Algorithms \& Models of Computation

## CS/ECE 374, Fall 2020

## 13.3

Checking if a string is in $L^{*}$

## Problem

Input A string $\boldsymbol{w} \in \Sigma^{*}$ and access to a language $L \subseteq \Sigma^{*}$ via function Is $\operatorname{lnL}($ string $x)$ that decides whether $x$ is in $L$
Goal Decide if $\boldsymbol{w} \in L^{*}$ using IsInL(string $\boldsymbol{x}$ ) as a black box sub-routine

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## Example 13.1.

Suppose $L$ is English and we have a procedure to check whether a string/word is in the English dictionary.

- Is the string "isthisanenglishsentence" in English*?
- Is "stampstamp" in English*?
- Is "zibzzzad" in English*?


## Recursive Solution

When is $w \in L^{*}$ ?

```
w}\in\mp@subsup{L}{}{*}\Longleftrightarroww\inL\mathrm{ or if w}=|v\mp@code{where }u\in\mp@subsup{L}{}{*}\mathrm{ and }v\inL,|v|\geq
```

Assume $w$ is stored in array $A[1 \ldots n]$

```
IslnL*}(A[1..n])
    If (\boldsymbol{n}=0) Output YES
    If (IslnL(A[1..n]))
        Output YES
    El.se
        For (i=1 to n-1) do
            If IslnL*}(A[1..i]) and IslnL(A[i+1..n]
                Output YES
    Output NO
```


## Recursive Solution

When is $w \in L^{*}$ ?

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w \in L^{*} \Longleftrightarrow w \in L \text { or if } w=\boldsymbol{u} v \text { where } \boldsymbol{u} \in \boldsymbol{L}^{*} \text { and } v \in L,|v| \geq 1 .
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Output NO

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Output NO
Question: How many distinct sub-problems does IsInL* $(\boldsymbol{A}[1 . . n])$ generate?

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Output NO
Question: How many distinct sub-problems does IsInL* $(A[1 . . n])$ generate? $O(n)$

## Example

## Consider string samiam

## Naming subproblems and recursive equation

After seeing that number of subproblems is $\boldsymbol{O}(\mathrm{n})$ we name them to help us understand the structure better.

ISL* $(i)$ : a boolean which is 1 if $A[1 . . i]$ is in $L^{*}, 0$ otherwise

Base case: $\operatorname{ISL}^{*}(0)=1$ interpreting $\boldsymbol{A}[1 . .0]$ as $\boldsymbol{\epsilon}$ Recursive relation:

- ISL* $^{*}(\boldsymbol{i})=1$ if $\exists j, 0 \leq j<i$ s.t ISL* $(j)$ and $\operatorname{IsInL}(A[j+1 . . i])$
- ISL* $(i)=0$ otherwise

Output: ISL* (n)

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## Removing recursion to obtain iterative algorithm

Typically, after finding a dynamic programming recursion, we often convert the recursive algorithm into an iterative algorithm via explicit memoization and bottom up computation.

## Why? Mainly for further optimization of running time and space

- First, allocate a data structure (usually an array or a multi-dimensional array that can hold values for each of the subproblems)
- Figure out a way to order the computation of the sub-problems starting from the base case

Caveat: Dynamic programming is not about filling tables. It is about finding a smart recursion. First, find the correct recursion.

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## Iterative Algorithm

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IsStringinLstar-Iterative(A[1..n]):
    boolean ISL*[0..(n+1)]
    ISL*[0] = TRUE
    for i=1 to n do
        for j=0 to i-1 do
            if (ISL*[j] and IsInL(A[j+1..i]))
                ISL*[i] = TRUE
                break
if (ISL*[n] = 1) Output YES
else Output NO
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- Running time: $O\left(n^{2}\right)$ (assuming call to IslnL is $O(1)$ time)
- Space: $O(n)$


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## THE END

(for now)

