## Fun with strings: Maximal Common Subsequences

It's a new sequence created by deleting elements from the original sequence and keeping the relative order of the remaining elements

1 8 3 9 28 4 1 39 198324 2 43 2 42 99 -1

It's a new sequence created by deleting elements from the original sequence and keeping the relative order of the remaining elements

1 8 3 9 28 4 1 39 198324 2 43 2 42 99 -1

It's a new string created by deleting characters from the original string and keeping the relative order of the remaining characters

sdfjlvasdjvaiuew

It's a new string created by deleting characters from the original string and keeping the relative order of the remaining characters

sdfjlvasdjvaiuew

a is a Subsequence



no crossing allowed!

#### Indeed

'a' is a subsequence of 'What is a Subsequence?'

'uq' is not a subsequence of 'What is a Subsequence?'

#### Subsequences are not necessarily contiguous

Substrings are
contiguous → sdfjlvasdjvaiuew

Subsequences:

sdfjlvasdjvaiuew

#### Position doesn't matter in subsequences

Only the relative position of the characters is important

no

Only the relative position of the characters is important

crss

The actual positions the subsequence maps to don't matter

^ called "embeddings" or "mappings"

#### The subsequence relation is transitive

 $W \subset W' \subset W''$ 

 $\Rightarrow W \subset W''$ 

e.g.:  $s \subset seqn \subset subsequence$ 

=> s ( subsequence

#### Then, what is a common subsequence?

Well, you need something to make it common with

It's a subsequence that appears in multiple strings you are analyzing

#### Then, what is a common subsequence?

Well, you need something to make it common with

It's a subsequence that appears in multiple strings you are analyzing

Let's start easy with 2 strings

First, take two strings

Then, find a common subsequence

#### 1. first, take two strings

#### 2. then find a common subsequence

# first, take two strings then find a common subsequence

## 1. first, take two strings

2. then find a common subsequence

### 

-> fian
This is a common subsequence; is it maximal?

### 

#### -> fian

This is a common subsequence; is it maximal? No: fiaon

#### Maximality

Subsequence W of X is maximal if it is not subsequence of other subsequences

#### Maximality

Subsequence W of X is maximal if it is not subsequence of other subsequences

fian Cfiaon

Is it adcc maximal?



Is it adcc maximal?

no!



Is it adcc maximal?

no!



Is it adcc maximal?

no!



Is it adcc maximal?

no! abdcc



#### Maximality is weird

Is it e maximal?

#### eabdcacd

#### badbcdcce

#### Maximality is weird

Is it e maximal?

Yes!!

eabdcacd badbcdcce

#### Our problem

Find all MCS between two strings X and Y

#### Trivial algorithm for finding all MCSs

- 1. Find all common subsequences
- 2. Filter out non-maximal ones by applying the definition

#### Trivial algorithm for finding all MCSs

- 1. Find all common subsequences (quite a lot!)
- 2. Filter out non-maximal ones (by checking if they are subseq. of other subseq.)

#### Trivial algorithm for finding all MCSs

- 1. Find all common subsequences (quite a lot! Is it feasible?)
- 2. Filter out non-maximal ones (by checking if they are subseq. of other subseq.)

Can we do better?

to be continued...

#### Sanity check

Questions? You still with me?

#### Longest Common Subsequences

Let's take a detour

#### Easy definition:

the set of common subsequences whose length is maximum

The LCS problem consists in finding the length of an LCS

#### Use cases

DNA sequence alignment



https://doi.org/10.1787/19939019
### Use cases

#### diff



### Use cases

DNA sequence alignment

diff

Spelling error correction

Plagiarism detection

. . .



# If a common subsequence is longest

### then it is maximal



# If a common subsequence is longest

### then it is maximal

can you see why?



# If a common then it is maximal subsequence is longest

Let  $W \in LCS(X, Y)$ , suppose by contradiction W is not maximal

Then there exists some  $c \in \Sigma$  and some  $i \in [|W|]$ :  $W' = W[0, i) \cdot c \cdot W[i, |W|)$ 

is still a subsequence of X and Y

But |W'| = |W| + 1

A contradiction, as we supposed  $W \in LCS(X, Y)$ 



The LCS problem reduces to the MCS problem

If we find all MCS we can list all LCS (keep the ones with maximum length)



The LCS problem reduces to the MCS problem

If we find all MCS we can list all LCS (keep the ones with maximum length)

... and of course know the maximal length

### How do we compute one LCS for two strings?

Classical dynamic programming approach

O(mn) where m=|X|, n=|Y|

### How do we compute one LCS for two strings?



https://www.enjoyalgorithms.com/blog/longest-common-subsequence

### How do we compute one LCS for two strings?

Classical dynamic programming approach

O(mn) where m=|X|, n=|Y|



https://www.enjoyalgorithms.com/blog/longest-common-subsequence

### How many LCS are there?

let t = |X| + |Y|

let  $0 < |\Sigma| \le t$ 

let  $D(t) = max_{X,Y}|LCS(X,Y)|$ 

$$D(t) > 1.2^{t}$$
 (if t mod 6 = 0)  
$$D(t) < 1.32^{t}$$

Exponential even for two strings X and Y!!

https://arxiv.org/abs/cs/0301030

### How many LCS embeddings are there?

let t = |X| + |Y|

let  $0 < |\Sigma| \le t$ 

let  $D(t) = max_{X,Y}|LCS(X,Y)|$ 

$$D(t) > 1.2^{t}$$
 (if t mod 6 = 0)  
$$D(t) < 1.32^{t}$$

The number of embeddings is even greater!

https://arxiv.org/abs/cs/0301030

# Since $LCS \subseteq MCS$

Also the number of distinct MCS is exponential even for two strings!!

## Complexity

LCS problem

Given a set of strings S, print the length of a LCS of S

For k strings

The LCS problem is NP-Hard [Maier 1978]

For 2 strings

The LCS problem has a conditional lower bound of  $O(n^2)$  [Abboud et al. 2015] https://doi.org/10.1145/322063.322075

https://doi.org/10.1109/FOCS.2015.14

## Complexity

LCS problem

Given a set of strings S, print the length of a LCS of S

#### For 2 strings

The LCS problem has a conditional lower bound of  $O(n^2)$  [Abboud et al. 2015]

-> based on the Strong Exponential Time Hypothesis (SETH).

-> it states that  $\lim_{k\to\infty} s_k = 1$ , where  $s_k = \inf\{\delta | k$ -SAT can be solved in  $O(2^{\delta n})$  time}.

https://doi.org/10.1109/FOCS.2015.14

# Enough theory

Let's play with some example

### Back to our plan

Too many!

- 1. Find all common subsequences (quite a lot! Is it feasible?)
- 2. Filter out non-maximal ones (by checking if they are subseq. of other subseq.)

We cannot do it without knowing the other subsequences

# How do we check maximality?

If we don't have other subsequences?

# How do we check maximality?

The curtain algorithm



# How do we check maximality?

The curtain algorithm

Sorry, low budget



Take any input embedding

Take any input embedding

Make it leftmost\*

Take any input embedding

Make it leftmost\*

\*the embedding of W is leftmost if its last match is  $(g_W, h_W)$  where  $X[0, g_W)$  and  $Y[0, h_W)$  are the shortest prefixes of X and Y that contain W

Take any input embedding

Make it leftmost\*

\*the embedding of W is leftmost if its last match is  $(g_W, h_W)$  where  $X[0, g_W)$  and  $Y[0, h_W)$  are the shortest prefixes of X and Y that contain W

-> the definition of rightmost is analogous and uses the shortest suffixes

Take any input embedding

Make it leftmost

Make it rightmost

one piece at a time

and check for insertions

(the substrings in between should be non-overlapping)

Is it adcc maximal?

Take any input embedding



Is it adcc maximal?

Take any input embedding

Make it leftmost



Is it adcc maximal?

Take any input embedding

Make it leftmost



Make it rightmost

one piece at a time

Is it adcc maximal?

Take any input embedding

Make it leftmost



one piece at a time



Is it adcc maximal?

Take any input embedding

Make it leftmost



Make it rightmost

one piece at a time

Is it adcc maximal?

Take any input embedding

Make it leftmost



one piece at a time



Take any input embedding

Make it leftmostXshortest prefix $X_k$ shortest suffixYshortest prefixYshortest suffixMake it rightmostvicontainingvcontainingWW[0,k)disjointW[k, |W|)

https://doi.org/10.1007/s00453-021-00898-5

and check for insertions  $W \in MCS(X, Y) \Leftrightarrow \forall k \in [|W|], X_k \cap Y_k = \emptyset$ 

(the substrings in between should be non-overlapping);

### The curtain algorithm - why does it work?

 $W \in MCS(X,Y) \Leftrightarrow \forall k \in [|W|], X_k \cap Y_k = \emptyset$ 

(=>) contrapositive Suppose  $\exists k^* \in [|W|],$  $c \in \Sigma : c \in X_{k^*} \cap Y_{k^*}$ 



https://doi.org/10.1007/s00453-021-00898-5

### The curtain algorithm - why does it work?

 $W \in MCS(X,Y) \Leftrightarrow \forall k \in [|W|], X_k \cap Y_k = \emptyset$ 

(=>) contrapositive Suppose  $\exists k^* \in [|W|],$   $c \in \Sigma : c \in X_{k^*} \cap Y_{k^*}$ then  $W[0, k^*) \cdot c \cdot W[k^*, |W|)$ is common subsequence



https://doi.org/10.1007/s00453-021-00898-5

### The curtain algorithm - why does it work?

X

shortest prefix

 $W \in MCS(X,Y) \Leftrightarrow \forall k \in [|W|], X_k \cap Y_k = \emptyset$ 

(=>) contrapositive Suppose  $\exists k^* \in [|W|],$   $c \in \Sigma : c \in X_{k^*} \cap Y_{k^*}$ then  $W[0, k^*) \cdot c \cdot W[k^*, |W|)$ is common subsequence

$$\begin{array}{c} Y \text{ shortest prefix} \\ \text{containing} \\ W \\ \hline W[0,k) \\ \end{array} \\ \begin{array}{c} Y_k \\ \text{shortest suffix} \\ \text{containing} \\ \hline W[k,|W|) \\ \hline W[k,|W|) \\ \end{array} \end{array}$$

https://doi.org/10.1007/s00453-021-00898-5

shortest suffix

But 
$$W \subset W[0, k^*) \cdot c \cdot W[k^*, |W|)$$
  
=>  $W \notin MCS(X, Y)$ 

### How can we generate all distinct MCS?

How can we generate even one MCS?
### How can we generate all distinct MCS?

How can we generate even one MCS?

- -> There's an algorithm for this [Sakai 2018]
- -> Not easily extendable to our problem
- ->  $O(n\sqrt{\log n / \log \log n})$

-> (
$$n = \max(|X|, |Y|)$$
)

What's the simplest way?

#### abcacd

#### badcda

Let's try a greedy approach

abcacd

badcda

Let's try a greedy approach

Read the top string

left-to-right

find matches

abcacd badcda

Let's try a greedy approach

Read the top string

left-to-right

find matches



Let's try a greedy approach

Read the top string

left-to-right

find matches

J abcacd badcda

Let's try a greedy approach

Read the top string

left-to-right

find matches



Let's try a greedy approach

Read the top string

left-to-right

find matches



Let's try a greedy approach

Read the top string

left-to-right

find matches



#### Is this maximal?

Let's try a greedy approach

Read the top string

left-to-right

find matches



Is this maximal?

We can check!



Take any input embedding

abcacd badcda



Take any input embedding

Make it leftmost





Take any input embedding

Make it leftmost

Done by construction





Take any input embedding

Make it leftmost

Done by construction



Make it rightmost

one piece at a time and check for insertions



Take any input embedding

Make it leftmost

Done by construction



Make it rightmost

one piece at a time and check for insertions

It's also rightmost! -> No possible insertions



Take any input embedding

Make it leftmost

Done by construction



Make it rightmost

one piece at a time and check for insertions

It's also rightmost! -> No possible insertions -> It is maximal!



#### "aca" is Maximal

Good job everyone!

MCS problem has a greedy solution

Seminar's over

Open the chips



Read the top string

) dcacab

left-to-right

find matches

bdacda

Read the top string

left-to-right

find matches

J dcacab bdacda

Read the top string

left-to-right

find matches

J dcacab

Read the top string

left-to-right

find matches

J dcacab

Read the top string

left-to-right

find matches



#### Is this maximal?



#### Is this maximal? Not really! daca



Is this maximal? Not really! daca

## What can we do?

Greedy doesn't work

Why?



## What can we do?

Greedy doesn't work

Why?

When choosing this

we ignored this



Idea1: We shouldn't choose c if it one end can be shifted to insert another char Idea2: Maybe we should keep all possible embeddings found so far



We shouldn't choose a match if it one end can be shifted to insert another char

ab is the prefix of

abdc

which is an MCS

abadcbc

#### Idea1

We shouldn't choose a match if it one end can be shifted to insert another char

One end of c can be shifted

to insert d



#### Idea1

We shouldn't choose a match if it one end can be shifted to insert another char

One end of c can be shifted

to insert d

This is not enough to discard c!

abadcbc abbcdc



We shouldn't choose a match if it one end can be shifted to insert another char

One end of c can be shifted

to insert d

This is not enough to discard c!



There's an MCS abcc that uses that match!

#### Idea2: keep all possible embeddings found so far

We can clearly see that

# $Y \subset X$ X: babababab

#### Y: baabaab

We can clearly see that

 $Y \subset X$ Hence  $MCS(X,Y) = \{Y\}$ X: bababab

#### Y: baabaab



But we don't know it yet!

Dabababab Dabababab Dababaab

> 2 choices surely the left one is the better one

Dabababab bababab baabaab

> 2 choices which is the better one?



What about here??
Watch out for complexity!



and here???

# Watch out for complexity!

The number of embeddings is exponential

We cannot explore all configurations in reasonable time

babababab baabaab

# Other too complex ideas

Use the curtain algorithm:

Input: W common subseq.

 $\begin{aligned} \forall k \in [|W|] : \\ I_k \leftarrow X_k \cap Y_k \\ \forall c \in I_k : \\ | \text{ recur on } W[0,k) \cdot c \cdot W[k,|W|) \end{aligned} \\ \end{aligned}$ 



# Other too complex ideas

Use the curtain algorithm:

Input: W common subseq.

 $\begin{array}{l} \forall k \in [|W|]: \\ & I_k \leftarrow X_k \cap Y_k \\ & \forall c \in I_k: \\ & | \text{ recur on } W[0,k) \cdot c \cdot W[k,|W|) \end{array}$ 

if 
$$\sum_{k} |I_k| = 0 \Rightarrow W \in MCS(X, Y)$$



#### Other too complex ideas shortest prefix shortest suffix shortest prefix shortest suffix containing, \ containing Use the curtain algorithm: WW[0,k)W[k, |W|disjoint Input: W common subseq. bababab In this case we start with $\forall k \in [|W|]$ : W=a W=b and $I_k \leftarrow X_k \cap Y_k$ We would analyze almost $\forall c \in I_k$ : babab all common subseq. recur on $W[0,k) \cdot c \cdot W[k,|W|)$ just to output "babab", i.e. the only MCS if $\sum |I_k| = 0 \Rightarrow W \in MCS(X, Y)$

 $MCS(X,Y) = \{abba, abad, dba\}$ 

#### X: abadba

#### Y: dabbad

 $MCS(X,Y) = \{abba, abad, dba\}$ 

#### X': aba | dba :X"

#### Y': dab | bad :Y"

 $MCS(X,Y) = \{abba, abad, dba\}$ 



 $MCS(X,Y) = \{abba, abad, dba\}$ 



 $MCS(X',Y') \times MCS(X'',Y'') = \{abba, abd\}$ 

 $MCS(X,Y) = \{abba, abad, dba\}$ 



But maybe we are getting closer

#### Better ideas for incremental construction

Let P be a prefix of an MCS

#### Better ideas for incremental construction

Let P be a prefix of an MCS

We want to extend it to P' = Pc, such that P' is still a prefix of some MCS

#### Better ideas for incremental construction

Let P be a prefix of an MCS

We want to extend it to P' = Pc, such that P' is still a prefix of some MCS

But how do we know P is a prefix of an MCS if we do not know the MCS?

The prefix of an MCS is an MCS of a prefix of the two strings

The prefix of an MCS is an MCS of a prefix of the two strings

The prefix of an MCS is an MCS of a prefix of the two strings

 $MCS(X,Y) = \{abba, abad, dba\}$ 

abadba

#### dabbad

The prefix of an MCS is an MCS of a prefix of the two strings

 $MCS(X,Y) = \{ abba, abad, dba \}$ 

abadba

The prefix "ab"

dabbad

The prefix of an MCS is an MCS of a prefix of the two strings

 $MCS(X,Y) = \{abba, abad, dba\}$ 

The prefix "ab"

is an MCS of X[0,3) and Y[0,4)

dabb ad

abadba

The prefix of an MCS is an MCS of a prefix of the two strings

Formally:

 $\forall s \in MCS(X, Y), p_s \in [|s|], \exists p_X, p_Y \in [n]:$ 

 $s[0, p_s) \in MCS(X[0, p_X), Y[0, p_Y))$ 

The prefix of an MCS is an MCS of a prefix of the two strings

Formally:

$$\forall s \in MCS(X, Y), p_s \in [|s|], \exists p_X, p_Y \in [n] :$$
$$s[0, p_s) \in MCS(X[0, p_X), Y[0, p_Y))$$

The converse doesn't hold!

# MCS of prefixes and prefixes of MCS

An MCS of a prefix of the two strings is not necessarily the prefix of an MCS

# MCS of prefixes and prefixes of MCS

An MCS of a prefix of the two strings is not necessarily the prefix of an MCS

 $MCS(X[0,6),Y[0,2)) = \{da\}$ abadba



# MCS of prefixes and prefixes of MCS

An MCS of a prefix of the two strings is not necessarily the prefix of an MCS

 $MCS(X[0,6), Y[0,2)) = \{da\}$ abadba

The MCS "da"

is not a prefix of any MCS



 $MCS(X,Y) = \{abba, abad, dba\}$ 

#### Recap for incremental construction

• P prefix of  $s \in MCS(X, Y) \Rightarrow P \in MCS(X[0, p_X), Y[0, p_Y))$ 

•  $P \in MCS(X[0, p_X), Y[0, p_Y)) \not\Rightarrow P$  prefix of  $s \in MCS(X, Y)$ 

### But our goal is exactly finding MCS through prefixes!

We needed the second implication!

•  $P \in MCS(X[0, p_X), Y[0, p_Y)) \not\Rightarrow P$  prefix of  $s \in MCS(X, Y)$ 

Let P be the prefix of an MCS

Let P be the prefix of an MCS

(base case: empty string  $\varepsilon$  )

Let P be the prefix of an MCS

(base case: empty string  $\varepsilon$  )

It can be proven that for some  $c \in \Sigma$ :

Pc is a valid prefix  $\Leftrightarrow$ 

**1.** 
$$\exists (i, j) \in Ext_P : X[i] = c \land Y[j] = c$$
  
**2.**  $P \in MCS(X[0, i), Y[0, j))$ 

Let P be the prefix of an MCS

(base case: empty string  $\varepsilon$  )

It can be proven that for some  $c \in \Sigma$ :

Pc is a valid prefix  $\Leftrightarrow$ 

**1.** 
$$\exists (i,j) \in Ext_P : X[i] = c \land Y[j] = c$$

**2.**  $P \in MCS(X[0,i), Y[0,j))$ 

So if P is an MCS of a prefix AND the c is in  $Ext_P$ 

```
=> Pc is the prefix of an MCS!
```

Let P be the prefix of an MCS

(base case: empty string  $\varepsilon$  )

It can be proven that for some  $c \in \Sigma$ :

Pc is a valid prefix  $\Leftrightarrow$ 

**1.** 
$$\exists (i,j) \in Ext_P : X[i] = c \land Y[j] = c$$

**2.**  $P \in MCS(X[0,i), Y[0,j))$ 

So if P is an MCS of a prefix AND the c is in  $Ext_P$ 

=> Pc is the prefix of an MCS! => Pc is the MCS of a prefix!

Let P be the prefix of an MCS

(base case: empty string  $\varepsilon$  )

It can be proven that for some  $c \in \Sigma$ :

Pc is a valid prefix  $\Leftrightarrow$ 

**1.** 
$$\exists (i,j) \in Ext_P : X[i] = c \land Y[j] = c$$

**2.**  $P \in MCS(X[0,i), Y[0,j))$ 

So if P is an MCS of a prefix AND the c is in  $Ext_P$ 

=> Pc is the prefix of an MCS! => Pc is the MCS of a prefix!

#### We can iterate!

Let P = ab

#### abadba

#### dabbad

Let P = ab $Ext_P = \{(4, 3), (2, 4)\}$ 

012345 abadba X dabbad 012345

Let P = ab  $Ext_P = \{(4, 3), (2, 4)\}$ 'a' = X[2] = Y[4]



Let P = ab  $Ext_P = \{(4, 3), (2, 4)\}$ 'a' = X[2] = Y[4]  $P \in MCS(X[0, 2), Y[0, 4)) !$ 


#### An example

Let P = ab  $Ext_P = \{(4, 3), (2, 4)\}$ 'a' = X[2] = Y[4]  $P \in MCS(X[0, 2), Y[0, 4)) !$  $\Rightarrow P \cdot a$  is prefix of an MCS



 $MCS(X,Y) = \{abba, abad, dba\}$ 

#### An example

Let P = ab  $Ext_P = \{(4,3), (2,4)\}$ 'a' = X[2] = Y[4]  $P \in MCS(X[0,2), Y[0,4)) !$  $\Rightarrow P \cdot a$  is prefix of an MCS



 $MCS(X,Y) = \{abba, abad, dba\}$ 

-> 'aba' is one MCS of the prefix identified by (2,4)!!

#### An example

Let P = ab  $Ext_P = \{(4, 3), (2, 4)\}$ 'a' = X[2] = Y[4]  $P \in MCS(X[0, 2), Y[0, 4)) !$ 



 $\Rightarrow P \cdot a$  is prefix of an MCS 01

-> 'aba' is one MCS of the prefix identified by (2,4)!!

-> Keep going!  $Ext_{aba} = \dots$ 

 $MCS(X,Y) = \{abba, abad, dba\}$ 



#### What's Ext?

#### What's Ext?

Don't worry about it

We would just need 40 more minutes



## What's Ext?

Don't worry about it

Just know that it needs

 $O(|\Sigma|n^2log(n))$ 

preprocessing time and

the whole algorithm takes

 $O(|\Sigma|n^3)$  delay and  $O(n^2)$  space



# Going further

Improving complexity

We have a conditional lower bound of  $O(n^2)$  from LCS

Improving complexity

We have a conditional lower bound of  $O(n^2)$  from LCS

**Testing applications** 

All applications of LCS can be adapted to MCS, with better (?) performances!

Improving complexity

We have a conditional lower bound of  $O(n^2)$  from LCS

Testing applications

All applications of LCS can be adapted to MCS, with better (?) performances! Special cases

Redefining maximality to fit applications such as DNA sequence alignment

Improving complexity

We have a conditional lower bound of  $O(n^2)$  from LCS

Testing applications

All applications of LCS can be adapted to MCS, with better (?) performances!

Special cases

Redefining maximality to fit applications such as DNA sequence alignment Or anything that comes to mind!

Improving complexity

We have a conditional lower bound of  $O(n^2)$  from LCS

Testing applications

All applications of LCS can be adapted to MCS, with better (?) performances!

Special cases

Redefining maximality to fit applications such as DNA sequence alignment Or anything that comes to mind!

Generalizing to  $k > 2 \, {\rm strings}$ 

MCS are quite slippery to solve

deceivingly simple

MCS are quite slippery to solve

deceivingly simple, but fun!

I only gave you ONE way to solve the problem

if you have some ideas we could have a chat

MCS are quite slippery to solve

deceivingly simple, but fun!

I only gave you ONE way to solve the problem

if you have some ideas we could have a chat

Great opportunity for research!

Tons of paper on LCS, less than 10 on MCS!

MCS are quite slippery to solve

deceivingly simple, but fun!

I only gave you ONE way to solve the problem

if you have some ideas we could have a chat

Great opportunity for research!

Tons of paper on LCS, less than 10 on MCS!

Great potential, not quite known

Thank you