1) Choose **LEFTARC** if it produces a correct head-dependent relation given the reference parse and the current configuration,
 - (2) Otherwise, choose **RIGHTARC** if
 - (1) it produces a correct head-dependent relation given the reference parse and
 - (2) all of the dependents of the word at the top of the stack have already been assigned,
 - (3) Otherwise, choose **SHIFT**.

Example

Reference

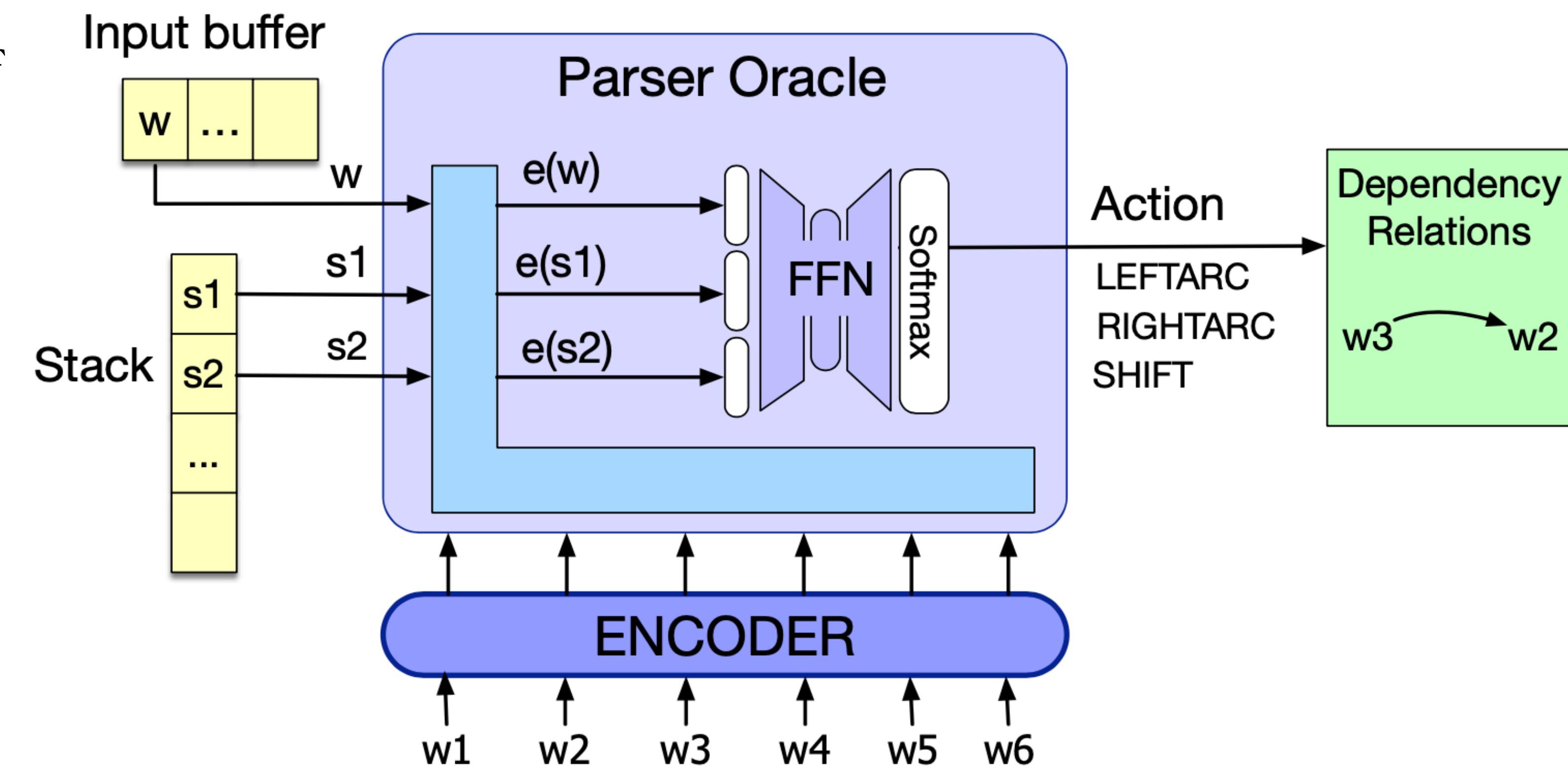


How to use it in training of a feature-based classifier ?

Step	Stack	Word List	Predicted Action
0	[root]	[book, the, flight, through, houston]	SHIFT
1	[root, book]	[the, flight, through, houston]	SHIFT
2	[root, book, the]	[flight, through, houston]	SHIFT
3	[root, book, the, flight]	[through, houston]	LEFTARC
4	[root, book, flight]	[through, houston]	SHIFT
5	[root, book, flight, through]	[houston]	SHIFT
6	[root, book, flight, through, houston]	[]	LEFTARC
7	[root, book, flight, houston]	[]	RIGHTARC
8	[root, book, flight]	[]	RIGHTARC
9	[root, book]	[]	RIGHTARC
10	[root]	[]	Done

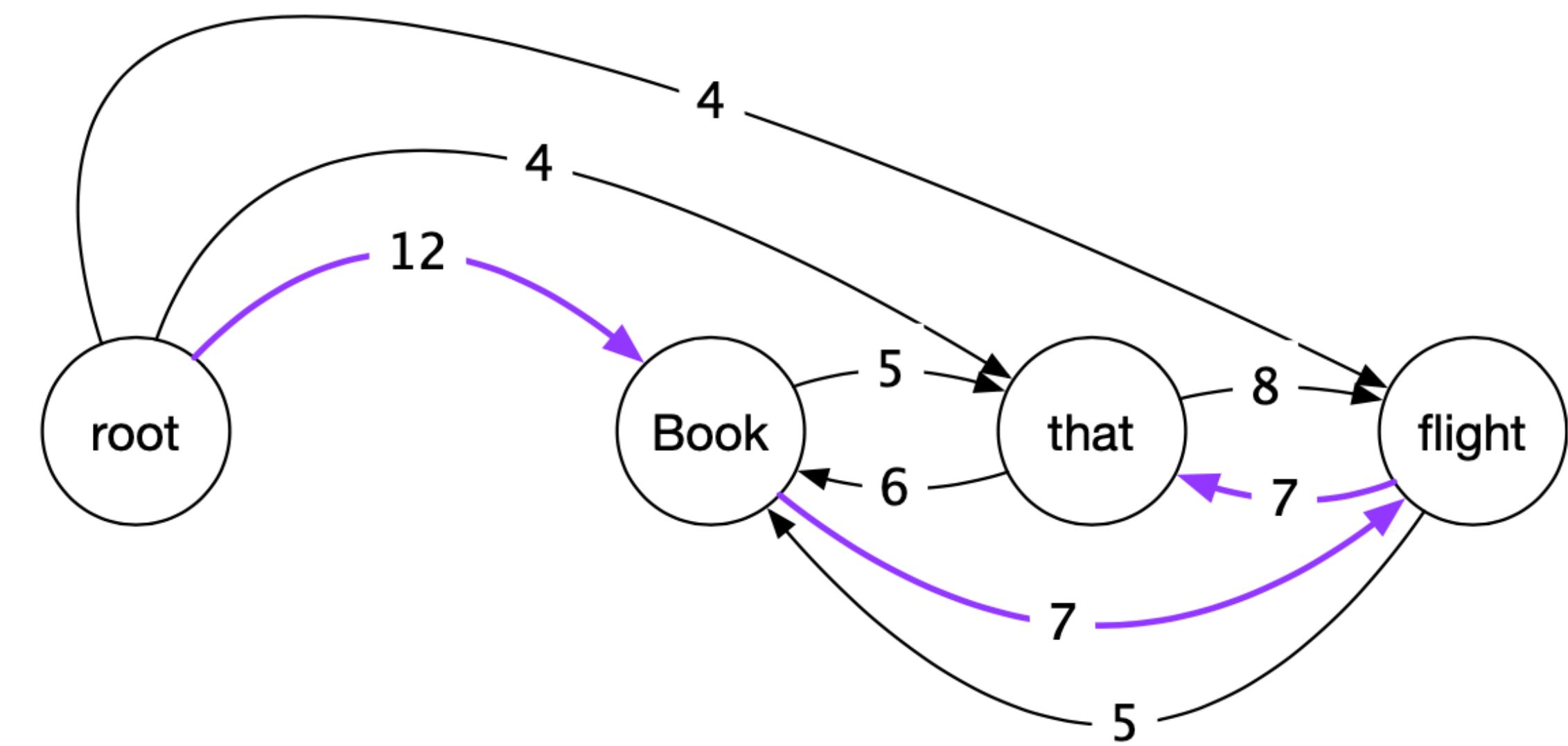
A neural classifier

- (1) The parser takes the top 2 words on the stack and the first word of the buffer,
- (2) Represents them by their encodings (from running the whole sentence through the encoder),
- (3) concatenates the embeddings and passes through a softmax to choose a parser action (transition)



Graph-based parsers

- (1) Transition-based parsing systems employ a greedy stack-based algorithm to create dependency structures
- (2) **Graph-based methods** for creating dependency structures are based on the use of **maximum spanning tree** methods from graph theory
- (3) Both transition-based and graph-based approaches are developed using supervised machine learning techniques



Summary