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CKY discussion session

Syntactic parsing

2023

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Mostly based on slides from Marco Kuhlmann



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CNF conversion



Restrictions

- The original CKY algorithm can only handle rules that are at most binary:
 $C \rightarrow w_i, C \rightarrow C_1 C_2 .$
- It can easily be extended to also handle unit productions:
 $C \rightarrow w_i, C \rightarrow C_1, C \rightarrow C_1 C_2 .$
- This restriction is not a problem theoretically, but requires preprocessing (binarization) and postprocessing (debinarization).
- A parsing algorithm that does away with this restriction is Earley's algorithm (Lecture 5 and J&M 13.4.2).



Treebank CNF conversion (I)

Probably easiest to solve by a recursive function. XXX represents either a list or a string

A tree is represented as a list of subtrees, e.g.

```
[S [NP [PRON they]] [VP [V like] [NP [N snow]]]]
```

List contains two strings

e.g.: ["IN", "as"]

```
return list
```

List contains two items, string and list

e.g. : ["NP" ["PRP", XXX]]

Contract the two grammar symbols, and remove one list

Apply cnf-method to the resulting tree

```
return cnf(["NP+PRP", XXX])
```

List contains three symbols, string, list, list

e.g. ["NP", ["DT", XXX], ["NNS", XXX]]

Keep as it is, and apply cnf-method to the two lists

```
return ["NP", cnf(["DT", XXX]), cnf(["NNS", XXX])]
```



Treebank CNF conversion (2)

List contains more than three symbols, string, list,
list, list, ...

e.g. ["S", ["NP", XXX], ["VP", XXX], [".", XXX]]

Keep first two items, create an extra list with
new label to which you give a "new" label.

Apply cnf to the resulting tree

```
return cnf(["S", ["NP", XXX],  
           ["new-name", ["VP", XXX], [".", XXX]])
```

think about the naming and markovization!

List contains something else:

Something has gone wrong!



CNF Conversion task

- Note a small change in the assignment from previous years:
 - Instead of changing the list "in-place", you are now required to return the new list.
 - This change was made as a simplification, since many students previously struggled with the in-place conversion
 - Please disregard any mention of in-place conversion that are still in the recordings



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The CKY algorithm



Overview of the CKY algorithm

- The CKY algorithm is an efficient bottom-up parsing algorithm for context-free grammars.
- It was discovered at least three (!) times and named after Cocke, Kasami, and Younger.
- It is one of the most important and most used parsing algorithms.



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Recognition

Recognizing small trees

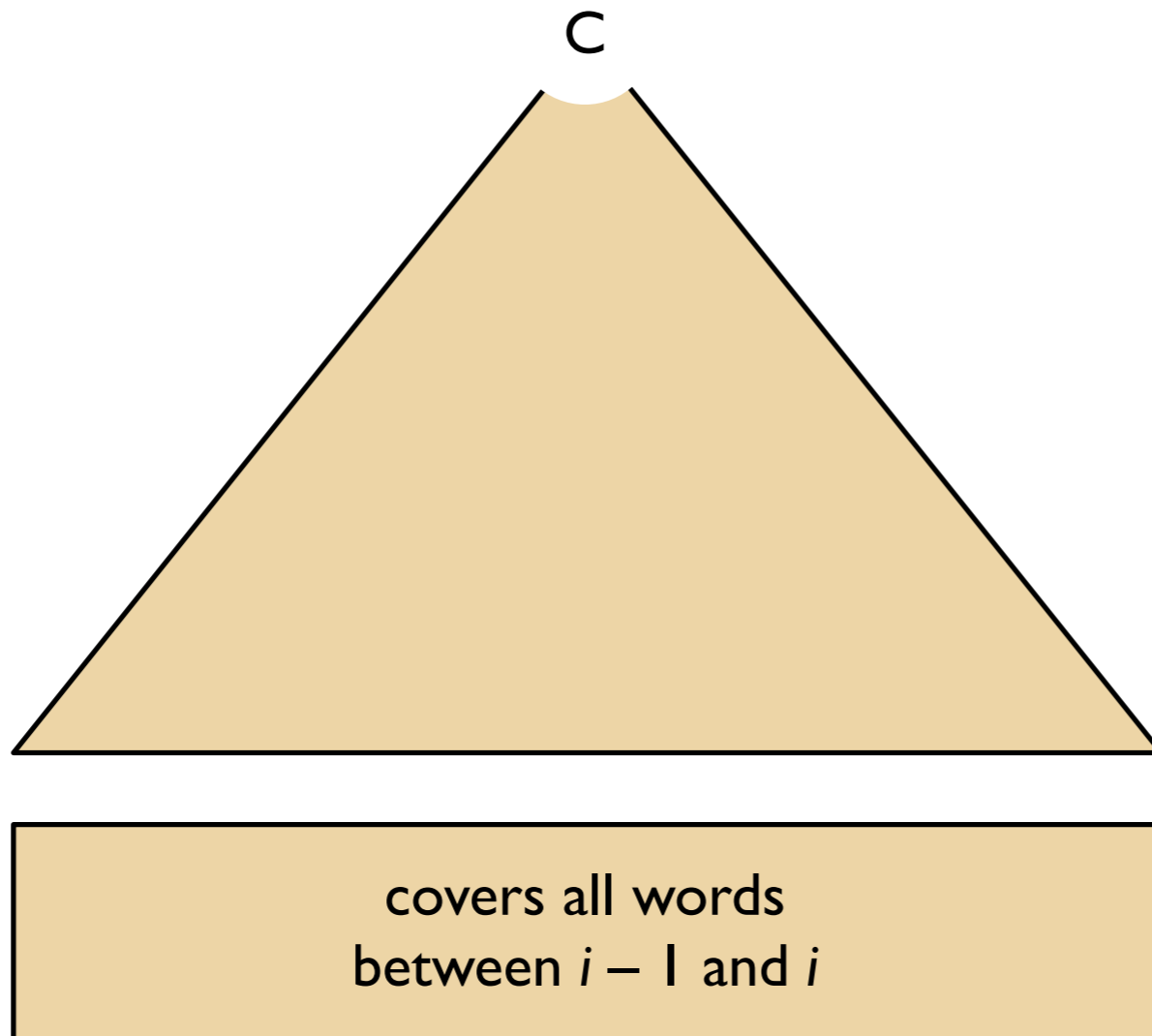




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Recognition

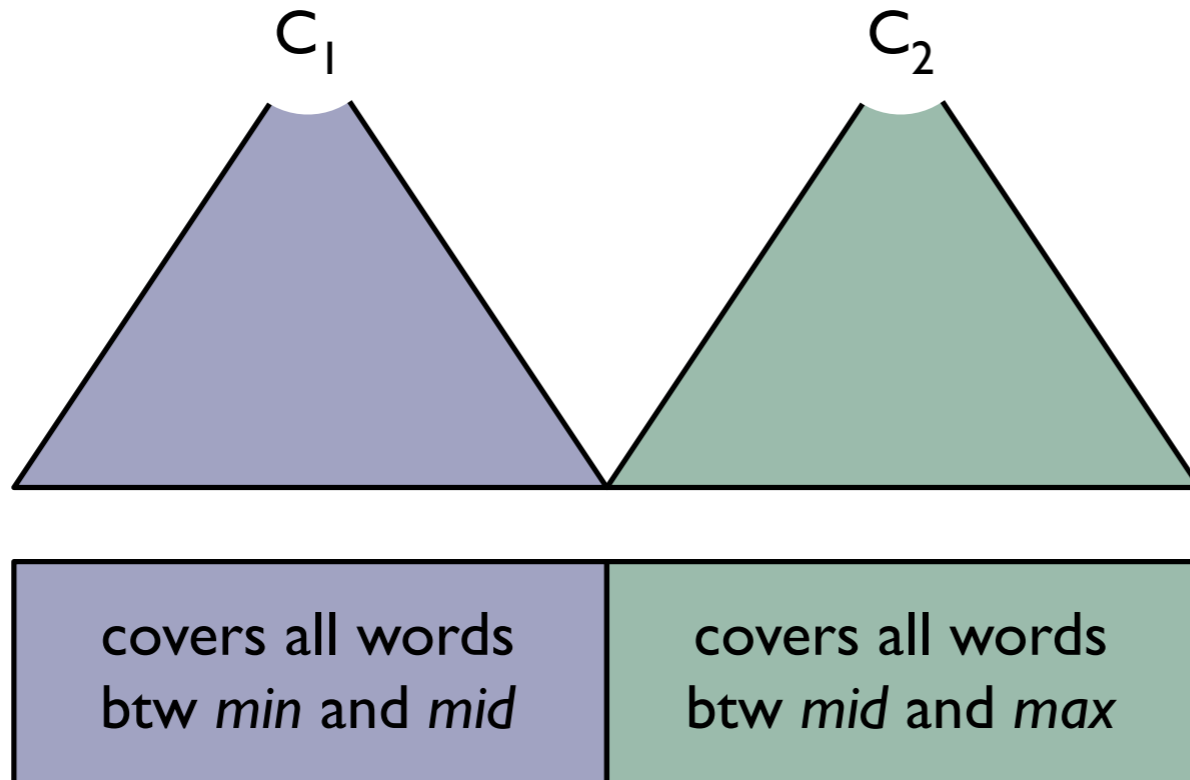
Recognizing small trees





Recognizing big trees

$$C \rightarrow C_1 C_2$$

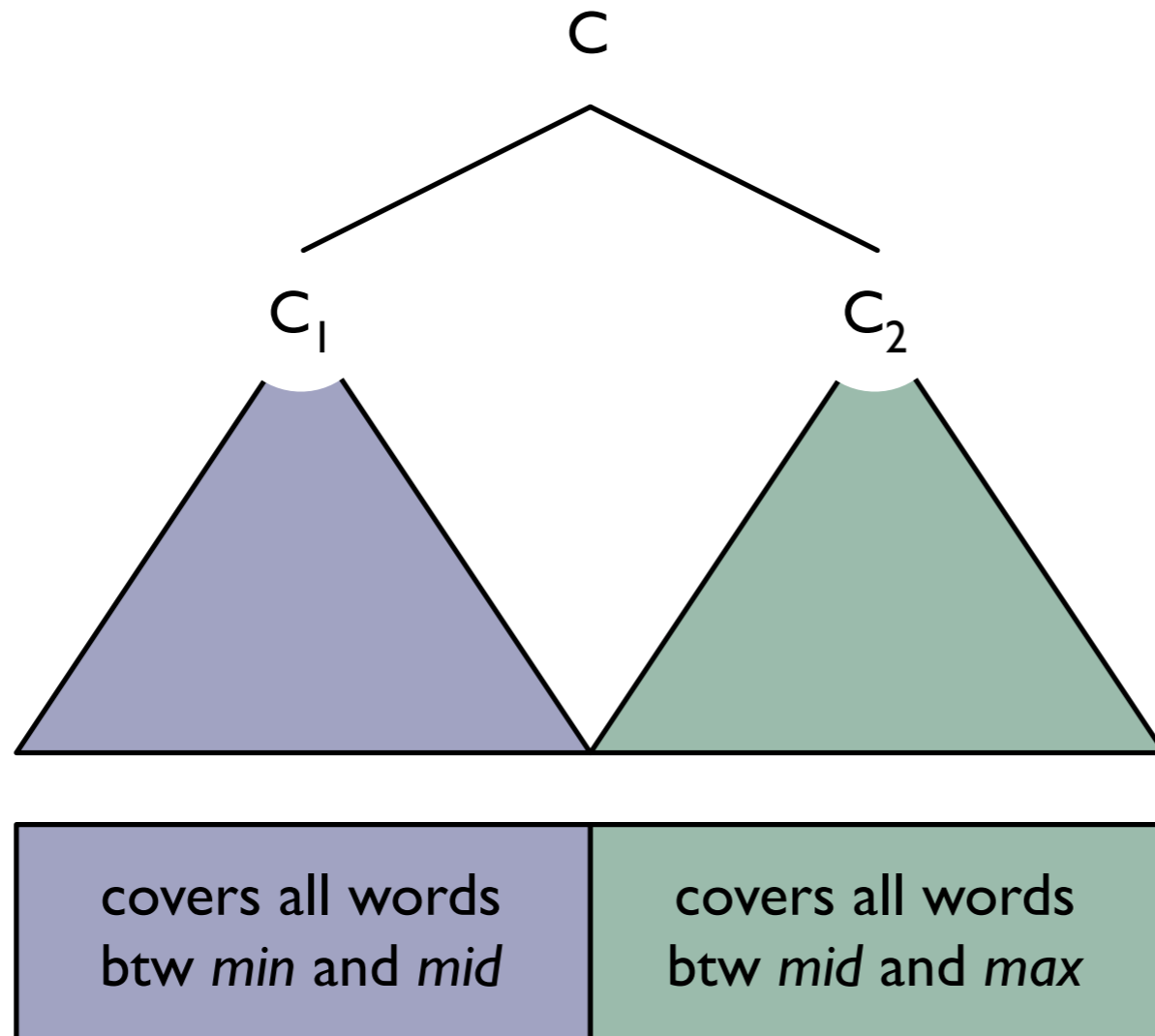




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Recognition

Recognizing big trees

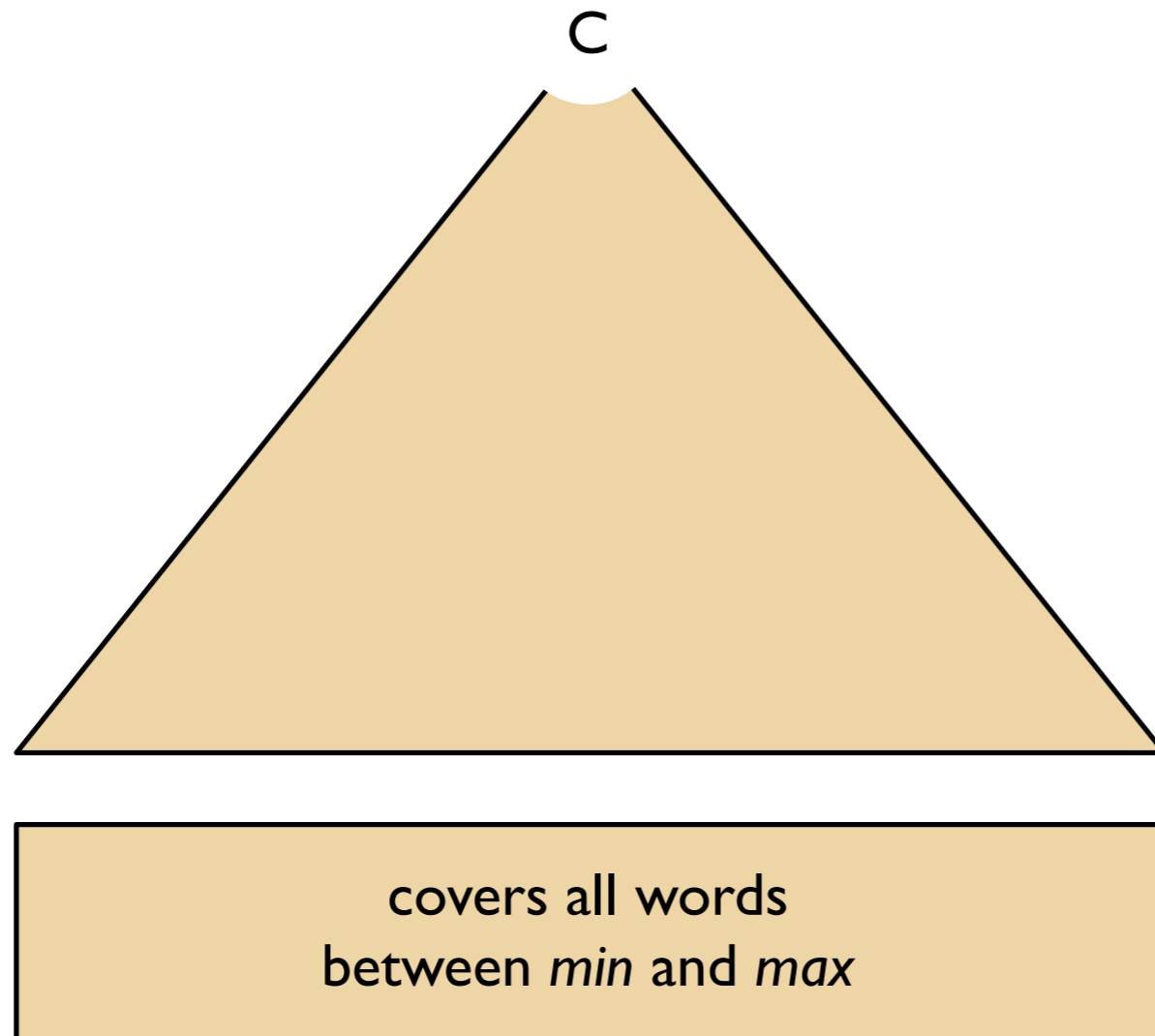




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Recognition

Recognizing big trees





Questions, CKY recognition

- How do we know that we have recognized that the input sequence is grammatical?
- How do we need to extend this reasoning in the presence of unary rules: $C \rightarrow C_1$?



Questions

- What is the signature of a parse tree for the complete sentence?
- How many different signatures are there?
- Can you relate the runtime of the parsing algorithm to the number of signatures?



Questions

- What is the signature of a parse tree for the complete sentence?
 - $[0, n, S]$
- How many different signatures are there?
 - $n^2 * G$
- Can you relate the runtime of the parsing algorithm to the number of signatures?
 - $n^3 * G$



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Implementation CKY recognizer



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Implementation

Preterminal rules

```
for each  $w_i$  from left to right
```

```
  for each preterminal rule  $C \rightarrow w_i$ 
```

```
    chart[i - 1][i][C] = true
```



Binary rules

```
for each max from 2 to n
  for each min from max - 2 down to 0
    for each syntactic category C
      for each binary rule C -> C1 C2
        for each mid from min + 1 to max - 1
          if chart[min][mid][C1] and chart[mid][max][C2] then
            chart[min][max][C] = true
```



Questions, CKY recognizer

- In what way is this algorithm bottom–up?
- Why is that property of the algorithm important?
- How do we need to extend the code if we wish to handle unary rules $C \rightarrow C_1$?
- Why would we want to do that?



Unary rules

```
for each max from 1 to n
    for each min from max - 1 down to 0
        // First, try all binary rules as before.
        ...
        // Then, try all unary rules.
        for each syntactic category C
            for each unary rule C -> C1
                if chart[min][max][C1] then
                    chart[min][max][C] = true
```

← new bounds!



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Implementation

Question, unary rules

This is not quite right.

Why, and how could we fix the problem?



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CKY parser



Idea

- **For trees built using preterminal rules:**
Find a most probable rule. (apply all rules!)
- **For trees built using binary rules:**
Find a binary rule r and a split point mid such that $p(r) \times p(t_1) \times p(t_2)$ is maximal, where t_1 is a most probable left subtree and t_2 is a most probable right subtree.



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Probabilistic parsing

Preterminal rules

for each w_i from left to right

for each preterminal rule $C \rightarrow w_i$

$\text{chart}[i - 1][i][C] = p(C \rightarrow w_i)$



Binary rules

```
for each max from 2 to n
  for each min from max - 2 down to 0
    for each syntactic category C
      double best = undefined
      for each binary rule C -> C1 C2
        for each mid from min + 1 to max - 1
          double t1 = chart[min][mid][C1]
          double t2 = chart[mid][max][C2]
          double candidate = t1 * t2 * p(C -> C1 C2)
          if candidate > best then
            best = candidate
      chart[min][max][C] = best
```



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Probabilistic parsing

Question

How should we treat unary rules?



Backpointers

- When we find a new best parse tree, we want to remember how we built it.
- For each element $t = \text{chart}[min][max][C]$, we also store **backpointers** to those elements from which t was built.
- Besides the ordinary chart of floats, we also have a backpointer chart



Preterminal rules

for each w_i from left to right

for each preterminal rule $C \rightarrow w_i$

$\text{chart}[i - 1][i][C] = p(C \rightarrow w_i)$

$\text{backpointerChart}[i-1][i][C] = (C, w_i, i, i-1)$



Backpointers

```
double best = undefined

Backpointer backpointer = undefined

...

if candidate > best then

    best = candidate

    // We found a better tree; update the backpointer!

    backpointer = (C, C1, C2, min, mid, max)

...

chart[min][max][C] = best

backpointerChart[min][max][C] = backpointer
```



Backtrace

Convenient to use recursion to retrieve the tree!

```
# assume backpointers are tuples:
```

```
# Preterminal: (C, w, min, max)
```

```
# Binary: (C, C1, C2, min, mid, max)
```

```
backtrace(bp, bpChart):
```

```
    if length(bp) == 4: #preterminal rule
```

```
        return tree for C, w
```

```
    else if length(bp) == 6 #binary rule
```

```
        return tree for C, backtrace(left subtree), backtrace(right  
subtree)
```

Implementation

Implementation ideas, Python

```
# defaultdict is a suitable datastructure for charts!  
# Index the defaultdicts with a tuple (min, max, cat)  
    pi = defaultdict(float)  
    bp = defaultdict(tuple)  
  
# Recognize all parse trees built with with preterminal rules.  
# Recognize all parse trees built with binary rules.  
  
# "S" is not always the top category, the below is a simplification  
return backtrace(bp[0, n, "S"], bp);
```




Assignment I: Lab sessions

- First lab session:
 - Will be moved:
 - From: this Wednesday (Jan. 25)
 - To: Monday, Jan. 30, 10-12
- Second lab session:
 - Not scheduled at all by mistake
 - Will be in the afternoon on Feb. 8 (now scheduled for seminar I, which will be before lunch)
- TimeEdit still to be updated by these changes!



Assignment 1: CKY parsing

- **Tips:**
 - During development: use print statements to make sure your code does what you think it should
 - Use a small test set, and possibly a small grammar during development. The parser is slow
 - Start on the assignment now! Do not leave it until the last week!
 - Come to the lab sessions and ask questions!
 - You can also contact me for help!



Coming up

- Monday 10-12:
 - First lab session for CKY assignment
- Next theme:
 - Treebanks and Earley's algorithm (JM: 17.3)
 - Recorded lectures and exercises will be available in Studium
 - Lecture Monday 13-15
 - Seminar I: Wednesday February 8
 - Groups+times will be posted on the web page